## Effects of Ozone Loading Rate and Ecotoxicity of Products During Ozonation of Soil

Containing Weathered Crude Oil

by

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## ABSTRACT

The world currently faces hundreds of millions of cubic meters of soil contaminated with petroleum crude oil residuals. The application of ozone gas (O<sub>3</sub>) to contaminated soil is an effective means to oxidize petrogenic compounds and, when used with bioremediation, remove the oxidized byproducts. The overarching goal of this dissertation was to evaluate two areas of potential concern to large-scale O<sub>3</sub> deployment: the capacity of O<sub>3</sub>-treated petroleum contaminated soils to support seed germination before bioremediation and the transport characteristics of O<sub>3</sub> in soil columns.

A matched study comparing the germination outcomes of radish (*Raphanus* sativus L.), grass (*Lagurus ovatus*), and lettuce (*Lactuca sativa*) in soils contaminated with three crude oils at various O<sub>3</sub> total-dose levels showed that radish germination was sensitive to the soluble byproducts of oxidized petroleum (assayed as dissolved organic carbon [DOC]), but not sensitive to the unreacted petroleum (total petroleum hydrocarbon [TPH]). A multivariable logistic regression model based on the radish results showed that adverse germination outcomes varied with the DOC concentration and that DOC ecotoxicity decreased with increasing O<sub>3</sub> dose-level and background organic material. The model was used to create a risk management map of conditions that created 10%, 25%, and 50% extra risks of adverse radish germination. Thus, while O<sub>3</sub> effectively lowered TPH in soils, the byproducts exhibited ecotoxicity that inhibited radish germination. On the other hand, the sensitivity of radish germination to oxidized petroleum byproducts could be utilized to assess ecological risk.

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The feasibility of gas transport in the soil matrix is also of paramount concern to field-scale utilization of O<sub>3</sub>. A matched study comparing TPH removal at three field-relevant loading rates (4, 12, or 36 mg<sub>ozone</sub>/ g<sub>soil</sub>/ hr) and various total dose-levels showed an anisotropic pattern along the axial distance favoring the column inlet end. The asymmetry decreased as loading rate decreased and with concurrent improvements in O<sub>3</sub>-transport distance, O<sub>3</sub> utilization, and heat balance. Overall, a low O<sub>3</sub> loading rate significantly improved O<sub>3</sub> transport and utilization efficiency, while also better distributing reaction-generated heat along the gas flow path for a depth typically utilized in bioremediation field settings.

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### LIST OF ABBREVIATIONS

- AOP, Advanced Oxidation Process
- ANS, Alaska North Slope
- AUC, Area Under the Curve
- **BDE**, Bond Dissociation Energy
- BMD, Benchmark Dose
- DOC, Dissolved Organic Carbon
- DRO, Diesel-Range Organics (C12-C22)
- GJIC, Gap Junctional Intercellular Communication
- GRO, Gasoline-Range Organics (C5-C12)
- HF, Hydraulic Fracturing
- ICP-MS, Inductively Coupled Plasma Mass Spectrometer
- ISCO, In Situ Chemical Oxidation
- LE, Localization Energy
- LL, Liquid Limit
- LOAEL, Lowest-Observed-Adverse-Effect-Level
- NA, Naphthenic Acids
- NOAEL, No-Observed-Adverse-Effect-Level
- O<sub>3</sub>, Ozone
- OR, Odds Ratio
- ORO, Oil-Range Organics (C22-C40)
- OSPW, Oil-Sands Process Water
- PAH, Polyaromatic Hydrocarbon
- PL, Plastic Limit
- ROC, Receiver Operating Characteristics
- SOM, Soil Organic Matter

TPH, Total Petroleum Hydrocarbons

TPHc, Total Petroleum Hydrocarbons by Carbon

TS, Test Soil

TSC, Test Soil Contaminated with Crude Oil

TSOC, Test Soil Contaminated with Ozonated Crude Oil

# 1 INTRODUCTION: CHEMICAL CHARACTER, ENVIRONMENTAL BEHAVIOR, AND REMEDIATION

#### **1.1** The World's Crude Oil Supply

Global oil demand contracted in 2020 for the first time in a decade because of the social and economic restrictions imposed by the novel Coronavirus (COVID-19).<sup>1</sup> This period and the recession of 2009 are the only anomalies in the last quarter century, in which global oil consumption otherwise steadily rose from just below 70 million barrels per day (mbd) in 1994 to nearly 100 mbd in 2020.<sup>2</sup> Oil consumption grew in Asia, Africa, and the Middle East, and it remained unchanged in the CIS<sup>a</sup>, Europe, South and Central America, and North America.<sup>3</sup>

Increasing consumption patterns have been satisfied by expansions in oil exploration and extraction.<sup>3</sup> Table 1.1 shows proven global oil reserves (R) between 1999 and 2019 in the 15 countries that together hold 93% of the world's crude oil supply.<sup>3</sup> The values in Table 1.1 indicate that oil reserves have risen by a remarkable 54% in the last 20 years. Geological and engineering information indicates with reasonable certainty that approximately 245 billion metric tons (~1,800 billion barrels) can be recovered in the future.<sup>3</sup> Even if only 0.1% of the recovered oil is spilled during exploration, extraction, transport, or storage, the world's natural and anthropogenic spheres will have to cope with crude oil contamination on the order of 245 million metric tons—a mass of oil 6,600 times greater than Exxon Valdez and 350 times greater than Deepwater Horizon.<sup>4,5</sup>

<sup>&</sup>lt;sup>a</sup> The Commonwealth of Independent States (CIS) is a regional intergovernmental organization of nine members post-Soviet republics in Eurasia. They include Armenia, Azerbaijan, Belarus, Kazakhstan, Kyrgyzstan, Moldova, Russia, Tajikistan, Uzbekistan.

		1999 (10 <sup>9</sup> Barrels)	2019 (10 <sup>9</sup> Barrels)	%⊿	% Supply	R/P (Years)	Region
	Venezuela	77	304	300%	17.5%	>500	C/S America
	Saudi Arabia	263	298	13%	17.2%	69	Middle East
	Canada	182	170	-6.5%	9.8%	82	N America
	Iran	93	156	67%	9.0%	121	Middle East
	Iraq	113	145	29%	8.4%	83	Middle East
	Russian Fed.	112	107	-4.4%	6.2%	26	CIS
	Kuwait	97	102	5.2%	5.9%	93	Middle East
	UAE	98	98	0.0%	5.6%	67	Middle East
	US	30	69	130%	4.0%	11	N America
2	Libya	30	48	64%	2.8%	110	Africa
	Nigeria	29	37	28%	2.1%	48	Africa
	Kazakhstan	5	30	460%	1.7%	43	CIS
	Qatar	13	25	92%	1.5%	37	Middle East
	China	15	26	74%	1.5%	19	Asia
	Total Above	1155	1614	40%	93%	93	Regions Above
	Total World	1277	1734	54%	100%	50	World

Table 1.1 Proven Global Oil Reserves in 1999 And 2019 And R/P Ratio.<sup>2</sup>

<sup>2</sup> Data adapted from source.<sup>3</sup>

Table 1.1 also shows the R/P ratio: the value, in years, until reserves (R) are depleted at current production rates (P). If worldwide production remains unchanged, the International Energy Agency (IEA) estimates the world to have a roughly a 50-year oil supply: the United States (4% of world supply) has 11 years, Russia (6% of world supply) has 25 years, and Saudi Arabia (17% of world supply) has 69 years.<sup>3</sup> During these final decades of oil production, all the world's remaining reserves will be drilled, pumped, and hydraulically pressurized to release product. As reserves wane, efforts will eventually turn to decommissioning and dismantling oil drills, wells, pipelines, and refineries, and society will face the inevitable task of assessing the residuals left behind after more than a century of manipulating vast volumes of crude oil.<sup>6</sup>

Early oil exploration yielded the lightest<sup>c</sup> crudes first, because of their relative buoyancy and ease of extraction. Since it is unlikely that the world will discover any other significant reserve of light "sweet" (low-sulfur) crude oil, the oil industry will also turn to refractory stocks, like Canada's Athabasca tar sands and the extra heavy crude in Venezuela's Orinoco Belt; if they were to be developed, those reserves would extend the proven world supply by 9.4% and 15.4% (respectively).<sup>3</sup> Thus, the endgame crude oil product that is piped, trucked, and tanked thousands of miles across the globe will be those oils that are heaviest and already degraded of simpler components.<sup>7,8</sup>

$$API \ Gravity = \frac{141.5}{SG} - 131.5$$

<sup>&</sup>lt;sup>c</sup>Light, medium, heavy, and extra heavy are categories are established using the American Petroleum Institute gravity, or simply, the API gravity. The formula to calculate API gravity from Specific Gravity (SG) is:

Light crude oil has an API gravity higher than 31.1° (i.e., less than 870 kg/m<sup>3</sup>), medium oil has an API gravity between 22.3 and 31.1° (i.e., 870 to 920 kg/m<sup>3</sup>), heavy crude oil has an API gravity below 22.3° (i.e., 920 to 1000 kg/m<sup>3</sup>), and extra heavy oil has an API gravity below 10.0° (i.e., greater than 1000 kg/m<sup>3</sup>).

#### **1.2** The Chemical Characteristics of Crude Oil

Petroleum crude is a mineral oil of natural origin consumed at a rate of 98 mbd.<sup>1–3</sup> Accurate information about the composition of crude oil is especially important for the selection of appropriate "downstream" refining processes, which determine the oil's net economic value.<sup>9</sup> The precise characterization of crude oil, however, is difficult due to the manifold structural potential of hydrocarbons.<sup>7,9</sup>

Petroleum crude oil has been described as one of the world's most compositionally complex organic mixtures, containing anywhere from 10,000 to 100,000 chemically distinct constituents.<sup>9</sup> The elemental makeup, by contrast, is fairly small. Roughly 83-87 wt% of crude oil can be attributed to carbon and another 10-14 wt% to hydrogen.<sup>7,9–11</sup> The remaining 3-7 wt% of crude mass results from the presence of the socalled heteroatoms: nitrogen (0.1-1 wt%), sulfur (0.05-6.0 wt%), and oxygen (0.05-2.0 wt%).<sup>11</sup> Small amounts of organometal complexes can be ascribed mostly to vanadium (~1200 ppm) and nickel (120ppm).<sup>7,9–11</sup> Nevertheless, this elemental simplicity belies the vast number of bonding configurations possible from these basic building blocks. The molecules in crude oil have manifold structural possibilities because the carbon backbone can reach C150, bonding configurations can include single as well as double bonds, the molecular structure can be a straight chain, branched, ringed, or a combination of each of these, and, finally, the presence of even one heteroatom can fundamentally change the chemical character.<sup>7</sup>

That petroleum and its derivatives tend to follow a homologous series simplifies the characterization to an extent. The most fundamental series has no rings and no double bonds and begins with methane (CH<sub>4</sub>), which has a hydrogen:carbon (H:C) mole ratio of

4

4:1. Extending methane one carbon at a time forms the molecules ethane ( $C_2H_6$ ), propane ( $C_3H_8$ ), and butane ( $C_4H_{10}$ ), the volatile end of the homolog series of "normal" alkanes (i.e. n-alkanes), which are propagated according to the formula  $C_nH_{2n+2}$ .<sup>7</sup> As the chain is lengthened with the addition of methylene  $(-CH_2)$ , the additional hydrogen atoms of the methyl group (-CH<sub>3</sub>) at either end (the "+2" in the alkane formula) contribute less and less to the H:C ratio, which gradually decreases toward the methylene mole ratio of 2:1.7 When the alkane structure is branched, however, "isoalkanes" have a methyl cap at the end of each branching chain, adding to the overall hydrogen count and driving the H:C mole ratio above 2.<sup>10</sup> The n-alkanes are sometimes referred to as the "paraffin" group, especially when above C20. A higher H:C ratio signifies greater paraffinic character in a given group or crude-oil fraction.<sup>12</sup> The denomination is derived from the Latin phrase *parum affinis*, describing the "little affinity" paraffins have for other chemicals. In other words, the paraffins are noted for having a low level of reactivity.<sup>13</sup> The n-alkanes and isoalkanes comprise approximately 30-35 wt% of most producible<sup>d</sup> crude oils.<sup>8</sup>

When a singly bonded carbon backbone forms one or more rings (with or without side chains), the resulting molecule is known as a cycloalkane, or a cycloparaffin when greater than 20 carbon atoms are present.<sup>e</sup> These types of molecules are an extremely important constituent of crude oil. A singled-ringed cycloalkane has the formula C<sub>n</sub>H<sub>2n</sub>

<sup>&</sup>lt;sup>d</sup> Producible crude oil refers to that oil which is free flowing to distinguish it from bitumen source oil. <sup>e</sup> Cycloalkanes are also sometimes called "naphthenes" in the petrochemical industry. The term

<sup>&</sup>quot;naphthene" must be distinguished from the term "naphthalene," which is the name for a polyaromatic unsaturated hydrocarbon comprised of two fused benzene rings. Naphthenes should also be distinguished from "naphtha" the mixture of n-alkanes and cycloalkanes that distils between 30°C and 220°C in a refining process.

and is named according to its straight-chain homolog (cyclopropane, cyclobutane, cyclopentane, cyclohexane, etc.). Each additional ring creates a hydrogen deficit of -2, and a general chemical formula for the cycloalkanes is  $C_cH_{2(c+1-g)}$ , where "c" equals the number of carbon atoms and "g" equals the number of rings in the molecule. The carbon atoms in cycloalkanes are singly bonded and, like n-alkanes, are relatively unreactive. They can contain straight-chain projections or form isolated rings, spiro rings, fused rings, or bridged rings. Small rings, containing 3- and 4-carbons, have significant angle strain resulting from the distortion of the sp<sup>3</sup> carbon bond angles from the ideal 109.5° to  $60^{\circ}$  and  $90^{\circ}$ , respectively.<sup>14</sup> This angle strain often heightens the chemical reactivity of such compounds relative to the straight-chain homolog. On the other hand, a ring shape also enhances London forces that give cycloalkanes higher boiling points, melting points, and densities than n-alkanes.<sup>15</sup>

The cycloalkanes make up the next 30-35 wt% of crude oil. Like n-alkanes, cycloalkanes also can contain straight-chain branches. Above C10, mono- and dicycloalkanes comprise between 50 and 55 wt% of all cycloalkanes. Next, the threeringed tri-cycloalkanes comprise approximately 20 wt% of all cyclic alkanes, while tetraand penta-cyclics account for about 25 wt% together. Polycyclic molecules can be comprised of up to 6 rings, with 5- and 6-carbon rings appearing in the same molecule.<sup>16</sup> Some of the larger polycyclic alkanes fall into the class tetra-cylic steranes (C27-C30) and penta-cylic triterpanes (C27-C35), important biomarkers that document the provenance of crude oil or its degree of degradation.<sup>16,17</sup> Triterpanes like hopane are sometimes used as an internal standard to describe the degree to which an oil has shifted from its baseline composition.<sup>18,19</sup> Whether straight-chain, branched, or cyclic, a hydrocarbon molecule formed by only C—C single bonds, even when heteroatoms<sup>f</sup> are present, is described as "saturated." Together, the n-alkanes, isoalkanes, and cycloalkanes comprise about 60 wt% of most producible crude oils that have not been degraded by environmental processes.

That the carbon backbone can form double or single bonds greatly amplifies the complexity of the crude mixture. When a straight-chain alkane loses two hydrogens to form a C—C double bond along the chain, the molecule is said to be "unsaturated." This group is referred to as the alkenes, or more often as the "olefins," a corresponding term to "paraffin" and widely used in organic chemistry and the petroleum literature.<sup>1–3,20</sup> The straight-chain olefins are not naturally present in high quantities in petroleum, but are important products formed during the refining process.<sup>8,20</sup> In crude oil, naturally occurring C—C double bonds occur predominantly in the cyclic analogs of olefins, otherwise known as the "aromatic" group.<sup>16</sup> To meet the chemical definition of aromaticity, the unsaturated chemical compounds must be characterized by at least one resonance-stabilized unsaturated ring core; the smallest such unit is the benzene ring.<sup>21</sup>

Crude-oil compounds comprised of 2-6 benzene rings are known as the polyaromatic hydrocarbons (PAHs), or sometimes the polyaromatic compounds (PACs) for those molecules containing heteroatoms. The benzene homolog series is propagated by the addition of subsequent  $C_6H_6$  according to the chemical formula  $C_cH_{2c-6}$ , as in naphthalene (2 rings), anthracene (4 rings), pyrene (4 rings), benzo(a)pyrene (5 rings), and benzo(ghi)perylene (6 rings). Of all aromatic compounds, monoaromatics are ~33

 $<sup>^{\</sup>rm f}$  Of the heteroatoms, only oxygen appears with any important mass percent in the saturated group, usually due to some degree of degradative acidification.<sup>10</sup>

wt%, diaromatics are ~23 wt%, triaromatics are ~13 wt%, and <tetra polyaromatics are ~7 wt%. A true aromatic molecule will contain only aromatic rings and chains.<sup>8</sup> However, in crude oil characterization, napthenoaromatics also are major constituents of the aromatic group. They are characterized by one five-membered saturated ring in addition to the aromatic rings as in fluorene (3 rings), benzofluorene and fluoranthene (4 rings), and benzofluoranthene (5 rings). In addition, the aromatic group also includes sulfur-containing compounds. Thiophene derivatives are constructed of five- and six-membered rings with at least one of the rings containing a sulfur atom (e.g., benzo- and dibenzothiophenes). The thiophene derivatives comprise up to 24 wt% of all aromatics in crude oil. Taken together, the aromatic, napthenoaromatics, and sulfur aromatic compounds comprise 20-45 wt% of crude oil.<sup>8</sup>

The geologic pressures that form saturated and aromatic compounds also can produce the heaviest and most polar molecules from the covalent bonding of these basic groups: The most complex examples of such molecules are the asphaltenes and resins.<sup>8,8,22</sup> The asphaltenes and resins are typically comprised of 6 to 20 fused rings with finger-like alkyl projections. They can comprise 0-40 wt% of all crude oil, though on average are around 14 wt%.<sup>8</sup> Heavily degraded crudes, like the Athabasca and Orinoco deposits, can have an asphaltene and resin content of 25-60 wt%.<sup>23</sup> Their enrichment usually indicates degradation of the oil. These molecules also have a higher-than-average frequency of heteroatoms and can complex with metals such as nickel and vanadium.<sup>24</sup> The nitrogen in crude oil is primarily found in resins and asphaltenes, although it sometimes appears in PAHs as a six-membered pyridinic ring or five-membered pyrrolic ring.<sup>7</sup> In contrast, sulfur appears with almost equal frequency in aromatics, resins, and asphaltenes. <sup>9,10,24</sup> The increase in heteroatom frequency leads to an increase in polarity, which in turn causes asphaltenes and resins to absorb much more readily to soil and rock.<sup>8</sup>

The molecular size and structure of asphaltenes and resins have been notoriously difficult to characterize, because the molecules form non-covalent complexes and aggregates in the form of dimers and tetramers at high concentrations and even in some solvents.<sup>7,25,26</sup> Low-energy collisions were finally able to separate aggregates without causing fragmentation.<sup>7,25,27</sup> These analyses demonstrated that asphaltenes, in particular, can contain up to 150 carbons and have an average mass between 400 and 800 Da (with distribution extending between 300 and 1400 Da).<sup>25,28</sup> The asphaltenes are typically larger than resins, with a higher degree of aromaticity and heteroatom content. Thus, the two groups are defined operationally based on their differing solubility. Resins show solubility in low molecular mass aliphatic hydrocarbons (n-heptane or n-hexane), as well as aromatic solvents (benzene and toluene). Asphaltenes are insoluble in the former group but soluble in the latter because of their higher aromatic character.<sup>28–31</sup>

#### **1.3** Chemical Characterization of Crude Oil

As molecular weight increases, aliphatic character decreases, while aromaticity correspondingly increases, and heteroatoms appear with higher frequency.<sup>23,24</sup> However, sorting the petroleum hydrocarbons based on mass alone cannot elucidate structure, since the nearest integer mass of groups like —CH<sub>2</sub> vs N, —NH<sub>2</sub> vs. O, and CH<sub>4</sub> vs. O are identical.<sup>32</sup> Instead, a hierarchical characterization of crude has been proposed as more logical and orderly.<sup>7</sup> The field of "petroleomics" has emerged to meet the challenge of

complete chemical characterization of crude oil and related substances like bitumen, tar sands, or coal as well as the products of downstream refining processes such as vacuum residuals.<sup>7,9,32,33</sup> This field relies on dimensional characterization of crude oil that includes three levels.<sup>9</sup>

First, hydrocarbons can be sorted by relative abundance according to "class." The term "class" describes the elemental composition of a given hydrocarbon molecule  $(C_cH_hN_nO_oS_s)$ .<sup>23,24,34</sup> Depending on the crude oil type and provenance, 10-60% of the molecules in crude oil will be comprised of hydrogen and carbon atoms only. Other classes with greater than >1% abundance include N<sub>1</sub>, O<sub>2</sub>, N<sub>1</sub>S<sub>1</sub>, N<sub>1</sub>S<sub>2</sub>, N<sub>1</sub>O<sub>1</sub>, N<sub>1</sub>O<sub>2</sub>, N<sub>2</sub>, O<sub>1</sub>, O<sub>1</sub>S<sub>1</sub>, O<sub>2</sub>S<sub>1</sub>, O<sub>3</sub>S<sub>1</sub>, and O<sub>4</sub>S<sub>1</sub>.<sup>7</sup> This is particularly true in heavy crudes oils (API <10) and sour (sulfur-containing) crude oils. Overall, the classes occurring with the most frequent % abundance (depending on crude and analytical method<sup>g</sup>) are usually N<sub>1</sub>, N<sub>1</sub>S<sub>1</sub>, and O<sub>2</sub>.<sup>7,10,24,32</sup>

Second, since the H:C ratio deviates in a predictable manner based on the presence of rings, double bonds, and nitrogen, the integers of  $C_c H_h N_n O_o S_s$  can be used as a quantitative descriptor of hydrocarbon "type." This value is called the double-bond equivalent (DBE).<sup>h</sup> The DBE is equal to the number of rings plus double bonds involving carbon (CcHhNnOoSs $\mathbb{Z} = c - \frac{h}{2} + \frac{n}{2} + 1$  Equation 1.1), and it is a direct measure of aromaticity of petroleum components.<sup>7</sup>

$$(C_{c}H_{h}N_{n}O_{o}S_{s}) = c - \frac{h}{2} + \frac{n}{2} + 1$$
 Equation 1.1

<sup>&</sup>lt;sup>g</sup> Positive and negative modes in electrospray ionization between mass spectrometry methods can yield different relative abundances for the same crude oil. <sup>7,24,32,35</sup>

<sup>&</sup>lt;sup>h</sup> The petroleum industry sometime uses the measure called "hydrogen deficiency" or "Z" defined as  $C_cH_{2c+Z}$  to describe the degree to which the H:C ratio deviates from that of an n-alkane.

where c = the number of carbon atoms, h = the number of hydrogen atoms, and n = the number of nitrogen atoms. Thus, within a given a class, relative abundance can be sorted according to DBE, i.e., according to type.

Finally, for a given heteroatom class and a given DBE type, the third level of characterization depends on carbon number. By first sorting according to class (i.e., number and identity of heteroatoms), then type (bonding configuration quantified by the DBE), and then carbon number, the overlap of functional groups is avoided, and a highly refined identification system of the hydrocarbons in crude oil is possible.<sup>7</sup> This 3-dimensional characterization requires sophisticated techniques with an ultra-high degree of resolution, like the Fourier-transform ion cyclotron resonance mass spectrometry (FT-ICR-MS)<sup>i</sup>, such that classes can be recognized by mass differences to the nearest 1000<sup>th</sup> decimal place.<sup>7,9</sup>

#### **1.4 The Crude Oil Products**

At atmospheric pressure and temperature, crude oil usually<sup>j</sup> exists in the liquid phase, though physical liquid characteristics like density and viscosity can vary considerably. These physical differences are exploited in the process of turning most of the recovered crude oil into a wide range of petroleum products.

Fractional distillation recovers the lightest compounds first, consisting of noncondensable gases hydrogen, methane, ethane, and short-chain olefins. The gases

<sup>&</sup>lt;sup>i</sup> This technique makes use of a mass spectrometer for determining the mass-to-charge ratio (m/z) of ions based on the cyclotron frequency of the ions in an extremely powerful fixed magnetic field. The technique can achieve mass resolution as high as  $m/\Delta m_{50\%} \approx 400,000$ .

<sup>&</sup>lt;sup>j</sup> Some crude oils with high level of long chain n-alkanes or isoalkanes are characterized as "waxy," may be solid at room temperature, even though they are characterized by "light" API.

condensable under pressure, mainly the light saturated paraffinic hydrocarbons propane  $(C_3H_8)$  and butane  $(C_4H_{10})$  (or a combination of the two), come next and are sold as liquefied petroleum gases (LPG). Together, ethane and LPG account for 15% of the crude oil product soil.<sup>1</sup> The next important chemical product is called "naphtha" (7% v/v) and is comprised of "light naphtha," recovered between 30°C and 90°C (C<sub>5</sub>-C<sub>6</sub>), and "heavy naphtha," recovered between 90°C and 200°C (C<sub>6</sub>-C<sub>12</sub>). Naphtha is an essential feedstock of the petrochemical industry and is the backbone for the manufacture of ethylene plastics. Motor gasoline, perhaps the most important product of modern age, comprises 25% v/v of crude oil. It also distills between 35°C and 215°C; it is the light hydrocarbon (C4-C12) used for internal combustion engines of land-based motor vehicles.

The jet fuel/kerosene group comprises aviation gasoline (30°C -180°C), gasoline type jet fuel (100°C -250°C), kerosene type jet fuel (150°C-300°C), and other kerosene; these account for 8% v/v of crude oil product. Gas/diesel oil includes heavy gas oils. Gas oils and diesel (180°C and 380°C) are obtained from the lowest fraction from atmospheric distillation of crude oil, while heavy gas oils are obtained by vacuum re-distillation of the residual left over from atmospheric distillation. They are used for diesel compression ignition (cars, trucks, marine transport, etc.) as well as light heating oil for industrial and commercial uses. This group also includes heavy gas oils which distill between 380°C and 540°C and which are used as petrochemical feedstocks. Finally, fuel oil, spirits, lubricants, bitumen, paraffin waxes, petroleum coke, tar, and sulfur are the most rigid elements derived from crude oil from vacuum residuals. Figure 1.1 recapitulates the demand of the products derived from crude oil.



Figure 1.1 Global oil demand by product.<sup>k,1</sup>

## 1.5 Crude Oil Released into the Environment

The accidental release of petroleum into the environment is an inevitable outcome of a global supply chain that moves up to 100 mbd.<sup>4</sup> Such releases, whether on land or sea, are attenuated and transformed by microbial biodegradation, photooxidation, hydrolysis, and evaporation<sup>1</sup>, as well as dispersive and diluting processes of dissolution, spreading, and emulsification.<sup>38</sup> Taken together, these collective "weathering" processes enrich recalcitrant components that often are among the most toxic and, via photomodification, generate oxidized intermediates which have demonstrable acute toxicity to a variety of species.<sup>39–42</sup> The weathering of crude oil is possible because the individual chemicals that comprise crude oil exhibit strong differences in air diffusion coefficient,

<sup>&</sup>lt;sup>k</sup> Modified from source.

<sup>&</sup>lt;sup>1</sup> The literature on petroleum spills often refers to the "evaporation" of labile components, though the term volatilization is more appropriate. The interested reader should use both terms.<sup>36,37</sup>

liquid density, water solubility, pure chemical vapor pressure, boiling point, and Henry's Law constant.<sup>1</sup> In essence, weathering is a process by which natural media (air, water, and soil), physical elements (heat and light), and biological actors (more frequently lower order organisms like bacteria and yeast) can preferentially change or remove specific chemical components thereby selectively enriching the remainder.

Ambient conditions such as temperature and the presence or absence of wind can make profound changes to a spilled crude oil; the extent of those changes is governed by the chemical makeup of the crude itself and the thickness of the spill. A crude oil release first loses those components that are volatile at ambient temperatures  $(-25^{\circ}C-45^{\circ}C)$ . In a few days, light crude oils can be reduced by up to 75% of their initial volume and medium crudes by up 40% of their volume.<sup>37</sup> In contrast, heavy or residual oils only lose about 5% of their volume in the first few days following a spill.<sup>37</sup> Although each individual crude-oil component has a unique loss rate, the differing rates of volatilization among different components give the appearance of a logarithmic loss rate with respect to time.<sup>36</sup> Most oil that is lost to volatilization does so within the first 8 hours of a spill.<sup>43</sup> The presence of wind will sharply advance the volatilization rate since moving air prevents the air-oil interface from becoming saturated; while the presence of wind is important, the intensity of the wind has not been shown to be a significant factor.<sup>37,44</sup> It has also been noted that oil thickness, or the size of the spill, will change the degree to which oil can lose mass to volatilization—thicker spill volatilizes less by allowing waxy crust formation and adhesion forces between oil molecules.<sup>43</sup>

Sunlight is another factor that significantly alters the chemical profile of crude oil and enhances toxic effect.<sup>45</sup> Sunlight causes a substantial decline of the aromatic fraction

and the concomitant increase in the resin and asphaltene fractions.<sup>45</sup> The aromaticity of irradiated oil has been found to be significantly lower.<sup>45</sup> The oxygen content in irradiated oil is also found to increase with greater exposure to sunlight, a process called photo-oxidation. The sunlight mediated photo-oxidation significantly increases the water-soluble fraction of crude oil.<sup>45</sup> Maki et al. found that the concentration of dissolved organic carbon (DOC) increased linearly during sunlight irradiation, matched by an increase in ultraviolet absorptive materials in the seawater.<sup>45</sup> Another feature of sunlight is photoactivation of PAHs.<sup>46</sup> The absorption of UV light and even visible light by PAHs causes a molecular excitation that can lead to the formation of reactive oxygen species (ROS) and other reactive intermediates that can damage DNA, protein, and cell membrane.<sup>47–49</sup> Thus, sunlight irradiation of PAHs, while sometimes leading to their removal, also can cause acute toxicity and genotoxicity.<sup>50</sup>

Dissolution, spreading, and emulsification are most salient to open water crude oil spills, where the action of large volumes of moving water separates crude oil constituents. For example, an oft-encountered frothy oil-water emulsion is commonly known as "mousse."<sup>51</sup> Smaller molecules of aromatic hydrocarbons and small polar molecules, such as naphthenic acids, dissolve if sufficient water is present, causing the heavier molecular components to aggregate then precipitate. Other commonly encountered features in water-spill scenarios are tar balls, which are floating aggregations of asphaltenes and resin. In the case of highly dense material, tar balls become tar mats that condense on the ocean floor.<sup>52</sup> The removal of water-soluble components of oil spills is sometimes known as "washing," and it is of real importance when significant volumes of water are present, allowing oil to disperse into the water column.<sup>53</sup> The

dramatic increase in the surface area in open water also allows for microbial colonization and biodegradation.

The microbial alteration of crude oil is known as biodegradation, and is wellestablished fact in the reservoirs of the petroleum industry and in environmental contamination scenarios.<sup>4,51,54,55</sup> Biodegradation of crude oil is a selective utilization of certain types hydrocarbons by microorganisms, usually started under aerobic conditions, but also including anerobic processes.<sup>56</sup> The biodegradation of petroleum is carried out largely by diverse bacterial populations which, even in pristine environments, are ubiquitous though not abundant (< 1% of the total bacterial population).<sup>55</sup> These bacteria presumably utilize hydrocarbons that are naturally produced by plants, algae, and other living organisms, particularly waxy exudates that are themselves geologic progenitors of crude oil.<sup>8</sup> The microorganisms are selectively enriched in contaminant scenarios, where they can exceed 10% of the total bacterial population.<sup>55</sup>

Biodegradation by aerobic and/or anerobic microorganisms results in partial or total removal of n-alkanes first, usually C10 to C26, then slightly branched alkanes (isoprenoid alkanes), and finally some smaller low-molecular-weight aromatics such as benzene, toluene, and xylene, which are among the toxic compounds found in petroleum.<sup>51</sup> Decreasing levels of simpler, smaller carbon chains increase the relative abundance of those molecules with greater complexity. The distribution of cycloalkanes with 1 to 5 rings remains practically unchanged. Larger branched isoprenoids—like pristane and phytane—only decrease in scenarios of extreme oil degradation. Molecules with multiple aromatic rings—the PAHs—are also relatively resistant when intact crude oil is spilled. These also include sulfur-containing compounds like thiophene derivatives. The loss of light compounds enriches the nitrogen-containing end of the crude oil profile as well, due to the recalcitrance of asphaltenes and resins to biodegradation. Thus, as the simpler biodegradable compounds disappear, the resistance of the residual mixture to further biodegradation steadily increases, and the rate of oil removal takes a steep decline.<sup>57</sup> A residue is nearly always left over and often appears as black tar due to the relative enrichment of asphaltenes and resins.<sup>51</sup> Moreover, slow rates of biodegradation necessarily increase the likelihood of accumulating partially oxidized metabolites.<sup>51</sup>

The microbial pathways that are used in hydrocarbon utilization are wellcharacterized.<sup>57</sup> Molecular oxygen is required in initial steps that involve enzymatic oxidation of hydrocarbons via oxygenases.<sup>57</sup> Alkanes are converted to carboxylic acids and then biodegraded via  $\beta$ -oxidation, which forms acetate, which then enters the tricarboxylic acid cycle.<sup>57</sup> Aromatic compounds, on the other hand, are oxygenated to form diols, which are then cleaved to catechols.<sup>51</sup> These compounds also ultimately enter the tricarboxylic acid cycle. The biodegradation of aromatic hydrocarbons results in detoxification and does not produce toxic intermediates.<sup>57</sup> For those compounds that can be assimilated by bacteria and fungi, the digestion of hydrocarbons results, like complete combustion, in carbon dioxide and water byproducts, as well as cell biomass. In surface conditions, molecular oxygen is not normally a rate-limiting factor, and the complete digestion is possible for those compounds that can be mobilized by microbiota. Oil—water emulsions, which are facilitated by the secretion of biosurfactants by bacterial communities on crude oil, can lead to mobilization.<sup>54</sup> Even when mobilized in the presence of excess oxygen, biomass production also requires nitrogen and phosphorus. These nutrients often are limiting in common contamination scenarios.<sup>57</sup> In fact, the
simple addition of fertilizers has shown demonstratable efficacy for promoting crude oil biodegradation.<sup>51</sup> After the Exxon Valdez oil spill, the application of oleophilic fertilizer to field test plots stimulated biodegradation so that the surfaces of the oil blackened rocks on the shoreline turned white and appeared to be free of surface oil within 10 days after treatment.<sup>58</sup> The striking visual results strongly supported the idea that oil degradation in Prince William Sound was nutrient limited and that fertilizer application was a useful bioremediation strategy.<sup>58</sup>

A crude oil that penetrates to the subsurface will become a multi-phase, physically sequestered problem, due to limitations in oxygen and nutrients. The distribution of subsurface petroleum hydrocarbons can involve 4 distinct phases: (1) hydrocarbons trapped in the vadose zone as a solid phase sorbed to soil particles; (2) volatile hydrocarbons in the gas phase (in the vadose zone); (3) an immiscible free-phase liquid at the capillary fringe, above the water table; (4) and a dissolved phase of water soluble hydrocarbons.<sup>59–61</sup> The sorbed- and free-phases at the focal point of the spill are often referred to as the "source zone" since they continually release material both in the gas phase and in the aqueous phase. <sup>61</sup> While the heaviest and most polar molecules, such as the asphaltenes, strongly absorb to soil, lighter constituents from the sorbed phase and free phase can be continually released as vapor to the surface above. The problem of "petroleum vapor intrusion" (PVI) from subsurface contamination onto the above-ground surface is heavily researched.<sup>62</sup> Likewise, light non-aqueous phase liquid (LNAPL) at the capillary fringe or otherwise contacting the water table will release water soluble oil components into groundwater, creating plumes that can stretch for miles.<sup>63–65</sup>

In general, the weathering process can be summarized first by the physical process of volatilization and dissolution, which primarily remove lower boiling-point components of oil. Second, oxidative processes, particularly those mediated by UV radiation, promote a loss in saturated and aromatic hydrocarbons with a concomitant increase in asphaltenes. Biodegradation also results in the almost total removal of n-alkanes, smaller isoprenoids, and monoaromatics. Thus, nearly all environmental weathering processes (physical, chemical, and biological) leave behind heavier, more complex materials and oxidize saturated molecules, shifting the crude oil profile to one with a higher proportion of large aromatic molecules and molecules with greater NSO character.

## **1.6** Goals of the Dissertation

Soils are multicomponent, thermodynamically open systems comprised of solids, liquids, and gases that exchange matter and energy with the surrounding environment. Soils support biomass, promote nutrient cycling, and act as reservoirs for carbon, nitrogen, and biodiversity.<sup>66-4</sup> For example, carbon is 50-fold more concentrated in soil than in the parent material of Earth's crust, and soil nitrogen is 80-fold more concentrated.<sup>67</sup> Soils also purify and store a considerable portion of Earth's fresh water supply, sometimes called "green water" to distinguish it from the open "blue water" of lakes and rivers.<sup>66,68</sup> Thus, soil pollution can harm the soils' capacity to support biomass, thus causing lasting damage, particularly when contamination affects soils in biomes with major impacts on biodiversity, climate regulation, and material cycles (e.g., water, carbon, and nutrients).<sup>69,70</sup>

Petroleum contamination is a ubiquitous soil pollutant that is proven to harm human health and disrupt ecological systems.<sup>48,71–74</sup> Point sources of petroleum release include overflowing, failing, or unlined oil pits; leaking oil pipelines; leaking tanks; leaking well heads; and interaction between ground water and petroleum inside well bores. Diffuse petroleum residuals from large-scale catastrophic releases also remains a prominent concern.<sup>4,52,75–78</sup> After a spill, large volumes of petroleum are lost due to environmental weathering processes leaving behind residual petroleum hydrocarbons that are recalcitrant to further natural attentuation.<sup>75</sup> In practice, the level of petroleumhydrocarbon contamination is measured as Total Petroleum Hydrocarbons (TPH), which usually varies between 1 wt% and 10 wt%; regulatory maxima range from 0.1%, the upper limit for agricultural use, to 1 wt%, the upper limit for industrial use. <sup>4,69,79–81</sup> Soils targeted for decontamination typically are unsaturated material excavated within 3-8 feet of the surface.

Ozone gas (O<sub>3</sub>) has been proposed as a means to enhance the bioremediation of large quantities of soil contaminated with petroleum hydrocarbons.<sup>82</sup> O<sub>3</sub> is advantageous because it decays into non-hazardous O<sub>2</sub> molecules, leaving no residue. On the one hand, Chen et al. showed that O<sub>3</sub> treatment could lower TPH by 40-50%. The loss of total organic carbon, on the other hand, was  $\leq 12\%^{83,84}$  The TPH molecules were converted to partly oxidized products, which were readily biodegradable.<sup>83</sup> In particular, the loss of TPH was accompanied by increases in dissolved organic carbon (DOC), soluble chemical oxygen demand, and 5-day biochemical oxygen demand (BOD<sub>5</sub>). Thus, treatment with O<sub>3</sub> gas increased the bioavailability of petroleum hydrocarbons, resulting in accelerated bioremediation, enhanced ability to meet regulatory limits, and a decrease in the time that the soil could not support ecosystem or agricultural functions.<sup>45,83,85,86</sup>

Oxidation of petrogenic compounds by O<sub>3</sub> will create a new set of residuals carboxylic acids, ketones, aldehydes, quinones, alcohols, and esters—which, though not technically classified as "TPH," may persist in the environment, particularly if the soil is not subsequently bioremediated. A means to quantitatively understand the fate and toxicity of these oxidized crude oil byproducts is urgently needed, particularly in the context of a remediation effort that targets returning the soil to productive ecological roles (nutrient recycling, purification of water, and decomposition of biomass) or for managed human use (e.g., provision of food in agriculture, fiber and raw materials in forestry, etc.). One metric that measures the biological production potential of soil is its ability to facilitate the germination of plant seeds; in the context of O<sub>3</sub>-treated soils, information about this characteristic is non-existent.

A primary goal of this dissertation is, therefore, to evaluate the capacity of O<sub>3</sub>treated petroleum contaminated soils to support seed germination before bioremediation. Because crude-oil contamination is a global problem, the number of salient terrestrial plant targets for germination studies is vast. This dissertation looks at lettuce (*Lactuca sativa*), a species with dose-response sensitivity to petroleum contamination; radish (*Raphanus sativus* L.), a known accumulator of soil contaminants; and fountain grass (*Lagurus ovatus*), since grass are known to be pioneer organisms in contaminated soils as well as candidates for petroleum phytoremediation efforts.<sup>87–93</sup> Plant diversity is paralleled by crude-oil variability, which can take on different compositional profiles based on the relative proportion of saturates, aromatics, resins, asphaltenes.<sup>94</sup> Thus, a subordinate goal in this work is to test each of the three selected plant species with respect to toxic effect between three distinct crude oils which have been treated with O<sub>3</sub>.

A second goal of the dissertation is to evaluate a major operational parameter of the dosing regimen in field settings: O<sub>3</sub> loading rate (mass O<sub>3</sub>/ mass soil/ hour). While *in situ* advanced oxidation (ISCO) and *ex situ* treatment (involving soil excavation) are viable treatment means, both require improved knowledge about depth of treatment when contamination exceeds 1 wt% TPH. While O<sub>3</sub> deployment as an ISCO technology is in its nascent stages, landfarming is a mature setting in which to deploy this treatment model.<sup>95</sup> In landfarming, the depth for treatment is typically ~2 ft, the total treatment area is large (1-2 acres), and moisture levels are kept between 30 and 80% field capacity to ensure the survival of hydrocarbon-degrading bacteria.<sup>95,96</sup>

Since industrial O<sub>3</sub> production can be anywhere from 1 wt% to 16 wt%, the relative advantages and disadvantages of the range of production must be substantively evaluated.<sup>97</sup> For instance, a low loading rate will confer a given mass of O<sub>3</sub> in a higher total volume of gas at a longer treatment time; this may be more advantageously utilized with larger soil volumes. On the other hand, high-concentrations of O<sub>3</sub> will necessarily decrease contact time, since a given dose of O<sub>3</sub> is supplied more quickly, potentially decreasing the treatment interval between bioremediation cycles.<sup>98</sup> Thus, a primary goal of this dissertation is to systemically evaluate three fields scale loading rates—4, 12, or 36 mgo<sub>3</sub>/ g<sub>soil</sub>/ hr)—for petroleum contaminated soil.

Given the complex chemical and physical structure of soil, as well as the necessary presence of soil water, an auxiliary concern is the dimensional reactivity of O<sub>3</sub> with TPH. While multiple studies have evaluated O<sub>3</sub> break-through, these findings were limited with respect to information about the reaction path of O<sub>3</sub> in highly contaminated soils (i.e., >1 wt% TPH). Therefore, this dissertation evaluates O<sub>3</sub> transport at 5 points along the the axial distance at a depth close to that seen in a landfarm (45 cm) and in conditions of ~2 wt% TPH contamination. Along with visualizing TPH removal in the axial distance, the transport of soil moisture and the movement of heat along the reaction path are also systematically assessed.<sup>99</sup>

The overarching goal of this dissertation was to evaluate two areas of potential concern to large-scale O<sub>3</sub> deployment: the capacity of O<sub>3</sub>-treated petroleum contaminated soils to support seed germination before bioremediation and the transport characteristics of O<sub>3</sub> in soil columns. Overall, this work lays a foundation for field-scale deployment of ozonation by evaluating two highly salient to field-scale deployment concerns.

# **1.7** Dissertation Outline

The chapters that follow lay out the scientific bases for using ozone to remediate soils contaminated with crude-oil residuals. This section provides a "road map" to the following chapter: the topic of each and why it is important to my research.

*Chapter 2, Background on the kinetic and thermodynamic principles of O<sub>3</sub> and its reactions with organic carbon compounds.* In this chapter, I discuss the basic principles of hyperconjugation and induction that influence the positions of attack of the O<sub>3</sub> molecule on complex hydrocarbons, as they relate to the scope of this work. This chapter describes the stepwise reactions in which O<sub>3</sub> is known to attack electron-rich hydrocarbons. Special attention is paid to ozonation kinetics and thermodynamics in the gas-phase for different classes of hydrocarbons (normal alkanes, branched alkanes, cycloalkanes, aromatics, resins, and hetero-atom containing molecules etc.). These reactions are relevant for gas-based ozonation of crude oil in soil. Chapter 2 also lists potential ozonation products.

*Chapter 3, Ozonation among 3 distinct crudes at 3 distinct doses.* This chapter summarizes the effects of O<sub>3</sub> gas on three different crude oils at three distinct dose levels. This study serves as the basis for examining toxicity of the oxidized crudes and the ensuing logistic regression analysis in Chapters 4 and 5. Briefly, I evaluated 3 crude oils: ANS (API gravity 29-32), ARAB (API gravity 30-32), and SJV (API gravity 13-15) ozonated at 5 g, 10 g, and 20 g O<sub>3</sub> with continuous monitoring of effluent (unreacted) ozone gas. The control soil and O<sub>3</sub> treated soil were then evaluated for total petroleum hydrocarbon (TPH), dissolved organic carbon (DOC), and pH.

*Chapter 4, Lettuce, grass, and radish germination by simple logistic regression.* I used simple logistic regression to evaluate germination difference between treatment groups (background soil, crude oil contaminated soil, and soil with crude oil treated with O<sub>3</sub>), dose groups (5g O<sub>3</sub>, 10g O<sub>3</sub>, and 40g O<sub>3</sub>), and crude oil groups (ANS, ARAB, and SJV crude oils) for the germination lettuce, grass, and radish seeds. I performed in-depth logistic regression analysis using Stata v. 16.1. The use of a formal logistic regression model allowed me to build confidence intervals and test statistical significance of differences between the groups under study as they relate to crude oil, seed, and dose.

*Chapter 5, Using radish (Raphanus lativus L.) germination to establish a benchmark dose for the toxicity of ozonated-petroleum byproducts in soil.* The concentrationresponse relationship between the adverse germination outcome of radish (*Raphanus lativus* L.) and ozonated petroleum residuals was determined from Chapter 4. *TREATMENT* categories (control, petroleum, petroleum + 5 g O<sub>3</sub>, petroleum + 10 g O<sub>3</sub>, and petroleum + 40 g O<sub>3</sub>) were used to create a dilution series for radish germination using different proportions of the test soil and a commercially available potting mix (~75% w/w organic matter) to evaluate the effects of background organic matter (*b*-*ORGANIC*) in conjunction with *TPH* and *DOC*. Multivariable logistic regression was performed on the adverse germination outcome as a function of *TPH*, *DOC*, *TREATMENT*, and *b-ORGANIC*. Results showed that the parameters controlling germination were the continuous variable *DOC*, categorical variables *TREATMENT*, and *b-ORGANIC*. The results were used to tabulate extra-risk levels for adverse germination effects.

*Chapter 6, Ozonation of Petroleum Hydrocarbons in Soil Columns: Effects of Ozone Loading Rate along the Axial.* Columns containing soils containing petroleum crude oil (~20,000 ppm) were treated with ozone gas (O<sub>3</sub>) at 3 loading rates (4, 12, or 36 mg<sub>ozone</sub>/ g<sub>soil</sub>/ hr) to achieve 3 total-dose levels (5 g, 10 g, and 20 g O<sub>3</sub>). Every experiment was monitored for effluent O<sub>3</sub> ("break-through") and temperature at 10 points along the axial distance (45 cm). After ozonation, soil columns were evaluated in five segments for total petroleum hydrocarbons (TPH) and moisture. TPH changes, moisture flux, temperature, and total heat were described along the axial distance of the column. *Chapter 7, Summary and Future Work.* This chapter provides a summary of findings and suggestions for future work.

# 2 BACKGROUND: O3 AND ITS REACTIONS WITH ORGANIC CARBON COMPOUNDS

# 2.1 O<sub>3</sub> Discovery and Current Production

O<sub>3</sub> is as old as lightning, but it was Christian Friedrich Schönbein (1799-1868) who first identified it as a distinctly odorous gas at the University of Basel in 1939 and named it accordingly<sup>m</sup>.<sup>100</sup> At the time, Schönbein reported that the electrolysis of water produced, at the cathode, an odor that was identical to the odor produced by an arc between two electrodes and attributed that odor to a new chemical.<sup>100</sup> Since its discovery, O<sub>3</sub> quickly transitioned from a chemical curiosity to an important reagent in analytic and synthetic chemistry, as well as in water treatment. As early as 1910, the city of Paris began using O<sub>3</sub> gas for the disinfection of drinking water and wastewater.<sup>101</sup> Drinking-water disinfection remains an application in which O<sub>3</sub> gas is generated on a large scale.<sup>102</sup> Ozonation also is valuable in bleaching, semiconductor processes, and, increasingly, for neutralizing pathogens on fruits and vegetables and even as a sanitizing oxidant in liquid foods.<sup>103,104</sup> Finally, O<sub>3</sub> also has become an indispensable reagent for organic synthesis and an extremely useful tool for structural determination of natural products.<sup>105</sup>

 $O_3$  is an allotropic modification of  $O_2$  that, unlike  $O_2$ , is intensely colored, diamagnetic, poisonous, and explosive at high concentration (>60 wt%).<sup>97,106,107</sup> It is generally produced by a device that employs dielectric barrier discharge, hereafter

<sup>&</sup>lt;sup>m</sup> From the Greek *ozein*, "to smell", as suggested by Schönbein's colleague, W. Vischer, Professor of Greek in Basel, Switzerland.

referred to as an ozone generator (OG), from either  $O_2$  or air feed gas.<sup>108</sup> In this arrangement,  $O_2$  is separated into O atoms by direct electron impact as in

$$e + O_2 \rightarrow 2O + e$$
 Equation 2.1<sup>108</sup>

The  $O_3$  molecules are then formed from a three-body collision between the remaining O atom, and a third body denoted M (Equation 2.2).<sup>108</sup>

$$0 + O_2 + M \rightarrow O_3 + M$$
 Equation 2.2

When  $O_3$  is generated from a pure- $O_2$  feed gas, the third body (M) can be  $O_3$ ,  $O_2$ , O, or a surface.<sup>109</sup> Innovation in the efficiency of electron transfer has enabled the production of high concentrations of  $O_3$ .<sup>108</sup> This was accomplished first by adopting pure  $O_2$  as a feed gas and second by shortening the discharge gap in the OGs to achieve a high electric field.<sup>108</sup> These improvements have yielded  $O_3$  concentrations exceeding 200 mg/L.<sup>102</sup>

The remarkable physical and chemical properties of  $O_3$  are a result of the large excess of energy of its molecule upon decomposition to  $O_2$ .<sup>101</sup>

$$O_3 \rightarrow \frac{3}{2}O_2 + 143 \, kJ/mol$$
 Equation 2.3

It is this energy that makes  $O_3$  extremely explosive at a certain critical concentration: Self-sustaining decomposition occurs above 15 wt%, deflagration at ~50 wt%, and explosion at ~60 wt%.<sup>110</sup> Ultra-high-efficiency OGs can reach concentrations of 15 wt% using an  $O_2$  feed gas, which is considered safe to handle.<sup>102</sup> Higher concentrations can only be achieved through some form of separation of  $O_3$  from the feed gas like low temperature liquid<sup>n</sup> distillation or silica-gel absorption/desorption at super-cooled

<sup>&</sup>lt;sup>n</sup> The liquid or solid pure O<sub>3</sub> product is extremely unstable and explosive.

temperatures (-60 to -80°C).<sup>106,107,111</sup> Thus, gas-based ozonation reactions must occur in the presence of the carrier gas, which will contain  $O_2$  at high concentrations.<sup>111</sup>

# 2.2 The Criegee Ozonolysis

The exceptional reactivity of O<sub>3</sub> gas was determined very soon after its discovery. From 1840-1845, it was shown qualitatively that O<sub>3</sub> reacted with a host of inorganic compounds (particularly metals).<sup>100</sup> By 1845, the reactivity of O<sub>3</sub> with organic compounds became established when it was demonstrated that the potent odor of  $O_3$ disappeared in the presence of straw, humus, humus containing earth, sawdust, flour, potato starch, egg white, mushrooms, and many more.<sup>100</sup> Even at this early stage, chemists noted that the reactions of O<sub>3</sub> with organic compounds did not convert the organic substrate to the highest oxidation state (CO<sub>2</sub>), but instead to aldehydes and carboxylic acids. The vigorous reaction of O<sub>3</sub> with unsaturated organic compounds attracted the attention of organic chemists. The work of C. D. Harries, from 1903 to 1916 in the German towns Berlin and Kiel, established experimental procedures for "ozonolysis," the process by which the unsaturated bonds of alkenes, alkynes, or azo compounds are cleaved using O<sub>3</sub>.<sup>105</sup> Harries also initiated investigations into the mechanistic understanding of ozonolysis, which was proposed nearly 40 years later by Rudolf Criegee in Karlsruhe, Germany and confirmed in 2009.<sup>105,112,113</sup> The reaction of  $O_3$  with double bonds, along with the decomposition of the resulting products, is one of the most dependable procedures for oxidative splitting of unsaturated molecules as well as for the determination of the double-bond position.<sup>114</sup>

The Criegee ozonolysis of alkenes (aka olefins) is a classic reaction of organic chemistry and underscores the ability of O<sub>3</sub> to pinpoint the double bond position on an unsaturated straight-chain hydrocarbon.<sup>112</sup> The electrophilic attack by O<sub>3</sub> is described as a 1,3-dipolar cycloaddition<sup>o</sup> and produces a unique molozonide or primary ozonide (1,2,3-trioxolane) that rapidly rearranges to a carbonyl compound and a biradical (or zwitterion),<sup>p</sup> the so-called Criegee intermediate.<sup>112,113,115–118</sup> These, in turn, recombine to form the class of secondary ozonides, the 1,2,4-trioxolanes, that are reactive and thermally unstable (decomposing at 70-80 °C).<sup>113,115</sup> Secondary work-up determines the downstream products. If the work-up is reductive, the ozonide degrades to alcohols or carbonyl compounds, while oxidative work-up leads to smaller carboxylic acids or ketones. For this reason, O<sub>3</sub> was used in the early in the 20<sup>th</sup> century to "cut" high molecular weight alkenes into smaller molecules that were easier to analyze with the then available organic chemistry techniques.<sup>101</sup>

# 2.3 The Relative Reactivity of O<sub>3</sub>

The remarkable reactivity of O<sub>3</sub> with unsaturated (olefinic) compounds was naturally followed up by the ozonation of other organic groupings. O<sub>3</sub> is like most oxidants in that the nature of the substituents exerts a strong effect on position of attack and rate of the reaction for a given compound.<sup>119</sup> This relative reactivity is noted among hydrocarbon types (alkanes, cycloalkanes, aromatics, heterocycles) and with respect to the attack position of the hydrocarbon itself.<sup>101,120,121</sup> The simplest example can be observed in the

<sup>&</sup>lt;sup>o</sup> Although this reaction is most accurately described as a pericyclic reaction, chemists have observed that electron-rich alkenes react faster with ozone than electron-poor alkenes.

<sup>&</sup>lt;sup>p</sup> A molecule containing the oxide of a carbonyl group.

oxidation differences within the alkane group due to substituent pressure around a given carbon position. A carbon atom with only single bonds will form four<sup>q</sup> specific bonding arrangements.<sup>122,123</sup> Aside from the unique structure of methane, a carbon can be in a primary, secondary, tertiary, or quaternary position depending on whether it is bonded to one, two, three, or four other carbon atoms, as illustrated (Figure 2.1).<sup>21</sup>



Figure 2.1 Aside from the unique bonding arrangement in (a) methane, a carbon atom can form (b) primary, (c) secondary, (d) tertiary, and (e) quaternary bonding arrangements depending on whether it is bonded to one, two, three, or four other carbon atoms as demonstrated with ethane, propane, isobutane, and neopentane, respectively.

The bonding arrangement within a hydrocarbon molecule determines the electron density proximal to each carbon, which in turn establishes the degree to which a carbon undergoing bond cleavage can delocalize an electron deficiency. This delocalization phenomenon is known as hyperconjugation and is important in hydrocarbon reactions that produce either a carbon radical by homolytic<sup>r</sup> bond cleavage or hydrocarbon ion

<sup>&</sup>lt;sup>q</sup> Methane is considered "unique" in this series.

<sup>&</sup>lt;sup>r</sup> Homolytic bond cleavage results in the breaking of a covalent bond in a single molecule such that resulting structures (atoms or molecules) each gain only one electron from a bonding pair.

through heterolytic<sup>s</sup> bond cleavage.<sup>124,125</sup> The relative stability of carbon radicals and carbocation increases with the number of adjacent carbon atoms that can delocalize an unpaired electron.<sup>125</sup> As such, an unpaired electron at a tertiary carbon position is more stable than a secondary carbon, which is more stable than a primary carbon, which, in turn, is more stable than a methyl radical, as shown in Figure 2.2.



Figure 2.2 Hydrocarbon radicals represented in order of increasing stability; stability improves (from left to right) as an electron deficiency can be dispersed among p-orbitals of adjacent bonding carbons.

Hyperconjugation effects explain differences in C—H bond dissociation energy in alkanes.<sup>119</sup> In a demonstration of this feature in ozonation, Paltenghi and coworkers measured the rates constants of alkyl radicals reacting with  $O_3$  at 298K shown in Table 2.1.<sup>126</sup> The trends were similar to those observed for the reaction of organic reactions with  $O_2$ , wherein the rate constant *k* increased with decreasing ionization potential (IP) of the radical.

<sup>&</sup>lt;sup>s</sup> Heterolytic covalent bond cleavage, otherwise known as ionic fission, results into both electrons in a bonding pair leaving with one molecule (or atom). For a hydrocarbon, a leaving pair creates a carbocation that follows the stability pattern of carbon radicals (tertiary>secondary>primary). On the other hand, if the hydrocarbon keeps both electrons the resultant carbanion will be destabilized by adjacent carbons (tertiary<secondary<primary).

Radical	$k_1 (10^{-12} \text{ cm}^3/\text{molecule} \cdot s)$
Methyl (CH <sub>3</sub> )	2.53±0.54
Ethyl (C <sub>2</sub> H <sub>5</sub> )	25.3±5.80
Propyl (1-C <sub>3</sub> H <sub>7</sub> )	24.4±5.90
Propyl (2-C <sub>3</sub> H <sub>7</sub> )	46.5±10.9
Tert-Butyl (t-C4H9)	$54.5 \pm 11.4$

Table 2.1. Relative reactivity of alky radicals with  $O_3$  gas by the rate constant  $k_1$ . Data modified from source.<sup>126</sup>

The energy for a homolytic bond cleavage between a carbon atom and hydrogen atom is, by definition, exactly equal to bond dissociation energy (BDE) and decreases if the resulting radical species is more stable.<sup>21,119,127</sup> Hence, the BDE of a carbon hydrogen (C—H) bond is inversely related the to the number of carbons adjacent to the C—H bond being broken. It is then unsurprising that the BDE of C—H bond in methane is 440 kJ/mol, in a primary carbon it is 410 kJ/mol, in a secondary carbon it is 400 kJ/mol, and in a tertiary carbon it is 390 kJ/mol.<sup>123</sup> In other words, BDE can be considered a measure of radical stability, and ease of oxidation.

This order of reactivity is relevant to chemical transformation of a petroleum crude oil, which contains a mix of hydrocarbon structures reacting at different rates. Since any factor that either helps to donate electron density to the half-filled orbital, or to delocalize an unpaired electron will stabilize a radical intermediate and promote the oxidation, some structures will be oxidized more readily than others. Carbon position (methyl < primary < secondary < tertiary) is one example. However, several other factors are important to stabilizing free-radicals: e.g., an adjacent aromatic core, such as benzene or adjacent atoms with lone-pair electrons, like nitrogen.

The relative importance of each kind of substituent (alkyl group, aromatic group, lone pair) has been observed in the various types of O<sub>3</sub> attack on organic molecules. While O<sub>3</sub> behaves with a 1,3-dipolar addition to carbon—carbon double bonds, O<sub>3</sub> also reacts as an electrophile and, in some cases, as a nucleophile. O<sub>3</sub> can react with carbon triple bonds (acetylenic compounds), aromatic rings, nucleophilic groups (like amines and sulfides), carbon—nitrogen and carbon—sulfur double bonds, carbonyl groups, carbon—hydrogen bonds, and organometals.<sup>120</sup> These reactions occur at different rates, with some to the exclusion of others when more than one group is present in the system at the same time. Figure 2.3 describes the general trends observed for the functional groups.



Figure 2.3 The order of reactivity of O<sub>3</sub> gas for various organic groupings.<sup>120</sup>

The great difference in reaction order indicates that ozonation, at least in nonparticipating aprotic solvents, may proceed in series. Indeed, certain organic materials are known to "shield" other organic substituents from a reaction with ozone. Cataldo and Ori experimented with buckminsterfullerene (C60) dissolved in CCl<sub>4</sub> to determine whether it could shield a dienic rubber (*cis*-1,4-polyisoprene, an olefinic polymer) from oxidation.<sup>128</sup> Instead, the authors found the opposite: While fullerene alone began to oxidize in O<sub>3</sub> gas in 3 minutes, the presence of dissolved *cis*-1,4-polyisoprene acted as an O<sub>3</sub> scavenger and protected buckminsterfullerene for additional 40 minutes. Similarly, Bailey notes that, while O<sub>3</sub> can react vigorously with alcohols, alcohol can still be used as a solvent when it contains organic compounds that are more reactive toward O<sub>3</sub>.<sup>120</sup> These results suggest that O<sub>3</sub> oxidations tend to happen in series, not in parallel, particularly when the reactants are in excess.

## **2.4** Ozonation of the $\pi$ - Conjugated Ring

Detailed knowledge of the mechanism of the reactions of  $O_3$  with aromatic hydrocarbons is of great importance for a complete understanding of the chemistry of the petroleum hydrocarbon oxidation because of their typical prevalence (~30-60 wt %) in petroleum crude and their ease of oxidation relative to the other major group, the saturates. A mechanistic understanding informs  $O_3$  utilization and expected products. The precise mechanism of the reaction of ozone and has been most studied with respect to the benzene ring. This model is used here, although benzene is typically not present in weathered crude oils.

### 2.4.1 Mechanism and Products of Benzene Ozonation

It became obvious early on that the aromatic compounds reacted much more slowly than alkenes. Indeed, a phenyl substituted alkene would be attacked at the double bond only, even if the alkene were in ring conformation.<sup>120</sup> Confirmation comes from Atkinson et al., who found the following rate constants for the reaction of O<sub>3</sub> (cm<sup>3</sup>/molecule•s) with the following napthenoaromatics<sup>t</sup>: fluorene,  $<2x10^{-19}$ ; indane,  $<3x10^{-19}$ ; 9,10-dihydroanthracene,  $(9.0\pm2.0)x10^{-19}$ ; and, indene,  $(1.7\pm0.5)x10^{-16}$ ; reactions were executed in tropospheric conditions, Figure 2.4.<sup>129</sup>



Figure 2.4 The reaction rates of  $O_3$  trend as follows: a. fluorene < b. indane < c. 9,10 dyhyrdoanthracene << d. indene.

It is generally acknowledged that the O<sub>3</sub> attack on a benzene ring is like that of the Criegee ozonolysis: The O<sub>3</sub> molecule attacks two adjacent (ortho) carbons in what is described as a 1,3-dipolar cycloaddition. This nomenclature indicates that the terminal (1,3) O atoms are oppositely charged and simultaneously attack a double bond forming a primary ozonide with a 1,2,3 trioxolane conformation.<sup>130,131</sup> However, the reaction is slower than the alkene ozonolysis by 6 orders of magnitude.<sup>132,133</sup> The thermodynamic differences naturally recapitulate the preferential order of the kinetics, though not with the same scale differences. Hendrickx and Vinckier found that the following theoretical activation barriers for benzene, phenol, and ethylene, respectively: +15.8, +9.5, and +3.3, kcal/mol, which agreed with experimental values. <sup>130,133</sup> The theoretical differences in exothermicity also corresponded to experimental values, though the differences between

<sup>&</sup>lt;sup>t</sup> Napthenoaromatics include one or several condensed aromatic rings, fused with naphthenic rings and chains.<sup>8</sup>

hydrocarbon classes were smaller in magnitude: -18.9, -29.0, -52.5 kcal/mol, for benzene, phenol, and ethylene, respectively.<sup>130</sup> Though reactions with an aromatic ring are orders of magnitude slower than alkenes, the energy released from a delocalized double bond in benzene is half as much as that released from normal alkene.

The activation energy of the first reaction (for the preferred -endo geometry) is noted by Wen et al. to be close to 16.6. kcal/mol (very close to the 15.8 kcal/mol found by Hendrickx and Vinckier).<sup>130,134</sup> The initial release of energy from the first-step of the reaction of benzene is thought to be 18.9 kcal/mol from Wen et al. and 21.8 kcal/mol from Hendrickx and Vinckier.<sup>130,134</sup> The formation of the primary ozonide (POZ) intermediate is the rate-limiting step which cleaves the first C—C double bond to single bond and disrupts the aromatic core. The two ortho carbons are bound to the 3 oxygen atoms in a ring conformation exactly like the 1,2,3-trioxalane POZ in the ozonolysis of an alkene. The two remaining C—C double bonds are no longer aromatic but olefinic, though still probably linked in ring conformation.

The second O<sub>3</sub> molecule disrupts a  $\pi$ -bond, not a conjugated  $\pi$ -system. Therefore, the reaction is predicted to be faster, more exothermic (-40 to -50 kcal/mol), and with a negative activation energy of -5 kcal/mol, meaning that it has nearly no energy barrier. The second addition of O<sub>3</sub> can proceed by several paths. The most thermodynamically favored is the addition of a second O<sub>3</sub> molecule, which causes the 1,2,3-trioxalane bridge of the first O<sub>3</sub> to collapse to a carbonyl oxide and a biradical (just like in a Criegee mechanism) and open the ring of carbons into a chain conformation. Unlike the Criegee ozonolysis of an alkene, the benzene reaction produces a carbonyl and biradical that are linked by the remaining double bond, which is illustrated in Figure 2.5.



Figure 2.5 Cleavage of the POZ intermediate on the addition of a second O<sub>3</sub> molecule.<sup>120</sup>

The final C—C double bond also is vulnerable to ozonolysis. Like the second addition, the third addition has little energy barrier and is exothermic (-40 to -50 kcal/mol).<sup>134</sup> Also like the second addition, the third molecule O<sub>3</sub> appears to cause the bridge of the second O<sub>3</sub> to collapse. Unlike the second addition, however, the third addition causes molecular cleavage, which releases several products, such as CO<sub>2</sub> and glyoxal, major non-peroxidic products. The remainder of the carbon chain, containing carbonyl oxides, can form peroxidic depending on the reaction environment.

## **2.4.2** Substituent Effects on the $\pi$ -Conjugated Ring

The presence of substituent groups enhances the reaction rates of O<sub>3</sub> with benzene or its homologs. Figure 2.6 summarizes some of these findings normalized to the ozonation of benzene in CCl<sub>4</sub> at 25°C and clustered for polyaromatic hydrocarbons, methyl-substituted benzene rings, and ethyl-substituted benzene rings. Compared to benzene, phenanthrene and pyrene react over 1000 times faster. Similarly, methylated benzene homologs show remarkable increases in reactivity. Compared to benzene, toluene reacts 3 times faster; an additional methyl group to form xylene increases that rate another 3- to 5-fold. The rate constant for mesitylene (3-methyl groups) is 70 times greater than benzene, and for durene (4 methyl groups) 400 times greater.



Figure 2.6 Second-order relative rate constants for the ozonation of benzene and benzene homologs performed in  $CCl_4$  at 20-25°C. Values on Y-axis are normalized to benzene and on a log-scale. Data are adapted from Bailey.<sup>120</sup>

Substituents to the benzene ring increase the reaction rate considerably, but the increase in rate constant appears to maximize and level-off at some point. In addition, certain types of moieties create steric hindrance (as in hexaethylbenzene, not shown) and slow the rate of oxidation. Nevertheless, the trends appear to indicate that larger, more substituted aromatic rings and polyaromatic rings react more readily than less substituted ones. In a complex hydrocarbon mixture like crude oil, reactivity is likely to vary over many orders of magnitude. This feature is sometimes called "activation." Electron-donating groups enhance (i.e., "activate") the rate of oxidation by O<sub>3</sub>, and electron-withdrawing groups "deactivate" the ring to which they are attached. The principles underpinning "activation" or "de-activation" of the aromatic core might be considered an extension of the delocalization concepts discussed in Section 2.3.

# 2.4.3 O<sub>3</sub> Attack on Benz-Fused Carbocyclics: Polyaromatic Hydrocarbons

The reaction on polyaromatic hydrocarbons, or benz-fused carboxylics, like naphthalene and phenanthrene, are indeed activated by the adjacent aromatic cores. As noted, the reaction rates for PAHs can be orders of magnitude higher than that of benzene because of the electron-donating effects of adjacent aromatic rings. On the other hand, a primary ozonide that has decomposed on a fused aromatic ring does not usually open a chain of olefinic bonds (naphthalene is the exception). The following discusses 2 homolog conformations, angular and linear, and their pattern of reactivity with O<sub>3</sub>. Angular PAH homologs are shown in Figure 2.7. In Figure 2.7, the primary reacting bond is shown in red and is the bond of lowest localization energy  $(LE_b)^u$ . The unique placement of the LE<sub>b</sub> means that a 1,3-dipolar cyclo-addition by O<sub>3</sub> at the LE<sub>b</sub> disrupts aromaticity for some, but not all, the carbons on the reacting ring, as happens in benzene. O<sub>3</sub> attack on naphthalene (Figure 2.7a), for example, disrupts the aromaticity of 4 of the 6 carbons on the reacting ring. The remaining 2 carbon atoms on the breached aromatic ring are still bond to a conjugated  $\pi$ -centers on the adjacent ring. For phenanthrene (Figure 2.7b) and chrysene (Figure 2.7c), only the 2 carbons directly involved at the reacting bond are affected; the remaining 4 carbons are still in a  $\pi$ -conjugated system on adjacent rings. The following section discusses the 2-ringed naphthalene, 3-ringed phenanthrene, 4-ringed chrysene, and 5-ringed picene in more detail.



<sup>&</sup>lt;sup>u</sup> Defined as the  $\pi$ -binding energy required to attach a proton or a hydride ion to a given  $\pi$ -electronic system.<sup>135</sup>

Figure 2.7 Angular PAHs discussed include: (a) Naphthalene, (b) phenanthrene, (C) chrysene, and (d) picene. Bond with lowest localization energy (LE<sub>b</sub>) noted in red.

Wibaut and coworkers found that naphthalene reacted much more readily than benzene with two moles of O<sub>3</sub>, whereas a third mole of O<sub>3</sub> reacted much more slowly.<sup>136</sup> The reaction product was primarily phthalic acid (Figure 2.8). Rindone et al. also ozonated naphthalene and found that the primary products were phthalic aldehyde, 2formyl benzoic acid, and phthalic anhydride. Each of the structures found by Wibaut and Rindone shows that only one of the aromatic rings was cleaved by 2 moles of O<sub>3</sub>, while the other ring remained intact. As an analogy to benzene, the first mole of O<sub>3</sub> attacks an aromatic core activated by the adjacent core. This first addition also exposes a single olefinic bond on the breached ring, making a second molar addition of O<sub>3</sub> to that ring thermodynamically favorable and faster.<sup>120</sup> However, carbonyl groups from the cleavage of the first core deactivate the addition of a third mole of O<sub>3</sub> to the unreacted aromatic ring.<sup>120,136,137</sup>



Figure 2.8 O<sub>3</sub> reacts with naphthalene to produce phthalic acid in 48% yield.<sup>120</sup>

Wibaut and coworkers also ozonated methylated naphthalene, finding the activation of substituents groups for oxidation noted above.<sup>136</sup> The products of methylated naphthalene (2,3 and 1,4-dimethylnaphthalene) produced small yields of glyoxal, methylglyoxal, biacetyl (in reducing conditions), and a major product of acetic

acid (in oxidizing conditions). These results suggest that activating methyl groups, particularly in oxidizing reaction conditions, cause a complete degradation of both aromatic rings in naphthalene. As in the discussion for benzene, polymeric intermediate may also be formed, but decompose on further reduction or oxidation. Though unstable, the suggested structure of the polymer nearly always contains a repeating benzene core.<sup>120</sup>

Phenanthrene is considerably more reactive to  $O_3$  than naphthalene because the central benzene ring is highly stabilized by two adjacent aromatic cores. Nevertheless, the opening of the core aromatic ring does not expose C—C double bonds, as in benzene or naphthalene. Instead, the ozonide and biradical intermediate degrade to a variety of products depending on secondary work-up. In oxidizing conditions, like with additional  $O_2/O_3$ , the cleavage produces diphenic acid in 50% yield, though as many as six other products are possible (Figure 2.9).<sup>120,138</sup> Researchers have found the products of ozonation of phenanthrene to be less biodegradable and more toxic.<sup>138</sup> It also is clear that the reaction product has not lost carbon atoms.



Figure 2.9 O<sub>3</sub> reacts with phenanthrene to produce diphenic acid in 50% yield.

Chrysene has four aromatic cores and, like phenanthrene, easily absorbs 1 mole of O<sub>3</sub> at the bond of lowest localization energy (5,6 position). The resulting primary ozonide is peroxidic, which likely is polymeric in a non-participating solvent.<sup>120</sup> In an oxidizing environment, however, these primary products decompose to 2-(*o*-carboxyphenyl)-1-naphthoic acid in 48% yield (Figure 2.10) according to Bailey.<sup>120,139</sup> Luster-Teaseley et al. found also found this product as well as additional products 2-(2'-formyl) phenyl-1 naphthaldehyde and 2-(2'formyl) phenyl-1-naphthoic acid, which were more toxic than chrysene itself. In particular, 2-(2'-Formyl) phenyl-1-naphthaldehyde inhibited *in vitro* gap-junctional intercellular communication (GJIC) and caused irreversible damage that lead to cell death.<sup>139</sup> Each of the three reaction products listed above retain 3 of the 4 aromatic cores on chrysene. The 2 carbon positions (the 5,6 carbons on chrysene) where the initial O<sub>3</sub> molecule attacked lead to some combination of carbonyl and carboxylic acid, though there is not loss of carbon from the molecule.



Figure 2.10 O<sub>3</sub> reacts with chrysene to produce 2-(o-caroxyphenyl)-1-napththoic acid in 48% Yield.

The 5-ringed picene molecule readily absorbs 2 moles of O<sub>3</sub> gas, attacking the 5,6 and 7,8 positions, both which are bonds of lowest LE<sub>b</sub>. Like chrysene and phenanthrene, the primary products are peroxidic polymeric ozonides in a non-participating solvent, which are oxidatively decomposed to a 35% yield of terphenyltetracarboxylic acid anhydride (Figure 2.11). It is worth noting that the C—O—C bridge in the center position represents the "anhydride," which is formed by the loss of H<sub>2</sub>O from two –OH groups of the central carboxylic acids. The loss of H<sub>2</sub>O, and often H<sub>2</sub>O<sub>2</sub> as well, is a frequent decomposition products of work-up (both oxidative and reductive) of the primary reaction products of O<sub>3</sub> and PAHs.<sup>120</sup>



Figure 2.11 O<sub>3</sub> reacts with picene to produce terphenyltetracarboxylic acid anhydride in 35% yield.

The reactions of PAHs are activated by fused aromatic rings and are, therefore, considerably more reactive than the unsubstituted benzene ring. The positions of attack are usually the bond of lowest localization energy; that is, the bond that can most approximate double-bond character in the overall ring structure. For the angular PAHs, the attack on this position does not typically expose olefinic bonds, as in benzene. Hence, although angular PAHs are more reactive, they also only absorb between 1 and 2 moles O<sub>3</sub>. The overriding feature of the above reactions is the residue of some of the aromatic rings, deactivated by adjacent electron withdrawing groups. Because of the residual aromatic cores, additional ozonation can occur, although it is much slower and more exhaustive.

The linearly fused PAHs (sometimes called polyacenes), represent a different combination of the straight-chain aromatics, which are also highly reactive.<sup>135</sup> They include naphthalene (2 rings) as well as anthracene (3-rings), tetracene<sup>v</sup> (4 rings), pentacene (5 rings), hexacene (6 rings), and heptacene<sup>w</sup> (7 rings). Anthracene is more reactive than naphthalene; it is easily oxidized in the middle ring to anthraquinone. Tetracene, pentacene, and hexacene (6) also are readily photo-oxidized. Except for anthracene, the polyacenes are not prevalent in crude oil. Nevertheless, the ozonation of these compounds shows an entirely different kind of O<sub>3</sub> attack on a fused aromatic structure, the electrophilic substitution at atom of lowest localization energy (LE<sub>a</sub>). That is, the most reactive site in these molecules is the innermost solo carbon atom.

<sup>&</sup>lt;sup>v</sup> Tetracene is also known as naphthacene.<sup>120</sup>

<sup>&</sup>lt;sup>w</sup> 6 Heptacene is so unstable that it has never been obtained in a pure state.<sup>135</sup>

# 3 RESEARCH: OZONATION OF THREE DISTINCT CRUDE OILS FOR TOXICOLOGY TESTING<sup>x</sup>

#### 3.1 Introduction

Over the last 50 years, the exploration, extraction, transport, and storage of 70-100 million barrels per day (mbd) of crude oil have resulted in stockpiles of contaminated soil and water from continual small releases and vast catastrophic ones.<sup>1,4,38,52,76,77</sup> The spilled oil, though susceptible to chemical, physical, and biological degradation, can still leave residuals that persist for decades and present environmental hazards to native ecology and human health.<sup>38,48,78,140</sup> This widespread contamination has necessitated research into petroleum fate and transport in environmental matrices, interaction with microbial consortia, and standards for risk assessment.<sup>55,86,140,141</sup>

Exposure to crude oil and weathered residuals of crude oil spills have been extensively studied in plants and animals.<sup>5,47,72,74,91,140,142–147</sup> Few studies, however, have looked at the effect of multiple intact crude oils simultaneously. Many studies have focused on the environmental releases of a single crude oil in an accidental release scenario. For example, Cowell examined large oil spills in Pembrokeshire, Wales; de Jong looked at crude oil contamination from a fractured pipeline in Saskatchewan, Canada; Han et al. used samples from the Chennai oil spill in India; Venosa et al. examined the Exxon Valdez oil spill in Alaska's Prince William Sound; Klinger et al. assessed the toxicity of the Deepwater Horizon disaster in the Gulf of Mexico; and

<sup>&</sup>lt;sup>x</sup> This Chapter and the next will be incorporated into a manuscript.

Incardona et al. looked at Cosco Busan bunker oil spill in San Francisco Bay, etc.<sup>4,79,148–</sup>

Other scientists simply obtain oils from a single site or sources without being able to control for background conditions: e.g., Chaîneau and colleagues used oil obtained in Marne, France; Besalatpour et al. obtained oil-contaminated soils from a field in Tehran, Iran; Tang et al. used soil from Shengli Oilfield in Shandong Province of China; and Zhu et al. used samples from a field of the Beijing Agriculture and Forest Science, etc.<sup>79,144,146,151</sup> At times, diesel, gasoline, motor oil, lubricating oil, or even vegetable oil were used to characterize the toxicity of hydrocarbon contaminants.<sup>91,152–155</sup> A study by Ogboghodo et al. looked at two crude oils simultaneously, but they were closely related: Forcados and Escravos were light crude oils received from Nigerian National Petroleum Corporation (NNPC) in Warri, Nigeria.<sup>156</sup>

Crude oil differences can be vast, however. On the one hand, the elemental composition is relatively simple: 83-87 wt% carbon and 10-14 wt% to hydrogen, and the remaining 3-7 wt% from the heteroatoms nitrogen (0.1-0.2 wt%), sulfur (0.05-6.0 wt%), and oxygen (0.05-2.0 wt%), with trace metals due mostly to vanadium (~1200 ppm) and nickel (120ppm).<sup>7,9–11</sup> On the other hand, the vast bonding configurations of those simple ingredients can create between 10,000 to 100,000 unique chemical constituents.<sup>8</sup> The molecular differences of these constituents contribute greatly to differences in behavior in the environment and the potential for toxic affect.

The lighter compounds components of crude oil have increased motility in the gas phase through volatilization, aqueous phase via a higher partition coefficient in water, and sometimes even the solid phase through thermodynamic flexibility and adsorption to native organic content.<sup>157–160</sup> Lighter (<C20) saturated compounds are not usually implicated with serious ecological or human health risks and are highly susceptible to aerobic and anaerobic biodegradation. Aromatic compounds, on the other hand, can include some of the most notoriously toxic and carcinogenic compounds in our environment. Benzene, for example, has no safe level of exposure according to the American Petroleum Institute (API).<sup>161</sup> While benzene is attenuated through volatilization in weathered crude oil, fused benzene homologs are not. Most PAHs are mutagenic in cell experiments and carcinogenic to animals and humans.<sup>133</sup> The large molecular size and increase in heteroatom frequency of asphaltenes and resins leads to an increase in polarity and van der Waals forces.<sup>160</sup> Both features allow these molecules to resist volatilization, dissolution, and transport through the solid matrix, since they adsorb much more readily to inorganic substrates such as the soil mineral backbone.<sup>8,160</sup> The recalcitrance and immobility of resins and asphaltenes often mean they are discounted from hazard assessments, though that view is changing.<sup>160,162,163</sup>

The toxicity of these basic groups is mediated through exposure to weathering conditions and, in some cases, can increase toxicity dramatically.<sup>41,48,73,74,164,165</sup> Exposure to sunlight, in particular, creates oxidized weathered petroleum products that show acute toxic effect in a variety of ecological settings.<sup>45,47,48,53,150,164,166</sup> For example, Maki et al. found that photo irradiation increased oxygenation, decreased aromaticity, increased the relative fraction of asphaltenes and resins, and increased dissolved organic carbon (DOC) thereby increasing bioavailability of oil. The oxidized water-soluble fraction, however,

showed acute toxicity to crustaceans.<sup>45</sup> Barron et al. found that Alaskan North Slope Crude oil (ANS) was phototoxic and that UV could be a causative factor in the mortality of early life stages of herring.<sup>48</sup> In a later study, Barron et al. find that phototoxicity can create a 2- to 1000-fold increase in chemical toxicity to aquatic organisms.<sup>47</sup> Incardona et al. found that Cosco Busan oil and UV co-exposure were necessary and sufficient to induce an acutely lethal necrotic syndrome in hatching herring embryos.<sup>150</sup>

Natural oxidative processes play a critical role in destroying petroleum hydrocarbons and removing them from the biosphere.<sup>53</sup> Owing to their efficacy, artificial oxidation has been proposed as a means to accelerate environmental remediation of crude oil spills. Advanced oxidation processes (AOPs) for removing weathered crude oil, and indeed many types of hydrocarbon contamination, are an important environmental tool. AOPs include Fenton oxidation, photocatalysis, plasma oxidation, and ozonation.<sup>85</sup> Yet, direct evidence is minimal about changes to toxicity when crude oil residuals are transformed into oxidized products in a remediation setting. Research demonstrating these technologies with reference only to decreased TPH or PAH levels neglects the fact that, outside the specific case of complete mineralization, the oxidation of petrogenic compounds will create a new set of residuals-carboxylic acids, ketones, and esterswhich, though not technically classified as "PAH" or "TPH", persist in the environment. While it is true that oxidization byproducts will have increased solubility and biodegradability, it is also the case that these compounds will have new routes of environmental exposure for toxic affect.

While ozone (O<sub>3</sub>) gas has been proposed as an effective oxidant to accelerate the bioremediation of petroleum hydrocarbons, of urgent need is assessing the toxicity of the oxidized residuals in a terrestrial setting, in which  $O_3$  gas would be deployed. This assessment must (1) control background soil condition, (2) assess the effect of different types of crude (both untreated and O<sub>3</sub>-treated), and (3) determine the effect of increasing O<sub>3</sub> dose. This chapter serves as a foundation for the following two chapters, which assess terrestrial toxicity of ozonated crude oil in three plant species. In this chapter, I create synthetically contaminated soils using three distinct crude oils: ANS (API gravity 29-32), ARAB (API gravity 30-32), and SJV (API gravity 13-15). I evaluate how each soil responds to ozonation at three doses by evaluating the loss of TPH, the gain of DOC, and pH change. The use of a standard background controls for the potential effects of the mineral background, the simultaneous comparison of three crude oils allows me to examine whether ozonation can create important differences in amount and carbon number of oxidized products, and the dosing sequence allows me to observe whether the degree of ozonation can affect toxicity as examined in later chapters.

#### **3.2 Laboratory Methods**

#### 3.2.1 Test Soil (TS) Classification

The base *Test Soil (TS)* used in all experiments was locally sourced topsoil (*All Star Materials*, Guadalupe, AZ) that was free of organics that would interfere with the quantitation of hydrocarbons or their oxidized byproducts (<2%). Before use, the soil was sieved through a No. 10 mesh to remove material that larger than 2 mm in diameter.

After sieving, particle-size distribution was determined using ASTM Method D422-63 "Standard Test Method for Particle-Size Analysis of Soils" (Appendix A).<sup>167</sup> Liquid limit (LL) and plastic limits (PL) were determined using ASTM Method D4318-10 "Standard Test Methods for Liquid Limit, Plastic Limit, and Plasticity Index of Soils" (Appendix A).<sup>168</sup> The particle-size analysis, LL, and PL were used to determine the soil classification using ASTM Method D2487 – 11 "Standard Practice for Classification of Soils for Engineering Purposes (Unified Soil Classification System) (Appendix A)."<sup>169</sup>

Soil conductivity and organic matter content by the loss-on-ignition method (360°C) were determined at the University of Connecticut Soil Nutrient Analysis Laboratory (Storrs, CT).<sup>170,171</sup> Conductivity was  $1.73 \pm 0.2$  dS/mm and organic matter was  $0.5 \pm 0.05\%$  w/w. The pH, before and after ozonation, was measured in 1:2 (w/w) soil/water mixture with a Thermo Scientific Orion 2 Star pH probe (Thermo Fisher Scientific Inc.).

#### **3.2.2 ICP-MS for Total Metals**

Total metal content was tested at ASU facilities using a Thermo Scientific Quadrupole Inductively Coupled Plasma – Mass Spectrometer (ICP-MS). Soils preparation for ICP-MS followed EPA method 3051a.<sup>172</sup> Briefly, soils for analysis were air-dried, ground with a mortar and pestle, and weighed to a sample size of approximately 0.1 grams. The soil sample was then added to a clean Teflon microwave tube; to this, 9 mL of concentrated nitric acid, 1 mL of concentrated hydrochloric acid, and 1 mL of concentrated hydrofluoric acid were added. The Teflon sample tubes were microwave heated for 1 hour and 30 minutes in a heat sequence to 150°C to aid in the digestion of all organic material. The samples were then cooled for 30 minutes. Samples were digested for over 72 hours in a chemical hood. After digestion, samples were moved to clean heat-resistant polypropylene tubes. The samples were heated on a hotplate to 240°C in a chemical hood to evaporate HF and other acids for approximately 4 hours. The samples were then re-suspended in nitric acid and run on ICP-MS for the following metal elements: iron, manganese, copper, chromium, zinc, and nickel.

### 3.2.3 Crude Oil Analyses

Chevron Energy Technology Company (ETC) (Richmond, CA) provided three distinct crude oils coded *ANS* (API gravity 29-32), *ARAB* (API gravity 30-32), and *SJV* (API gravity 13-15); they are categorized as medium, medium, and heavy crude oil, respectively. Crude-oil samples were sent to Eurofins Lancaster Laboratories Environmental (Lancaster, PA) for analysis of total petroleum hydrocarbon (TPH) using MA DEP EPH and polyaromatic hydrocarbons (PAHs) using EPA Method SW-846 8270C.<sup>173,174</sup> From these analyses, I determined gasoline-range (GRO, C5-C12), dieselrange (DRO, C12-C22), and oil-range (ORO, C22-C40) organics, as well as aliphatic and aromatic fractions.

#### **3.2.4** Preparation of Test Soil with Crude Oil (TSC)

I created three batches of Test Soil with Crude (TSC) by mixing ANS, ARAB, or SJV into the *TS*. In a fume hood, a 15-kg batch of TS (initial moisture <1-2% w/w) was
spiked with a crude oil at 10% w/w. The mixture was vigorously mixed by hand with a trowel until an even consistency was achieved and transferred to clean heat-resistant (up to 60°C) to 57-L polypropylene containers. The containers were placed on a heated platform to raise the soil temperature to ~40-50°C and kept at this temperature for up to 1 week with intermittent trowel mixing to allow off-gassing of volatile components. Then, the soils were lightly sprayed with water and mixed every 2-3 days for a period of 4-6 weeks to stimulate the natural attenuation of the most biodegradable and volatile compounds. The soils for testing are identified as *TSC-ANS*, *TSC-ARAB*, or *TSC-SJV* according to the crude with which they were contaminated. After contamination and artificial weathering, soil was analyzed for TPH.

#### **3.2.5** Moisture Determination

Moisture content was determined before ozonation, to bring samples up to 10 wt% moisture, and after ozonation to make TPH and DOC determination normal to dry mass of soil. Each measurement was an average of 3 independent samples taken from the homogenized soil and weighting exactly 2.00 g each (*Soil Mass<sub>Wet</sub>* (g)). The soil samples were then dried in an oven (105°C) until constant weight was achieved (*Soil Mass<sub>Dry</sub>* (g)). The moisture content (moisture %, w/w) of a soil was determined by difference:

**Moisture** % (w/w) = 
$$\frac{\text{Soil Mass}_{Wet} - \text{Soil Mass}_{Dry}}{\text{Final Mass}_{Wet}} \times 100$$
 Equation 3.1

Untreated *TSC* had a native moisture content of <2% w/w. I increased the soil moisture % to  $\sim10\%$  w/w moisture (confirmed by measurement) to simulate field

conditions for ozonation experiments. After ozonation, moisture % (w/w) was measured determined again.

#### **3.2.6** Preparation of Test Soil with Ozonated Crude Oil (TSOC)

TSC, at a mass of 600-g and 10% w/w moisture, was loaded into the main chamber of the reaction vessel, which was gently tapped to allow the soil to settle to a height of 45 cm. The final volume of the soil was approximately 500 cm<sup>3</sup>, giving estimated density of 1.2 g/cm<sup>3</sup> and pore space of 0.50 based on soil classification. For the 60- and 240-min doses, I interrupted the ozone gas flow every 30 min, removed the soil from the chamber, mixed the soil thoroughly, and returned the soil to the chamber; this method prevented uneven treatment from gas-channeling.<sup>84</sup> A 600-g batch of one of the crude-oil contaminated soils (*TSC-ANS*, *TSC-ARAB*, or *TSC-SJV*) was ozonated at one of three ozone-doses (5 g, 10 g, and 40 g), which corresponded to treatment times of 30, 60, and 240 min at 5 L/min flow rate. A portion of each of the *TSC* soils were reserved as the no-ozone control.

The ozonation apparatus is shown in Figure 3.1. Briefly, O<sub>3</sub> was generated with an Ozonia (Trevose, PA) Triogen LAB2B laboratory ozone generator. The feed gas was ultra-high purity (UHP) oxygen delivered at 5 L/min via a dual-stage pressure regulator. At the maximum power setting and at 5 L/min feed-gas flow rate, the production concentration was 17,000 ppmv O<sub>3</sub>, giving a mass output of approximately 10 g O<sub>3</sub>/h. The O<sub>3</sub>-bearing gas (1.70% O<sub>3</sub>, 98.30% O<sub>2</sub> by volume) was directed through a 500-mL gas-washing bottle to add humidity and then connected to the antechamber of the reaction vessel via the <sup>1</sup>/<sub>4</sub>" threaded glass inlet. A 10-min stabilization period was allowed for the ozone generator before it was connected to the apparatus. After this, the influent ozone was connected to the washing-bottle, which was connected into the antechamber of the reaction vessel. The O<sub>3</sub> gas advected through the course frit diffusion plate in up-flow mode into the chamber containing the soil. Effluent gas was released out of the top of the chamber by the other <sup>1</sup>/<sub>4</sub>" hose connection and directed into desiccation vessel to remove water vapor. The gas leaving the desiccation chamber was directed into a Model 465M Ozone Monitor (Teledyne Advanced Pollution Instrumentation, San Diego, CA). The concentration of O<sub>3</sub> in the effluent was measured every 5 minutes during treatment.



Figure 3.1. Schematic of the experimental set up for soil ozonation directed gas as follows: (A) ultra-high purity (UHP) compressed tank provided O<sub>2</sub> to a (B) dual stage pressure regulator, then to a (C) flowmeter, (D) Ozonia Triogen LAB2B laboratory O<sub>3</sub> generator for low and medium loading experiments, or Ozonia Model CFS-1 2G O<sub>3</sub> generator for high loading experiments, (E) gas-washing bottle containing 500mL of 18MΩ water for humidification, the (F) ¼"-influent connection to reaction vessel antechamber, the (G) ¼"-effluent connection, and (H) Model 465M Ozone Monitor.

#### 3.2.7 Extraction and Quantitation for TPH

Extraction and quantitation of TPH closely followed the methods of Chen et al.<sup>83</sup> Triplicate independent measurements of 2-g soil samples were performed. Each independent measurement was placed in a 40-mL VOA glass vial (Scientific Specialty Services, Hanover, MD), vigorously mixed with 12 g of sodium sulfate, and then transferred to a clean cellulose extraction thimble (Advantec, Ottawa, IL) supported in a 54 mm x 130 mm glass extraction beaker (Gerhardt, Königswinter, Germany). To the glass extraction beaker, I added 130 mL of reagent-grade dichloromethane in a chemical fume hood. The beaker was placed in a Gerhardt automated Soxhlet extraction mechanism (Soxhlet Basic Unit 2-place; Gerhardt, Königswinter, Germany) for 2 cycles. The final extract (<30 mL) was concentrated under a stream of ultra-high purity (UHP) N<sub>2</sub> gas to <2 mL and transferred to a Target<sup>®</sup> 2-mL clear glass GC vial. The volume was then brought back up to exactly 2 mL using clean DCM. The 2-mL extract was measured for TPH by Gas Chromatography-Flame Ionization Detection (GC-FID) according to the methods established by the Method for the Determination of Extractable Petroleum Hydrocarbons (EPH) as established by the Massachusetts Department of Environmental Protection (referred to as the MA EPH Method).<sup>174</sup>

The resulting GC-FID chromatogram demonstrated the classic unresolved complex matrix (UCM) containing aliphatic and aromatic hydrocarbons in approximately the range C9-C40. The instrument's output (area) was converted to concentration using a calibration factor (CF) specific for each compound. For the hydrocarbons, CF differed slightly with carbon content, differences of 5-10% across the carbon range. I chose 15

representative hydrocarbon carbons from C9-C40 to determine the CF for any given carbon range using a standard mix (System Performance Standard of n-alkanes (50  $\mu$ g/mL) in Hexane, provided by AccuStandard<sup>®</sup> (New Haven, CT)). The areas of the 15 individual segments (C9, C10-C12, C13-C14, C15-C16, C17-C18, C19-C20, C21-C22, C23-C24, C25-C26, C27-C28, C29-C30, C31-C32, C33-C34, C35-C40) was converted into a raw concentration using the CF of the respective aliphatic hydrocarbon for each subgroup. The relationship of the calibration factor, response area, and concentration of a compound is:

Raw Concentration <sub>Carbon Subgroup</sub> 
$$\left(\frac{\mu g}{mL}\right) =$$
  
Area Under the Curve <sub>Carbon Subgroup</sub>(dimensionless)}  
Calibration Factor<sub>Representative Hydrocarbon}</sub> Equation 3.2

The raw concentration was converted to a final concentration for each section using the soil moisture content, sample soil mass (g), and final DCM volume (mL). The calibration procedure allowed me to customize the computed carbon range from C<sub>a</sub> to C<sub>b</sub>:

$$Total Petoleum Hydrocarbon_{C_a-C_b} \left(\frac{\mu g}{g} \text{ or } ppm\right) = \sum_{C_a}^{C_b} \frac{\left[Raw \ Concentration_{C_a-C_b} \left(\frac{\mu g}{mL}\right) \times Final \ Volume \ DCM(mL)\right]}{[Soil \ mass \ (g)-(Soil \ Mass(g) \times Moisture \ Fraction)]}$$
Equation 3.3

TPH is reported as the average mass (g) of TPH extractable carbon per mass of dry soil (kg), or g/kg<sub>dry soil</sub>. For total TPH, the carbon range is C9-C40.

#### **3.2.8** Extraction and Quantitation for DOC

Extraction and quantitation of dissolved organic carbon (DOC) followed the methods of Chen et al.<sup>83</sup> Triplicate independent measurements of 2-g soil samples were performed. Each 2-g soil sample was retrieved from a batch of well-mixed control or ozonated soil and placed in a 15-mL centrifuge tube containing exactly 10 mL of 0.5 M K<sub>2</sub>SO<sub>4</sub> aqueous solution. The soil-K<sub>2</sub>SO<sub>4</sub> slurry was vortexed for 45 min at 2000 rpm and centrifuged for 5 min at 10,000 rpm. I withdraw supernatant and filtered exactly 2 mL through a 25-mm acrylic syringe filter with a 0.2-µM pore-size cellulose acetate membrane (VWR<sup>TM</sup>, Radnor, PA) into a 40-mL glass VOA vial (Scientific Specialty Services, Hanover, MD) containing exactly 28 mL of water acidified with H<sub>2</sub>SO<sub>4</sub> to pH 2-3. The final volume of the analyte was 30 mL. The diluted and acidified extract was analyzed for DOC using a Shimadzu TOC analyzer (Shimadzu, Kyoto, Japan). The raw DOC concentration was adjusted for blanks, total sample volume, extract fraction, and soil dry mass of soil as shown in Equation 3.4. Soil DOC is reported as the average mass (g) of water-soluble carbon (C) per mass of dry soil (kg), or g/kgdry soil.

$$Dissolved \ Organic \ Carbon \ \left(\frac{mg}{g}\right)$$
$$= \frac{\left[Raw \ DOC\left(\frac{mg}{L}\right) - Blank_{Average}\left(\frac{mg}{L}\right)\right] \times 0.030L \ analyte}{\frac{1}{5} supernatant \times Dry \ Soil \ Mass \ (g)}$$
Equation 3.4

For comparisons of TPH reduction and DOC production, g TPH was converted to g C by multiplying by 85% (according to the mass percentage of carbon in petroleum hydrocarbons).  $^{8}$ 

#### **3.3 Results and Discussion**

#### 3.3.1 Test Soil (TS) Classification

The particle-size distribution of the sieved soil (Appendix A) revealed that the TS was primarily sand (71.2%) and silt/clay (28.6%). Data from the particle size

distribution, along with LL and PL data (Appendix A), were used to classify the TS as a silty-clayey sand (SC-SM), or a "course-grained soil with fines according to Unified Soil Classification System" (Appendix A)<sup>175</sup>

#### **3.3.2 ICP-MS for Total Metals**

Total metals analysis by ICP-MS showed Table 3.1. Values for a typical topsoil are shown in parentheses.

Table 3.1 Metal elements in a standard	soil (San Joaquin), test soil (TS)
Metal (Typical Quantity)	Test Soil Content (ppm)

Chromium (100 PPM)	17.2
Manganese (600 PPM)	251.0
Iron (38000 PPM)	13138.4
Nickel (50 PPM)	11.0
Copper (30 PPM)	16.5
Zinc (50 PPM)	33.4

#### 3.3.3 **Crude Oil Analyses**

The TPH profiles across the carbon range of the raw crude oils are shown in Figure 3.2. The total TPH values for ANS, ARAB, and SJV oils were 510,000 ppm, 440,000 ppm, 520,000 ppm, respectively. ANS and ARAB were comparatively enriched in the C12 to C26 carbon range. On the other hand, the SJV's carbon range was more uniform, with closer agreement between the carbons from C12 to C36, although the lighter end was slightly higher.



Figure 3.2 TPH (C8-C38) profiles of raw crude oils ANS, ARAB, and SJV before any treatment.

The analyses included gasoline range organics (GRO, C5-C12), diesel range organics (DRO, C12-C22), and oil-range organics (ORO, C22-C40). Those results are shown in Figure 3.3. Although the GRO range was considerably different for SJV, the weathering process likely volatilized the lighter end, and the oil compositions among ANS, ARAB, and SJV were similar in the testing phase. Finally, the analyses distinguished between aliphatic and aromatic hydrocarbons from C10 to C25. Those results, in Figure 3.4, show general agreement of those proportions among the three crude oils.



Figure 3.3. Relative abundance of GRO (C5-C12), DRO (C12-C22), and ORO (C22-C40) for crude oils ANS (API gravity 29-32), ARAB (API gravity 30-32), and SJV (API gravity 13-15).



Figure 3.4. Relative abundances of aliphatic and aromatic hydrocarbons (C10-C35) for crude oils ANS (API gravity 29-32), ARAB (API gravity 30-32), and SJV (API gravity 13-15).

After addition to soil (10% w/w) and artificial weathering, petroleum hydrocarbons C6-C36 were extracted and measured as mg TPH per kg dry soil. These concentrations were 33,400±2,440 ppm (7% CV), 45,400±2,280 ppm (5% CV), and 38,100±1,990 ppm (CV 5%) for ANS, ARAB, and SJV contaminated soil, respectively. The results in Figure 3.5 indicate that, as expected, the C9 hydrocarbons (and presumably lighter hydrocarbons) were volatilized. The C10-C12 range also was reduced substantially for TSC-ARAB and TSC-SJV soils. TSC-ANS soil had a higher relative decrease of C12-C26 hydrocarbons compared to TSC-ARAB and TSC-SJV. The latter soil was relatively unchanged for carbons >C12. For comparisons of raw and weathered crude oil normalized to total TPH see Figure D, APPENDIX.



Figure 3.5 TPH (C9-C36) profiles of weathered crude oils ANS, ARAB, and SJV before ozonation, but after addition to soil

#### 3.3.4 Effluent O<sub>3</sub>

Effluent O<sub>3</sub> was measured every five minutes for each of three contaminated soils—TSC-ANS, TSC-ARAB, TSC-SJV—at each of the three ozone doses (5 g, 10 g, and 40 g). No O<sub>3</sub> was detected (<0.1%) in the effluent in the first 30 minutes for each of the three contaminated soils. From 0 to 60 minutes, TSC-ANS and -ARAB still showed negligible O<sub>3</sub> breakthrough, while TSC-SJV showed a total discharge of 1-2% of applied

O<sub>3</sub>. When O<sub>3</sub> application was extended to 240 minutes (i.e., a 40-g dose), the concentration of O<sub>3</sub> in the effluent continued to rise for TCS-SJV and became detectable for TSC-ANS and -ARAB. The results for this high dose are shown in Figure 3.6. Each line represents an average of the triplicate experiments for each crude. Dips in effluent O<sub>3</sub> occurred at 30-min intervals, when treatment was paused to mix soil. Integrated over time, the losses of O<sub>3</sub> in the effluent account for <1% for TSC-ARAB and TSC-ANS. The losses for TSC-SJV, on the other hand, amounted to a loss of 7% of the total dose O<sub>3</sub> administered. In other words, at the highest dose for SJV contaminated soil, 3 g of O<sub>3</sub> were lost in the effluent for a total absorbed dose of 37 g O<sub>3</sub>. A summary of doses and discharges in the effluent are shown in Table 3.2.



Figure 3.6. Effluent losses of O<sub>3</sub> over time for the 240-min (40-g dose) group. Lines represent the average of triplicate experiments.

Table 3.2. Summary of ozone losses as effluent over time. The most meaningful loss of ozone gas as effluent occurred in the during the 240min ozonation of SJV contaminated soil. Values represent the average of triplicate experiments.

Dose (min)	Ozone Dose (g)	ANS	Arab	SJV
30	5	n/a	n/a	n/a
60	10	n/a	n/a	<1%
240	40	<1%	<1%	7.30%

### 3.3.5 Quantitation of TPH Removal (C9-C36)

The TPH levels of untreated soil (control) and soils treated at 5 g, 10 g, and 40 g O<sub>3</sub> for ANS, Arab, and SJV contaminated soils are summarized in Figure 3.7.



Figure 3.7 Summary TPH removal (C9-C36) for ANS, Arab, and SJV crude oil: control (light green), 5 g O<sub>3</sub> (light blue), 10 g O<sub>3</sub> (yellow), and 40 g O<sub>3</sub> (dark green). \*Soil contaminated with SJV at the highest dose level absorbed only 37g of O<sub>3</sub>, with 3 g O<sub>3</sub> lost in the effluent.

The measurable TPH from C9-C36 is shown in Figure 3.8 for (a) TSC-ANS, (b) TSC-

ARAB, and (c) TSC-SJV. TSC-ARAB tended to have even removals across the carbon

range, but TSC-ANS and TSC-SJV showed a slight tapering at the lighter and heavier ends, with the bulk of treatment happening from C13-C30.



Figure 3.8 (a-c) TPH decreases across the carbon range (C9-C36) for (a) ANS, (b) ARAB, and (c) SJV crude oil: control (light green), 5 g  $O_3$  (light blue), 10 g  $O_3$  (yellow), and 40 g  $O_3$  (dark green).

Table 3.3 summarizes important average values for the 9 experimental conditions

(all run in triplicate). The control values for the mass of quantifiable TPH for the 600 g

soil experiments are listed in the first row, followed by soil loading (g O<sub>3</sub>/kg Soil/h) and

TPH loading (g O<sub>3</sub>/g Initial TPH/h). TPH removal, TPH removal rate, and O<sub>3</sub> utilized

per mass of TPH removed are also listed. O3 utilization per mass of TPH removed

represents the lowest value of g O<sub>3</sub> applied/g TPH removed, which I call the "O<sub>3</sub>

utilization ratio."

Table 3.3. Summary of TPH removal results from 600 g of soil using 5 g, 10 g, or 40g  $O_3$  for 3 distinct crude contaminated soils. Data are average of 9 measurements; boldface is peak  $O_3$  utilization.

Group	Units	ANS	ARAB	SJV
Soil Loading	g Ozone/g Soil/h	0.017	0.017	0.017
TPH Loading	g Ozone/g TPH/h	0.55	0.41	0.49
Control TPH	g TPH (C9-C40)	18	25	21
5 g Ozone	g TPH removed	0.2 (1%)	1 (4%)	0.5 (2%)
1 0g Ozone		2 (11%)	2 (8%)	2 (9%)
40 g Ozone		5 (27%)	6 (23%)	5 (23%)
5 g Ozone	g TPH removed/h	0.4	2.0	0.9
10 g Ozone		2.0	2.1	1.8
40 g Ozone		1.2	1.4	1.2
5 g Ozone	g Ozone/g TPH removed	25.7	5.0	10.9
10 g Ozone		4.9	4.8	5.6
40 g Ozone		8.3	7.1	$7.9^{*}$

<sup>\*</sup>The O<sub>3</sub> utilization (g O<sub>3</sub>/g TPH removed) for the 40g dose of the SJV group is adjusted for the 7.3% loss of O<sub>3</sub> as effluent.

The masses of measurable TPH (C9-C40) before treatment with O<sub>3</sub> were 18 g, 25 g, and 21 g for ANS-, ARAB-, and SJV-contaminated soils (600-g batch), respectively. O<sub>3</sub> gas was administered at 17 g O<sub>3</sub>/kg Soil/h, while loading rate normalized to mass of TPH depended on the differences in initial TPH. Removal rates varied from a minimum of 0.40 g TPH removed/h (TSOC-ANS 5g O<sub>3</sub>) to a maximum of 2.1 g TPH removed/h

(TSOC-ANS 10g O<sub>3</sub> and TSOC-ARAB 10g O<sub>3</sub>). The O<sub>3</sub> utilization ratio is highlighted in **boldface** in Table 3.3, and the minimum values occurred for the 10 g dose for all three crude oils (4.8 - 5.6 g O<sub>3</sub>/g TPH removed), with TCS-ARAB having the lowest ratio of O<sub>3</sub> needed for TPH removed. The largest ratios occurred for the smallest dose (ozonation for 30 minutes), which indicates that the TPH-oxidation process was delayed. The highest O<sub>3</sub> doses (240-minutes of ozonation) also had increased ratios, which suggests that the most readily oxidizable TPH may have been consumed in the first 60 minutes.

#### **3.3.6 Quantitation of DOC**

The DOC levels of untreated soil (control) and soils treated at 5 g, 10 g, and 40 g  $O_3$  for ANS-, ARAB-, and SJV-contaminated soils are summarized in Figure 3.9. Table 3.4 summarizes key findings for DOC production (given in g-C) during ozonation. The measurements of DOC before ozonation, noted in the first row, were 0.14 g, 0.09 g, and 0.15 g for ANS-, ARAB-, and SJV-contaminated soils, respectively. The DOC level of background soil only (*TS*, no crude), measured before and after a 4-h ozonation, were below the detection limit. The production rates of DOC varied from a minimum of 0.2 g DOC produced/h to a maximum of 2.0 g DOC produced/h. Like TPH reduction, DOC production rates plateaued. However, the lowest utilization ratio of O<sub>3</sub> consumed per DOC produced (i.e., the most efficient ratio) was with the 5-g O<sub>3</sub> dose, different than the minimum at a 10-g dose for O<sub>3</sub> consumer per TPH removed.



Figure 3.9 The DOC concentration of soils contaminated with either ANS, Arab, and SJV crude before (Control, No O<sub>3</sub>) and after treatment with O3 gas at either a 5-g, 10-g, or 40-g dose.

Table 3.4 Summary of DOC production results from 600g of soil using 5 g, 10 g, or 40 g  $O_3$  for 3 distinct crude contaminated soils. Data are average of 9 measurements; boldface is peak  $O_3$  utilization.

	Units	ANS	Arab	SJV
Soil Loading	g Ozone/g Soil/h	0.017	0.017	0.017
Initial DOC	g Initial DOC	0.12	0.08	0.13
5 g Ozone	g DOC Produced	0.8 (640%)	1.0 (1300%)	0.9 (700%)
10 g Ozone	(%)	1.3 (1100%)	1.4 (1800%)	1.5 (1100%)
40 g Ozone		2.9 (2300%)	4.1 (5200%)	3.3 (2500%)
5 g Ozone	g DOC Produced/h	1.6	2.0	1.9
10 g Ozone		1.3	1.3	1.3
40 g Ozone		0.2	0.2	0.2
5 g Ozone	g Ozone/g DOC	6.3	5.0	5.4
10 g Ozone	Produced	7.7	6.9	6.6
40 g Ozone		13.8	9.9	11.5

### 3.3.7 Comparison TPH Reduction to DOC Production

Figure 3.10 directly compares the production of DOC (in g C) to the loss TPH (in g C).<sup>y</sup> The ratio of DOC loss to TPH gain (in g DOC/g TPH-C) for ANS, ARAB, and SJV were, respectively: 4.8, 1.2, and 2.4 at the 5-g O<sub>3</sub> dose; 0.7, 0.8, and 1.0 at the 10-g dose; and 0.7, 0.8, and 0.8 at the 40-g dose. At a 5-g O<sub>3</sub> dose, all ratios are > 1 for all three crude oils, reinforcing that a small amount of oxidation was needed to make the partially oxidized TPH soluble.<sup>84</sup> The ratio of DOC gain/TPH loss was < 1 g DOC/g TPH-C at the 10-g and 40-g doses.



Figure 3.10 Comparison of the total mass of DOC produced and TPH lost in 600-g batches of soil. TPH has been normalized to it g C for direct comparison to DOC.

<sup>&</sup>lt;sup>y</sup> I assume that carbon comprises 85% of all TPH measured.<sup>8</sup>

#### 3.3.8 Residual Material for Toxicity Testing

Much of the TPH reductions can be accounted for in the DOC gains. Hence, depending on O<sub>3</sub> dose, between 1% and 27% of the measurable TPH and other organic material was not mineralized, but was transformed into a new organic material. The ozonation of TPH, therefore, leaves two types of residuals: (1) un-oxidized TPH and (2) DOC (the transformed TPH). Figure 3.11 recapitulates the amount of residual (i.e., remaining) material in the soil. The clear trend is a net loss of carbon among all crude oils, suggesting some degree of mineralization. The important result is that soils submitted for toxicity testing will have considerable amounts of carbon from remaining TPH and carbon from DOC production. The toxicity of those combinations will be tested against crude oil alone and background soil for three plant species in Chapter 4.



Figure 3.11 The combined concentration of TPH (C9-C40) and DOC in control and ozonated soils. TPH has been normalized to g C for comparison to DOC.

#### 3.3.9 Soil pH, Moisture, and Salinity

The pH of background soil was  $7.8 \pm 0.25$ . Treatment with O<sub>3</sub> gas created oxidized residuals, many of which are known to be carboxylic acids.<sup>84,120</sup> Thus, the pH of ozonated soil decreased. Table 3.5 shows the pH of crude oil contaminated soil (TSC) and those treated with O<sub>3</sub> gas at the 5-g, 10-g, and 40pg dose levels (TSOC-5g Ozone, TSCOC-10g Ozone, TSCOC-40g Ozone). The addition of crude oil only (TSC) only slightly lowered pH for all the soils (7.42±0.33). O<sub>3</sub> gas, on the other, hand lowered pH in soils, often significantly. The 5-g dose of O<sub>3</sub> lowered the pH to 7.14±0.15, on average, while the 10-g dose yielded 7.02±0.16. The 40-g dose of O<sub>3</sub> created substantially more acidic conditions, with an average pH of 6.07±0.15. The SJV crude oil appeared somewhat less acidified than either the ANS or the ARAB crude oil.

Table 3.5 Soil pH for crude only contaminated soil (TSC) and crude oil+O3 soils (TSOC) at three different dosages among 3 crude oils.

	SJV	ANS	ARAB	Average	St dev.
TSC	7.23	7.15	7.69	7.42	0.33
TSCOC-5g Ozone	7.06	7.02	7.26	7.14	0.15
TSCOC-10g Ozone	6.93	6.94	7.10	7.02	0.16
TSCOC-40g Ozone	6.28	6.15	5.98	6.07	0.15

#### **3.4** Conclusions

This chapter describes the creation and characterization of weathered soils that had been contaminated with three unique crude oil and then dosed with O<sub>3</sub> gas at three levels. The data presented in this chapter do not show great differences in total quantity of oxidized material produced. Furthermore, they do not address whether or not the soils' toxic potentials were affected by the crude oil, the ozone dose, the amount of oxidized material (reported here as DOC), or some combination. I ask in ensuing chapters whether I can detect and quantify the toxicity of oxidized crude oil, whether I can separate that toxicity from that of crude oil alone, whether differences exist for the different crude oils, and whether O<sub>3</sub> dose level change the quantity of oxidized material and the toxic potential of that material. I do this using the techniques of logistic regression in Chapter 4 and Chapter 5.

## 4 RESEARCH: LETTUCE, GRASS, AND RADISH GERMINATION BY SIMPLE LOGISTIC REGRESSION<sup>2</sup>

#### 4.1 Introduction

Much of the research on weathered petroleum toxicity has followed catastrophic releases, such as the Exxon Valdez or Deepwater Horizon.<sup>39,41,149,165,176</sup> Fish are the most frequent target organisms in these studies because fish populations are key economic and ecological indicators of harm when crude oil is released into a marine environment.<sup>41,142,147,165,177</sup> Abundant evidence indicates that exposures to PAHs and petrogenic mixtures alters normal fish development in multiple mechanisms of toxic action, including severe disruptions in cardiac development and, hence, circulatory function that lead to bradycardia, arrythmia and the interdependent responses of pericardial edema, yolk-sac edema, and mortality.<sup>142,147,149,176,178</sup> Terrestrial examination of crude-oil toxicity is less common, but has focused on the response characteristics of plants like lettuce (Lactuca sativa), millet (Panicum miliaceum), radish species (Raphanus), red clover (Trifolium pratense), wheat (Triticum aestivum), corn (Zea mays), soybean (Glycine max), and sunflower (Helianthus), as well as animal models like the earthworm (*Eisenia fetidia*).<sup>91,146,151,153,156,179</sup> Lettuce is especially important because it is sensitive to crude oil and is, therefore, used as an indicator species.<sup>91</sup> TPH pollution in the soil has been shown to inhibit seedling emergence, root/shoot biomass, and chlorophyll content. Yields of cereal crops also have been shown to decrease considerably in the presence of crude oil in oil (>0.2 wt%).<sup>79</sup>

<sup>&</sup>lt;sup>z</sup> This chapter will be combined with the previous chapter into a manuscript for publication.

Oxidation by UV radiation of petrogenic compounds is an important component of natural attenuation of spilled crude oil. Such processes promote oxygenation of the compounds, which can break open otherwise stable ring conformations of saturated and unsaturated ring structures.<sup>64,150,180</sup> As Maki and colleagues have shown, oxidation of biodegraded crude oil by sunlight irradiation decreased the aromatic fraction, with a concomitant increase in asphaltenes and resins, along with an increase in dissolved organic carbon (DOC).<sup>45</sup> The biodegradability of the oil increased with oxygenation. Nevertheless, the chemically transformed water-soluble fraction showed acute toxicity against crustaceans. Similarly, Barron et al. demonstrated photo-enhanced toxicity of weathered Alaska North Slope crude oil (ANS) against the eggs and larvae of Pacific herring (*Clupea pallasi*), as did Incardona *et al.* in a separate study.<sup>48,150</sup>

Attention to the toxicity of oxidized petrogenic compounds also is found in the literature for oil sands process water (OSPW), a type of wastewater produced from the process of hydraulic fracturing (HF), otherwise known as fracking.<sup>181–186</sup> An estimated 3 trillion liters OSPW has resulted from these processes which contain large amounts of salts, mineral particles, metals, radionuclides, and numerous oxidized organic compounds produced in the high-heat/high-pressure operations.<sup>181,182</sup> Particular concerns have been raised about the toxic mixtures of water soluble naphthenic acids (NA) in the process water, thought to be the main toxic factor.<sup>182–185</sup> Analyses by He and colleagues, which separated the organic contaminants from minerals ones, showed that the organic fraction of OSPW significantly increased spinal malformation, pericardial edema, and delayed hatch in exposed zebrafish embryos (*Danio rerio*).<sup>187</sup> The toxicants also altered the

expression of a suite of target genes related to biotransformation, oxidative stress, and endocrine-mediation during development.<sup>187</sup> Acids produced from OSPW include alicyclic, aromatic, or naphthenoaromatic species, all of which have been reported from the oxidation of aromatic compounds.<sup>120,185</sup>

O<sub>3</sub> gas has been proposed as an effective tool to oxygenate and sometimes remove residual petrogenic compounds.<sup>84,188</sup> This is particularly true for OSPW, where ozonation (targeted to remove NAs by 90%) has been shown to decrease toxicity of NAs against fish larvae, as noted by He et al.<sup>181,189,190</sup> Nevertheless, most ozonation schemes against high level (>1%) petroleum contamination cannot meet such exhaustive cleanup goals because of practical and chemical limitations.<sup>120,191</sup> The byproducts are most frequently quinones, aldehydes, ketones, alcohols, and, in the presence of excess O<sub>3</sub>, carboxylic acids. Thus, in an intact crude oil setting, particularly a terrestrial one where only a moderate level of chemical oxidation by O<sub>3</sub> gas can be achieved, the likelihood of creating byproducts that, though more bioavailable, are also more toxic is high. Therefore, studying the effect of ozonation byproducts on plants and animals in a terrestrial setting is an essential step before ozonation can be recommended as an environmental-remediation tool.

To my knowledge, the effects of ozonated crude oil on plants have not been studied. Moreover, no study has evaluated the effect of three different crude oils simultaneously, nor has any looked at dose effects. Here, I present the result of germination studies of radish (*Raphenus sativus*), grass (*Lagurus ovatus*), and lettuce (*Lactuca sativa*) in 3 crude oils that had been treated at 3 doses of ozone gas that achieved the following final molar ratios<sup>aa</sup>:

- 1.6, 1.2, and 1.4 mol  $O_3$ /mol TPH at the low dose (5 g  $O_3$ )
- $3.3, 2.4, and 2.8 \mod O_3/mol TPH$  at the medium dose (10 g O<sub>3</sub>)
- 13, 9.5, and 11.3 mol O<sub>3</sub>/mol TPH at the high dose (40 g O<sub>3</sub>)

This study distinguishes whether or not an indicator species can show a doseresponse effect to the oxidized residuals of crude oil. I chose radish because of its quick germination and prolific output in good soil conditions, grass as a hardy species, and lettuce because it is an indicator species that shows a statistically sensitive response to petroleum contamination.

### 4.2 Laboratory Methods

#### 4.2.1 Ozonation of Soils

Chapter 4 describes the methods used to ozonate 600-g batches of soil from 3 distinct crude oils. Briefly, three raw crude oils were obtained from the Chevron Energy Technology Company (ETC): ANS (API gravity 29-32), ARAB (API gravity 30-32), and SJV (API gravity 13-15). Each crude oil was analyzed for gasoline-range (GRO, C5-C12), diesel-range (DRO, C12-C22), and oil-range (ORO, C22-C40) organics, as well as aliphatic and aromatic fractions. A locally sourced topsoil with extremely low organic matter (OM, <2%) content was spiked with each of the three crudes at 10% w/w concentration and attenuated for labile compounds under laboratory conditions. The soils were then ozonated with 5 g, 10 g, and 40 g O<sub>3</sub>, with continuous monitoring of effluent

<sup>&</sup>lt;sup>aa</sup> The differences are based on starting TPH concentrations for ANS, ARAB, and SJV crude oils discussed in Chapter 6.

(unreacted) ozone gas. The control soil and O<sub>3</sub> treated soil were then evaluated for total petroleum hydrocarbon (TPH), dissolved organic carbon (DOC), and pH. The soils were then prepared as described below for toxicity testing. Details of the methods are in Chapter 3.

Each crude oil was used for 5 treatment conditions:

- 1. untreated Arizona background soil (test soil, TS)
- soil contaminated with crude oil and synthetically weathered (test soil with crude, TSC)
- soil contaminated with synthetically weathered crude oil and then treated with 5 g of O<sub>3</sub> gas (test soil with oxidized crude, TSOC-5g)
- soil contaminated with synthetically weathered crude oil and then treated with 10 g of O<sub>3</sub> gas (test soil with oxidized crude, TSOC-10g)
- 5. soil contaminated with synthetically weathered crude oil and then treated with 40 g of O<sub>3</sub> gas (test soil with oxidized crude, TSOC-40g)

#### 4.2.2 Water Holding Capacity (WHC)

The water holding capacity (WHC) is the weight percent (w/w) of water that can be stored in a volume of soil. To determine WHC, I saturated 50 g of soil (control, petroleum, and petroleum + ozone) with water and allowed it to drain for one hour. After the excess water had drained from the soil, I measured the weight of the saturated soil to yield "Soil Mass<sub>Saturated</sub>" (g). The soil was then dried in an oven (105°C) until constant weight was achieved, and the weight was taken as "Soil Mass<sub>Dry</sub>" (g). The w/w percent water held by the soil was determined as the difference in saturated weight and the dry weight over saturated weight (multiplied by 100) as follows:

$$WHC = \frac{Soil Mass_{Saturared} - Soil Mass_{Dry}}{Final Mass_{Saturated}} \times 100 \qquad Equation 4.1$$

All soils were tested for moisture content after ozonation and before the germination studies as described in Section 3.2.5. Depending on moisture content of soils after the ozonation process, between 25 and 100 mL of water was used to bring soils to the 10 w/w (or 50% of total water holding capacity).

#### 4.2.3 pH Adjustment

The pH was measured in 1:2 (w/w) soil/water mixture with a Thermo Scientific Orion 2 Star pH probe (Thermo Fisher Scientific Inc.) and results are described in 3.3.9. Soils in the high-dose group were brought to circumneutral pH with the exceedingly small additions of 50% sodium hydroxide diluted in water (25-50  $\mu$ L/kg of acidified soil) used to increase hydration. The volumes of NaOH needed (10-50  $\mu$ L for adjustments of 600-g of soil) did not significantly alter soil conductivity, which remained at 2-4 ds/m.

#### 4.2.4 The Dilution Series, Planted Tray, and Crude-Seed Set

In order to determine the effects of background organic content, test soils were subject to a dilution series using Nature's Care Organic & Natural Potting Mix (Marysville, OH), formulated from 50-60% sphagnum peat moss, processed forest products, coir, perlite, and yucca. The organic matter content was  $75.5 \pm 2.9\%$  w/w as determined by the loss-on-ignition method (360°C) at University of Connecticut Soil Nutrient Analysis Laboratory (Storrs, CT). It is important to underscore that, with regard to the TSOC group, treatment with O<sub>3</sub> gas preceded dilution with organic background material. This avoided

the large  $O_3$  demand from the organic background, which would have obscured the  $O_3$  dose utilization of the weathered crude oil.<sup>192–194</sup>

The basic experimental unit was a  $140 \times 140 \times 22$ -mm plastic tray (VWR Catalog No. 10770-450) containing 100 g of soil at 70% WHC and planted with 10 seeds, each at a depth of ~2.5-times seed diameter, as recommended by ASTM E1963 – 09.<sup>195</sup> The first planting condition was the full-strength test soil, after which a dilution series was created Like *TS*, *TSC*, and *TSOC*, the potting mix was also moistened to 70% WHC. The dilution series was comprised of 6 trays: The first condition was 0% potting mix (by mass), then 10%, 40%, 80%, 90%, and finally, 100% potting mix (by mass), as shown in Figure 4.1. Because the organic content of the base test soil was 0.5 ± 0.05% w/w, the background organic (*b-ORGANIC*) content was ascribed to the amount added by the potting mix. For the dilution series, *b-ORGANIC* increased with addition of more potting mix, and, thus, germination was expected to increase from left to right in Figure 4.1.



Figure 4.1 Dilution series for a given test condition.

A set of 6 trays in each dilution series were placed together in a larger 28-quart plastic bin. The bottom of the plastic bin was lined with ½-in depth of peat moss moistened to 50% w/w water, and the top of the bin was covered with a transparent plastic film,

punctured to allow air exchange. The slow release of moisture from the peat moss and the plastic wrap served to keep ambient growth conditions at  $\geq$ 80% humidity in accordance with ASTM E1963 – 09.<sup>195</sup> The tray containing 100 g potting mix served as the "bin control" used to determine whether differences in light, temperature, and ambient moisture affected germination between sets of seedlings.

A 6-tray dilution series was created for each of the five experimental categories: TS (control test soil with no crude oil and no ozone), TSC (test soil contaminated with untreated crude oil), and TSOC (test soil contaminated with crude oil and then ozonated). The TSOC group can be further divided into three subgroups based on ozone dose: TSOC-5g, TSOC-10g and TSOC-40g of ozone. Together, the five experimental categories and six trays in each dilution series gave 30 planted trays for each CRUDE OIL—SEED combination, as shown in Figure 4.2. Each CRUDE OIL—SEED set was performed in duplicate, which totaled 60 trays. The trays were placed in a rooftop greenhouse for germination and maintained at 25°C throughout that period. The germination period was set to 14 days, as recommended in ASTM E1963 – 09.<sup>195</sup> Emergent seedlings were counted at 3, 7, 10, and 14 days. After the 14-day period, seedlings were counted and harvested at the base of the hypocotyl, the part of the stem of an embryo plant beneath the stalks of the seed leaves, and directly above the root.



Figure 4.2 Matrix of mixtures of the potting soil and the amounts of each of the test soils.

A complete CRUDE OIL—SEED set was placed in a rooftop greenhouse for germination. Due to limited greenhouse space, one CRUDE OIL—SEED set (60 trays) could be germinated in a given two-week interval. Seeds were germinated between the months of October and February in the following order: ARAB-RADISH, ARAB-LETTUCE, ARAB-GRASS, ANS-RADISH, ANS-LETTUCE, ANS-GRASS, SJV-RADISH, SJV-LETTUCE, SJV-GRASS. In total, this study evaluated 540 trays and counted 5400 seedlings (6 dilutions  $\times$  5 groups  $\times$  2 duplicates  $\times$  3 seeds  $\times$  3 crudes x10 seeds). Figure 4.3provides a schematic representation of the test categories and the trays.



Figure 4.3 Schematic of the study design; the 270 trays above were performed in duplicate for 540 trays total, and 5400 seeds planted.

#### 4.3 **Results and Discussion**

#### 4.3.1 Water Holding Capacity (WHC)

The 100% WHC values for each of the types of soil are shown in the top row of Table 4.1 as w/w of dry soil. Crude oil contamination increased the total WHC of soils from 17% w/w to approximately 20% w/ for all crude oils. While some test protocols suggest the use of >80% WHC (i.e., 16% w/w soil) for seed planting, the nearly 30% silt/clay content of ASM soils changes soil plasticity at that WHC. Saturation tests showed that soil retained an arable, loamy texture at approximately 70% of the total WHC for all soils (contaminated and clean). This point was 12% w/w moisture for the clean background soil and 14% w/w moisture for crude contaminated soils and. Soils treated with crude oil and ozone gas were kept at the at 14% w/w, the same as the crude-oil-only group.

Soil Type	Background	ANS	Arab	SJV
100% WHC (w/w)	17%	20%	20%	21%
Ozonation WHC (w/w)	n/a	10%	10%	10%
Ozonation WHC (as % of Total WHC)	n/a	50%	50%	50%
Planting WHC (w/w)	12%	14%	13%	14%
Planting WHC (as % of Total WHC)	70%	70%	68%	68%

Table 4.1 Water holding capacity measurements for soils under study.

#### **4.3.2** Evaluation of the Bin Control for Climate Conditions

The temperature of the greenhouse was maintained by an external system at 25°C throughout that period. The climate and lower latitude of Arizona meant that sunlight was consistent and strong—daylight hours in that period ranged from 10-12 hours (10 h 35 min on average, +/- 32 min). Examination of the 100% potting soil group for each seed (i.e., bin controls) between October and February did not show significant germination differences, demonstrating that the climate conditions were equivalent among germination sequences.

#### **4.3.3** Effects of Treatment Type on Germination

Table C.1 in Appendix C summarizes the statistical differences among treatment groups (TS, TSC, and TSOC) for all crude oils grouped together then evaluated by seed type. Tables C.2-C.4 Appendix C summarize the statistical differences between (i.e., raw) crude oil (TSC) and ozonated crude oil (TSOC) by crude oil type and seed type. Finally, Appendix C, Table C.5 shows differences between dose levels (TSOC-5 g, TSOC-10 g, and TSOC-40 g) for all ozonated soils differentiated by crude oil type and seed type for ozonated soils.

The "treatment" analysis compares the three broadest categories studies for each individual seed (n = 1800 seeds): TS (n = 360 seeds), TSC (n = 360 seeds), and TSOC (n = 1080 seeds). In this analysis, the ozonation levels (5 g, 10 g, and 40 g) were combined as a single category. Figure 4.4a shows that "treatment" was a predictor of radish germination. Radish in control soil (TS) was 1.6 times more likely to germinate than in soil with crude oil (TSC) (p = 0.01). When radish was germinated in the presence of ozonated crude oil (TSOC), the decrease is germination was statistically significant compared to TS (p = 0.00) and TSC (p = 0.00). The odds of radish germination in the presence of untreated crude oil were nearly 3 times the odds when the same crude was ozonated. The odds of germination in clean background soil were nearly 5 times higher than the odds of germination in the presence of ozonated crude oil.



Figure 4.4 Germination of proportions between treatment groups for Radish, Lettuce, and Grass. Statistical differences from TS are noted with an asterisk (\*) at p=0.05.

When comparing the treatment groups in lettuce (Figure 4.4b), the presence of untreated crude oil decreased the probability of lettuce germination by approximately 20% (p = 0.000). The level did not change when crude oil was ozonated, with TSOC showing a slightly lower, though not statistically different, germination rate than TSC. The odds for lettuce germination in uncontaminated TS was 2.3 times the odds with crude-oil-contaminated soil (p = 0.00, not shown in table) and 2.6 times the odds in soil with oxidized crude (p = 0.00). For grass, Figure 4.4c, the differences between the treatment groups were not statistically significant, although germination was low in all cases.

Radish and lettuce showed statistically significant sensitivity to the presence of crude oil in soil. In both cases, ozonation of petroleum did not attenuate the effects of the crude oil, and, in the case of radish, ozonation decreased germination probability by a significant level. These results show that transforming crude oil into an oxidized intermediate with no additional treatment (e.g., biodegradation) did not attenuate in the toxicity of crude in the short-term, but in fact further decreased germination probability for radish.

# 4.3.4 Effects of Crude Oil Type on Germination (Both Untreated Crude and Ozonated Crude)

Figure 4.5 shows germination for TS compared to the set of untreated crude oils TSC-ANS, TSC-ARAB, and TSC-SJV, as well as the set of oxidized crudes TSOC-ANS, TSOC-ARAB, and TSOC-SJV for Radish. Although the combined set of TSC

germination showed a significant decline as compared to TS, the shift was largely driven by the decrease in radish germination in TSC-SJV (heavy) crude. Taken individually, the TSC-ANS and TSC-ARAB crudes did not show statistically significant differences from TS soil, and, in fact, TSC-ARAB had a slight upward trend. The oxidized counterparts, however, showed statistically significant differences from TS (83%), germinating at 54%, 54%, and 45% for TSOC-ANS, TSOC-ARAB, and TSOC-SJV, respectively.

Each oxidized crude oil also was statistically different from its untreated counterpart for radish, as shown in

Figure 4.6. The ORs of TSC/TSOC were 3.1, 4.6, and 2.1 for pairs of ANS, ARAB, and SJV analyses, respectively. The relative drop in germination from TSC to TSOC were 24%, 30%, and 18% for ANS, ARAB, and SJV crude, respectively. It is also worth noting that TSOC-ANS and TSOC-ARAB also were statistically more likely to germinate than TSOC-SJV (OR = 1.4 and p = 0.026 for both). These results indicate that crude identity made a difference in reaction to the oxidized crude. The general trends, however, remained similar. Radish planted in crude-oil-contaminated soil had less germination when the crude-oil- was ozonated.



Figure 4.5 Effects of crude oil type on Radish Germination. Statistical differences from TS are noted with an asterisk (\*) at p = 0.05.



Figure 4.6 Crude/Oxidized Crude comparisons for Radish germination. Statistically significant ORs (TSC/TSOC) noted with an asterisk (\*) at p = 0.05.
Analysis according to crude oil did not reveal important differences between untreated and ozonated crude oils for lettuce, as shown in

Figure 4.7 and Figure 4.8, and summarized Table G.2 in Appendix C.

Figure 4.7 shows TS compared to the set of untreated crudes TSC-ANS, TSC-ARAB, and TSC-SJV, as well as the set of oxidized crudes TSOC-ANS, TSOC-ARAB, and TSOC-SJV for lettuce. All crude conditions, whether untreated or oxidized, showed a statistically significant decrease in germination, compared to TS. Like radish, lettuce germination appeared to be lower in the heaviest TCS-SJV, but not a difference of significance as compared to either TCS-ANS or TCS-ARAB (p = 0.09 and p = 0.24, respectively). Oxidized SJV (TSOC-SJV), on the other hand, was statistically worse than either TSOC-ANS or TSOC-ARAB (p = 0.01 and p = 0.00, respectively). Figure 4.8 (a-c) shows the comparison between the untreated and oxidized counterparts for each crude. No pair shows statistically significant differences. In other words, the presence of any of the three crude oils decreased lettuce germination, but ozonation did not attenuate the decrease in germination for any crude oil.



Figure 4.7 Effects of crude oil type on Lettuce Germination. Statistical differences from TS are noted with an asterisk (\*) at p = 0.05.



Figure 4.8 Crude/Oxidized Crude comparisons for Lettuce germination. No OR (TSC/TSOC) reaches statistical significance.

Analysis by crude oil reveals that grass germination was worse in TSC-ANS and TSOC-ANS, compared to background TS, as shown in Figure 4.9 and Table G.3 in Appendix C. No other crude-oil condition showed a statistical difference from TS. Figure 4.10 (a-c) shows the comparison between the untreated and oxidized counterparts for each crude oil. The only pair in which a difference existed was ANS (OR = 0.44, p = 0.01), and this was the only instance in which oxidation statistically improved germination for a seed under study. Grass was less than half as likely to germinate in ANS (TSC-ANS) contaminated soil than when some of that crude was oxidized (TSOC-ANS).



Figure 4.9 Effects of crude oil type on grass germination. Statistical differences from TS are noted with an asterisk (\*) at p = 0.05.



Figure 4.10 Crude/Oxidized Crude comparisons for Grass germination. Statistically significant ORs (TSC/TSOC) noted with an asterisk (\*) at p = 0.05.

# 4.3.5 Effects of Dose on Germination

I showed that radish germination was statistically decreased when any of the three crude oils was ozonated. However, lettuce germination was not more affected by oxidized crude, while grass germination was largely unaffected by either crude or oxidized crude oil (except for the case of ANS). Because crude oil differences largely trended together, I combined crude oils to check for differences among ozone doses. The results are shown in Figure 4.11 and Table H in **Error! Reference source not found.** 

Figure 4.11a showed a downward trend for Radish germination as ozone dose increased from 5 g to 40 g of ozone. The difference between the 5-g dose and the 40-g dose was significance (p = 0.01). On the other hand, Lettuce germination at the 10-g showed a statistical improvement over the 5 g dose (p = 0.00, not shown in table) and the 40-g dose (p = 0.03). Grass germination showed no meaningful differences among dose groups.



Figure 4.11 Oxidized crude oil comparisons about dose. Statistical differences from the 40-g O<sub>3</sub> dose are denoted with an asterisk (\*) at p = 0.05.

## 4.4 Conclusions

This is one of the few studies to look at the terrestrial toxicity of oxidized petroleum crude residuals in plants. To my knowledge, it is the only study to compare multiple crude oils simultaneously and the only study to look at oxidized crude oil residuals by dose. I describe a few key findings:

- Treatment Effects: Radish germination was slightly reduced by the presence of petroleum crude, and that effect was greatly enhanced when the crude was ozonated. Lettuce germination was greatly reduced by the presence of petroleum crude, but effect was unchanged when the crude was ozonated. Grass germination was unchanged by the presence of petroleum crude, a finding that was unchanged when the crude was ozonated.
- 2. Crude Oil Effects: Separating treatment effect by crude oil type did not show substantial changes in the treatment effects noted above. The only exception was

the grass species, that showed statistically improved germination in ANS crude after ozonation. This was the only instance where ozonation improved germination outcome.

- 3. Dose effects: Radish germination was reduced when crude oil was oxidized with 10 g ozone and significantly reduced when the crude oil was oxidized with 40 g ozone, both compared to the 5-g dose. Lettuce germination was significantly improved when crude was oxidized with 10-g ozone, compared to the 5-g and 40-g doses. Grass germination was unchanged by any of the 3 ozone doses.
- 4. Radish appears to be an important indicator of oxidized crude oil residuals. Radish germination showed a significant decrease in the presence of untreated SJV heavy crude, although the response to untreated crude-oil contamination was not seen with ARAB or ANS crude oils. For all crude oils, the decrease in germination of Radish was amplified by increasing ozonation. This ozone-doseresponse effect of Radish should be useful to quantitatively track the response of radish germination to increasing oxidized byproducts, measured as DOC.

In Chapter 5, I use multiple logistic regression to create a multivariable model of radish germination as function of TPH, DOC, crude oil type, and organic background.

# 5 RESEARCH: USING RADISH (*RAPHANUS LATIVUS* L.) GERMINATION TO ESTABLISH A BENCHMARK DOSE FOR THE TOXICITY OF OZONATED-PETROLEUM BYPRODUCTS IN SOIL

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## 5.1 Introduction

The accidental release of petroleum into the environment is an inevitable outcome of a global supply chain that moves up to 100 mbd.<sup>4</sup> Such releases, whether on land or sea, are attenuated and transformed by microbial biodegradation, photooxidation, hydrolysis, and evaporation, as well as dispersive and diluting processes of dissolution, spreading, and emulsification.<sup>36,38</sup> Taken together, these collective "weathering" processes enrich recalcitrant components that often are among the most toxic and, via photo-modification, generate oxidized intermediates which have demonstrable acute toxicity to a variety of species.<sup>39–42</sup> Oxidation of petrogenic compounds by UV radiation is an important component of natural weathering of spilled crude oil. It promotes oxygenation that can break open otherwise stable saturated- and unsaturated-ring structures.<sup>64,150,180</sup> Oxidation of weathered crude oil by sunlight decreases the aromatic fraction, with a concomitant increase in asphaltenes and resins, and an increase in dissolved organic carbon (DOC).<sup>45</sup> The increase in aqueous solubility of the oil thereby increases its biodegradability. The naturally oxidized residuals of crude oil, however, have shown acute ecological toxicity in several settings. Residual DOC has demonstrable toxicity to crustaceans, while the photo-enhanced toxicity of weathered Alaska North Slope crude oil has been proven against the eggs and larvae of Pacific herring (*Clupea pallasi*).<sup>45,48,150</sup> Toxicity of oxidized petrogenic compounds is also found in the literature for oil-sands water produced by hydraulic fracturing (or fracking), with particular concerns about the toxic mixtures of water-soluble naphthenic acids in the process water.<sup>181–186</sup> The organic fraction of oil-sands water significantly increased spinal malformation, pericardial edema, and delayed hatch in exposed zebrafish embryos (*Danio rerio*).<sup>187</sup> The toxicants also altered the expression of a suite of genes related to biotransformation, oxidative stress, and endocrine-mediation during development.<sup>187</sup> Acids produced by fracking include alicyclic, aromatic, and naphthenoaromatic compounds.<sup>120,185</sup>

Ozone (O<sub>3</sub>) gas has been proposed as an effective tool to oxygenate and remove residual petrogenic compounds.<sup>84,188</sup> However, most ozonation schemes against highlevel (>1% w/w) petroleum contamination cannot meet exhaustive cleanup goals because of practical, chemical, and economic limitations. For direct O<sub>3</sub> attack, the O<sub>3</sub>/hydrocarbon mole ratio has been set at 1-to-3, not nearly enough for complete chemical degradation by O<sub>3</sub>.<sup>120</sup> The products are most frequently quinones, aldehydes, ketones, alcohols, and, in the presence of excess O<sub>3</sub>, carboxylic acids.<sup>83,84,98,101,120</sup> Hence, questions arise as to whether the byproducts of ozonation may demonstrate ecological toxicity as has been observed for the oxidized residuals of UV radiation or those resulting from fracking. Luster-Teasley *et al.* performed one of the few dose-response studies on the toxicity of ozonation byproducts of a petrogenic compound using chrysene.<sup>139</sup> They found that, at the lowest dose (1.75 mol O<sub>3</sub>/mol chrysene), ozonation byproducts of chrysene inhibited *in vitro* gap junctional intercellular communication (GJIC) more than chrysene itself. Only when O<sub>3</sub> was extensively deployed ( $\geq$  3 mol O<sub>3</sub>/mol chrysene) did ozonation attenuate the toxicity of chrysene on GJIC. These results indicate that, in a terrestrial setting involving released crude oil where only limited oxidation by O<sub>3</sub> gas can be achieved, the likelihood of creating products that are more toxic than the original contaminants is high. Therefore, studying and understanding the adverse effects of ozonation products of petrogenic compounds on plants and animals in a terrestrial setting is essential before selecting ozonation as a remedial technology for crude oil contamination. Evaluating the differences in toxicity at the dose level is also a salient concern.

Ecological risk assessment is a flexible approach to evaluating data, assumptions, and uncertainties about the likelihood of adverse ecological outcomes of human-related activities or contaminants. Ecological risk assessments often characterize concentration–response (i.e., dose–response relationships) and reference doses, such as the lowest-observed-adverse-effect-level (LOAEL) or the no-observed-adverse-effect-level (NOAEL).<sup>196–198</sup> The LOAEL is the lowest dose at which adverse effects can be detected, while the NOAEL is the highest dose at which no adverse effects can be detected. NOAELs and LOAELs are used to determine a point-of-departure from baseline effects to observable adverse outcomes based on available data.<sup>199,200</sup> In contrast, analysis of a

benchmark dose (BMD) can resolve the entire dose–response curve over all available treatment groups.<sup>200</sup> BMD analysis is essentially a "curve-fitting exercise" using a variety of mathematical techniques to find the best-fitting curve to describe the concentration-response relationship in the dataset. Once an appropriate model is identified, the curve can be used to extrapolate a specific effect level (e.g., 10% extra risk in adverse outcomes, described below), called the benchmark response, within the range that the model can statistically predict. The BMD approach is generally used for human-health risk assessments, but it is increasingly used in ecological risk assessments.

In this study, I determined the concentration-response relationship between the adverse germination of radish (*Raphanus. lativus* L.) (i.e., no germination) and oxidized petroleum in soil. I used multiple multivariable logistic regression to perform a BMD analysis of the outcome of adverse radish germination as a function of the continuous variables DOC concentration (*DOC*) and total petroleum hydrocarbon (*TPH*) concentration, along with categorical variables treatment (*TREATMENT*) and background organic (*b-ORGANIC*). Radish was chosen because of its relatively fast and robust germination in good soil conditions, sensitivity to contamination, and bioaccumulating attributes.<sup>30-40</sup> Radish has shown sensitivity to organochlorine insecticides (e.g., hexachlorocyclohexane) and accumulation of a wide range of anthropogenic contaminants including pesticides like diazinon, selenium, boron, bioavailable arsenic and antimony, cadmium, molybdenum, uranium (depending on pH conditions), veterinary antibiotics (e.g., chlortetracycline, enrofloxacin, and sulphathiazole), nanoparticles, and the antimicrobial agents triclosan and triclocarban.<sup>90,201–206</sup> While

radish has not been found sensitive to soil contaminated with a high concentration of motor oil (24,000 ppm), some studies have shown that radish accumulates polyaromatic hydrocarbons (PAHs), especially 2- and 3-ring PAHs.<sup>207,208</sup>

## 5.2 Materials and Methods

## 5.2.1 Crude Oil and TPH Analyses

Chevron Technical Center (a Chevron U.S.A. Inc. division, Richmond, CA) provided a crude oil known as Alaska North Slope (ANS) having an API gravity of 29-32° and classified as a medium crude oil. Methodology and results for examination of crude oils are listed in 3.2.3 and 3.3.3, respectively.

## 5.2.2 Characterization of Test Soil (TS)

The base Test Soil (*TS*) used in all experiments was a locally sourced topsoil (All Star Materials, Guadalupe, AZ). Soil preparation and analysis are listed in 3.2.1 and 3.3.1, respectively.

### 5.2.3 Preparation of Test Soil with Crude Oil (TSC)

Preparation of test soil with crude (TSC) are listed in 3.2.4.

## 5.2.4 Preparation of Test Soil with Ozonated Crude Oil (TSOC)

A schematic of the experimental system used for ozonation of soil in this study is shown in Figure 3.1. Ozonation followed the procedure described in 3.2.6.

#### 5.2.5 Determination of TPH, DOC, Moisture, pH, and Water-Holding Capacity

The methods for TPH and DOC determination are listed in detail in 3.2.5 and

3.2.7, while water-holding capacity and pH adjustment are noted in 4.2.2 and 4.2.3, respectively.

## **5.2.6** The Planted Tray and the ORGANIC Series

The methods for the planted tray and the ORGANIC series are noted in 4.2.4 and the figures therein.

## 5.2.7 The Independent Covariates

I used the multiple logistic regression model to investigate the effects of 4 independent covariates on the probability of adverse effects on radish germination (i.e., no germination): TPH concentration (ppm) by carbon (*TPHc*), DOC concentration (ppm) (*DOC*), the effect of treatment level (categorical at 5 levels) (*TREATMENT*), and background organic content (*b-ORGANIC*). For comparisons of TPH reduction and DOC production, g TPH was converted to g C by multiplying by 85% (according to the approximate mass percentage of C in petroleum hydrocarbons). I used Stata v. 16.1 (College Station, Texas) to find the values for the log-likelihood  $L(\beta')$  and the estimated coefficients  $\hat{\beta}'$ . The software provides estimates for the standard errors ( $\hat{SE}$ ) of each coefficient in the model from the matrix of the second partial derivative of the log-likelihood function as well as their respective 95% confidence intervals. Appendix D provides a detailed explanation of the foundation of the simple logistic regression model, the log-likelihood  $L(\beta')$ , and the formulas used to build a logistic regression model.

#### 5.2.8 Purposeful Selection of Covariates

Appendix D details tables and figures of this section. I treated the germination of each planted seed as an independent observation. *TPHc* and *DOC* are continuous variables, while *TREATMENT* and *b-ORGANIC* are polychotomous independent

variables scaled with k > 2 possible levels. The method to evaluate such category levels in the logistic regression model is to transform k levels into a set of k - 1 design variables. Table J.1 (in *Step 0. The independent covariates* in SI) demonstrates the use of reference cell coding for these variables with further discussion. *TS* served as the control and was the reference cell against which all other levels were compared for the variable *TREATMENT* (k = 5; k - 1 = 4). The 100% *b-ORGANIC* level (0 g test soil, 100 g potting mix) was the reference cell against which all other levels were compared for the parameter *b-ORGANIC* (k = 6; k - 1 = 5). The variables and their levels are listed in Table J.2. The equations of the line for each of the individual variables tested are listed in Table J.3.

The logistic regression model was built using the method of "Purposeful Selection of Covariates," as described in Hosmer et al.<sup>209</sup> The first step was to evaluate the importance of each independent variable individually for predicting the germination outcome of radish in a univariable logistic regression model; from this, I obtained estimated coefficients ( $\hat{\beta}$ ), estimated standard errors, and the likelihood ratio test for significance of the coefficient (*G statistic*, Equation I.11). Results of Step 1 are listed in Table J.4. The likelihood-ratio statistic (*G*) followed a chi-squared distribution (df = 1for the continuous variables *TPHc* and DOC, df = 4 for the *TREATMENT*, and df = 5for *b-ORGANIC*). Each of the covariates were statistically significant (p < 0.000) and were included in Step 2.

In step 2, the multivariable model simultaneously fit all independent variables that had significance in Step 1. The importance of each covariate was assessed using the *p*-

value of the Wald Statistic (Equation I.12). The multivariable model simultaneously fit all independent variables and the results, in Table J.5, show that continuous variables *TPHc* and *DOC* had statistically significant positive coefficients, meaning that an increase in the value of either variable increased the likelihood of the outcome (adverse germination), though to differing degrees, as shown by the magnitude of the coefficients (0.00689 for *TPHc* and 1.99 for *DOC*). For the continuous variables, only *DOC* added significant predictive power to the model (p < 0.000), and *TPHc* was a candidate for exclusion (p = 0.784). For the categorical variables, only the 40-g level of the variable *TREATMENT* was statistically different from the base level. Similarly, the *b-ORGANIC* category was of statistical value when greater than 10% by mass, as compared to the base level.

In step 3, I tested for modifiers (or confounders), a step especially important in this analysis because of the interdependent relationships of soil components.<sup>67,210,211</sup> The equation for delta-beta-hat-percent (Equation I.13) identifies variables that change the magnitude of coefficients of other covariates in the model by more than 20% (our criterion level). The results are listed in Table J.6 (a, b). *TPHc* was a modifier of the *TSC* level of the *TREATMENT* categorical variable and 80% *b-ORGANIC* level. Similarly, *TREATMENT* was a strong modifier of *TPHc* and *DOC*, as well as a modifier of soil *b-ORGANIC* at 40% and 80% levels. Finally, the *b-ORGANIC* covariate was a modifier of *TPHc* and all *TREATMENT* levels. The predictive importance of *DOC* to radish germination is clear. Since *TREATMENT* is a modifier of *DOC*, I kept that variable in the model. As *TPHc* was a modifier of *TREATMENT*, that variable also was held in the

model. Similarly, *b-ORGANIC* was a strong modifier of *TREATMENT* at all levels and, therefore, retained.

In step 4, I considered the statistical value of the levels of categorical variables. Compared to the base (100% *b-ORGANIC*), only 0% and 10% *b-ORGANIC* levels presented statistically different conditions based on the Wald p-values (0.000 and 0.0710). That is, all other model inputs being the same, the germination conditions of 0% and 10% organic background were inherently worse. Thus, I condensed the 6-level *b-ORGANIC* covariate to a binary (dichotomous) covariate. Coded at 2 levels, the dichotomous variable was coded as k = 1 for conditions when *b-ORGANIC*>10% and k = 0 for conditions when *b-ORGANIC*<10%. The new dichotomous covariate was called *b-ORGANIC\_2* (coefficients in Table J.7).

The change in covariate levels of *b*-ORGANIC to *b*-ORGANIC\_2 reduced the difference between *TS* and *TSC* dose levels, as evident in the Wald Statistic (p = 0.747). Therefore, I also condensed levels of *TS* and *TSC* to one unified code (TS/TSC) but kept the identification of dose levels TSOC-5 g, TSOC-10 g, and TSOC-40 g of O<sub>3</sub> separate to preserve resolution. The new variable is called *TREATMENT\_2* (coefficients in Table J.8) and coded at 4 levels (TS/TSC, TSOC-5 g, TSOC-10 g, TSOC-40 g). All parameters (*TPHc*, *DOC*, *TREATMENT\_2*, and *b*-ORGANIC\_2) were run through the previous three steps (Table J.9). The covariate *TPHc* was again, a candidate for exclusion (Wald p-value 0.620). However, this time *TPHc* was not found to be a modifier of the condensed variables *TREATMENT\_2* and *b*-ORGANIC\_2 (Table J.10). Hence, *TPHc* was dropped

from the model, and the new model contained only three variables (DOC,

*TREATMENT*\_2, and *b*-*ORGANIC*\_2).

In step 5, I checked the assumption that the logit increased or decreased linearly as a function of the covariate for each continuous variable in the model using LOWESS (locally weighted scatterplot smoothing) curves (Figure I.1) and the method of fractional polynomials developed by Royston and Altman (Tables J.10a and J.10b, see sources for further information).<sup>212,213</sup> Both methods supported the assumption that the model was linear in the logit for the continuous variable *DOC*. The model at the end of this step is the main effects model.

In step 6, I added each of the relevant interaction terms—DOC x  $TREATMENT_2, DOC x b$ - $ORGANIC_2, TREATMENT_2 x b$ - $ORGANIC_2$ —one at a time, and assessed the statistical significance of the interaction using first the Wald statistic (Equation I.12) and partial likelihood ratio test (Equation I.11) at a significance level of  $p \le 0.01$ . These results are in Tables J.11, J.12, and J.13, respectively. No interaction met our criteria for statistical significance cutoff. I therefore excluded interaction terms from this analysis.

The preliminary final model included the relevant main effects: *DOC*, *TREATMENT\_2* (coded at 4 levels), and *b-ORGANIC\_2* (coded at 2 levels). In this step, I assessed whether the probabilities predicted by the model accurately reflected the observed data. I used two tests of significance: (1) the receiver operating characteristics (ROC) curve, which is a plot of *sensitivity vs.* 1 - specificity for all possible outcomes of the model and (2) Hosmer-Lemeshow goodness-of-fit tests, which tested the null hypothesis that the

estimated output predicted by the model was not different from observed outcomes. The ROC curve is shown in Figure J.2 and provides a measure of the model's ability to discriminate correct outcomes from the data given from the area under the curve (AUC). The AUC (0.902) indicates outstanding discrimination.<sup>209</sup> Furthermore, the Hosmer-Lemeshow goodness-of-fit test (p = 0.0743) indicates that I could not statistically differentiate the observed data from the predicted data. Thus, I conclude that the model fits well and is best represented by the following equation for  $\hat{g}(x)$ , the estimated logit, which is linear in its parameters:

$$\hat{g}(x) = -0.500 + 1.76x_{DOC} + 0.876x_{TSOC-5g\,O_3} - 0.493x_{TSOC-10g\,O_3} - 1.93x_{TSOC-40g\,O_3} - 2.30x_{HIGH\,ORGANIC}$$

Equation 5.1

The function g(x) represents the log-transformed odds ratio of the conditional mean of an event (Y) under given conditions (x) when the logistic distribution is used. In this case, that event (Y) is the probability of adverse germination, i.e., no germination.

## 5.3 Results and Discussion

# 5.3.1 Quantification of TPH Removal (g C from C9 to C36) and DOC Production

Figure 5.1 (A, B, and C) shows our findings with respect to TPH, TPH loss, and DOC gain. Figure 5.1A shows that the changes in TPH concentration (ppm) across C9-C36 by dose were nearly uniform, although the rate of TPH removal was clearly slowing at higher O<sub>3</sub> doses. While O<sub>3</sub> reactivity in the soil column will be a complex mix of reactions including direct attack by the O<sub>3</sub> molecule and indirect attack by radicals formed by the decomposition of O<sub>3</sub>, the finding of uniform reactivity across carbon range appears to favor the latter explanation.<sup>101,126,132,192,214</sup> The data for ANS crude indicate a predominately aliphatic character (85%), another point favoring the explanation of indirect O<sub>3</sub> attack via radical oxygen species, since direct attack by the O<sub>3</sub> molecule is usually slow against aliphatic compounds.<sup>101,120</sup> The radical reactions would be facilitated by the reactive metals in the soil (Table 3.1), including iron (13,100 ppm), manganese (250 ppm), copper (16.5 ppm), and nickel (11.0 ppm), all of which decompose O<sub>3</sub> in the gas phase.<sup>192,215,216</sup> For radical-type, ozone-initiated auto-oxidation, the reason for the plateau may be saturation of the metal catalyst surface or that the O<sub>3</sub>-induced radical chain process is autoinhibiting.<sup>215,217</sup> For example, a manganese oxide catalyst for O<sub>3</sub> degradation of cyclohexane loses its reactivity after 120 min, and intermediate products can be evolved off the surface as CO<sub>2</sub> upon heating the metal catalyst to 500°C.<sup>215</sup>

Figure 5.1B shows a direct comparison of loss of TPH (in g C) to gain of DOC (also in g C). The most salient feature is the recovery of 0.745 g C of DOC at the 5 g dose of O<sub>3</sub> gas, a finding that is not recapitulated by TPH measurements, which showed only a loss of 0.165 g C. This indicates the formation of an intermediate set of compounds that could be extracted and detected by TPH and DOC methods, products that were not detectable by DOC methods before ozonation. Intermediate compounds, including 1,2,3- and 1,2,4-trioxolanes, are well-documented for direct O<sub>3</sub> attack double bonds, particularly on  $\mu$ -conjugated rings, but they are highly unstable and difficult to isolate.<sup>218</sup> Intermediates for radical-type reactions are more elusive, and information is scarce as to the mechanism or intermediate products of such reactions.<sup>120</sup> It also is possible that an initial dose of O<sub>3</sub> reacted first with higher molecular weight asphaltenes and resins, not

quantified in the TPH profile.<sup>163,219</sup> Chacon-Patiño found that photo-oxidized lower carbon number asphaltenes with an archipelago (multicore) structural motif exhibited products with a fingerprint typical of dissolved organic matter.<sup>219</sup>

Figure 5.1C shows that measurable TPH loss rates (g  $\Delta$  C /h) were lowest at the 5g O<sub>3</sub> dose (-0.330 g C<sub>TPH</sub>/h), maximized at the 10-g O<sub>3</sub> dose (-1.74 g C<sub>TPH</sub>/h), and began to plateau at the 40-g dose (-1.02 g C<sub>TPH</sub> /h). DOC gains, on the other hand, peaked at the 5-g O<sub>3</sub> dose (+1.49 g C<sub>DOC</sub>/h), slightly decreased at the 10-g O<sub>3</sub> dose (+1.30 g C<sub>DOC</sub>/h), and then dropped off sharply at the 40-g O<sub>3</sub> dose (+0.780 g C<sub>DOC</sub>/h). Nonetheless, the peak utilization of O<sub>3</sub> (g O<sub>3</sub>/ g  $\Delta$  C) occurred at the 10-g O<sub>3</sub> dose for TPH (5.76 g O<sub>3</sub>/ g  $\Delta$ C) and DOC (7.67 g O<sub>3</sub>/ g $\Delta$  C).



Figure 5.1 (A-C). (A) TPH decreases across the carbon range (C9-C36) for ANS crude oil; (B) Direct comparison of TPH loss to DOC gain (both in g C); (C) Comparison of TPH and DOC for absolute change in mass of carbon (g C), mass of carbon change per hour (g  $\Delta$  C/h), and ozone utilization (g O<sub>3</sub>/g  $\Delta$  C).

### 5.3.2 NOAEL and LOAEL for TPH and DOC

Figure 5.2 (A-O) summarizes adverse germination rates, TPH, and DOC in the dilution series (*b-ORGANIC*, y-axis) for each treatment group (*TS*, *TSC*, *TSOC-5 g*, *TSOC-10 g*, and *TSOC-40 g*). The baseline adverse germination rate, established by the background control (*TS*) (Figure 5.2A), ranged from 5% to 55%, depending on the amount of *b-ORGANIC*. Adverse germination in the *TSC* (Figure 5.2D) dilution series closely matched that seen in *TS* (control), except at the highest TPH concentration (0 % *b-ORGANIC*), wherein adverse germination was 90%, compared to only 55% in *TS* control. Some regulatory guidelines prescribe a minimum germination rate for the control group: For example, the UN OECD 208 sets minimum germination in the control at 70%.<sup>220</sup> At the highest TPH concentration (0 % *b-ORGANIC*), the 70% criterion was not attained, with only 45% germination; hence, the LOAEL 27,300 ppm for TPH (Figure 5.2E) did not meet the UN OECD criterion.<sup>220</sup>

At up to 10% *b-ORGANIC* (or ~24,500 ppm TPH), the germination rates between *TS* and *TSC* were identical and, thus, 24,600 ppm is the NOAEL TPH (Figure 5.2E). This finding agrees with that of Banks et al., where no statistical evidence of adverse radish germination was observed in soil contaminated with up to 24,000 mg/kg motor oil.<sup>91</sup> The DOC produced from ozonation, on the other hand, had negative impacts on germination at a fraction of the full-strength dose. The NOAEL of *TSOC-5 g* was 150 ppm DOC (Figure 5.2I) and occurred at 10% of the original strength of contamination. The NOAEL of *TSOC-10 g* was 770 ppm (Figure 5.2L) and that of *TSOC-40 g* (Figure 5.2O) was 1730 ppm DOC (both at 20% of the full-strength dose). The LOAEL showed corresponding

trends: 480 ppm for the 5-g dose (Figure 5.2I), 1920 ppm for the 10-g dose (Figure 5.2L), and 4320 ppm for the 40-g dose (Figure 5.2O).

TPH (outside the full-strength *TSC*) did not significantly alter germination, as also noted by Banks *et al.*<sup>91</sup> In contrast, DOC produced from ozonation had profoundly negative impacts on radish germination. Moreover, the DOC produced from a 5-g dose was more toxic than from a 10-g or 40-g dose, based on the NOAELs. Potential reasons are discussed more fully in the logistic regression analysis. For *TSOC-5 g*, the NOAEL to LOAEL range was narrow (140 to 480 ppm DOC), while the range for the *TSOC-10 g dose* and *TSOC-40 g* dose levels were broader: 770 to 1920 and 1730 to 4320 ppm DOC, respectively, an artifact of study design.<sup>200</sup> Therefore, I performed a benchmark dose (BMD) analysis using multiple logistic regression to determine a few key benchmark responses for the full set of data and make differentiations based on *TREATMENT\_2* and *b-ORGANIC\_2* levels.



Figure 5.2 (A-O). Comparison of germination rate (%), DOC (ppm), and TPH (ppm), by dilution series (% *b-ORGANIC*) for *TS* (A-C), *TSC* (D-F), *TSOC-5 g O<sub>3</sub>* (G-I), *TSOC-10 g O<sub>3</sub>* (J-L), and *TSOC-40 g O<sub>3</sub>* (M-O). NOAEL and LOAEL are highlighted in yellow and noted in red for TPH (*TSC* only) and DOC (*TSOC* groups only).

# 5.3.3 Interpretation of Model Results

Examination of the model coefficients (Table 5.1) indicates, first, that the covariate *DOC* had a strong positive slope (1.76), directly indicating the harmful effect of oxidation products on the probability of radish germination. Second, *TPHc* could be excluded from the model, meaning that the presence of background crude oil (as measured by GC-FID) had no predictive bearing on radish germination. Third, dose level had predictive importance: *DOC* produced from a 5-g dose of O<sub>3</sub> gas had meaningfully worse impacts on germination than *DOC* from a 10-g or 40-g dose, implying that the nature of the *DOC* was different. Finally, the presence of *b-ORGANIC* 10% (by mass) strongly attenuated the adverse effects of *DOC*.

Table 5.1. Results of fitting the multivariable logistic regression model with  $TPHc^*$  variable removed (n = 840)<sup>†</sup>.

Covariate	Unit/Level <sup>‡</sup>	Coef.	Std. Err.	Wald (z)	$P^{\$}$	95% CI
DOC	per 1000 ppm	1.76	0.241	7.29	0.000 0	(1.29, 2.23)
TREATMENT_ 2	TS/TSC	Base				
	TSOC-5 g	0.876	0.364	2.41	0.016 0	(0.163, 1.59)
	TSOC-10 g	- 0.493	0.506	-0.970	0.330	(-1.49, 0.499)
	TSOC-40 g	-1.93	0.814	-2.37	0.018 0	(-3.53, - 0.335)
b-ORGANIC_2	<i>b-ORG&lt;10%</i>	Base				
	<i>b-ORG</i> >10%	-2.30	0.268	-8.56	0.000 0	(-2.83, - 1.77)

\*Total petroleum hydrocarbon by carbon (TPHc), approximately 85% of the TPH by mass.

<sup>†</sup>Intercept-only loglikelihood is -515, the log-likelihood of the model is -278, and G (df = 5) is 474 for the model, statistically significant at  $\rho < 0.000$ .

<sup>‡</sup> *TS*, test soil; *TSC*, test soil contaminated with crude oil; *TSOC*, test soil contaminated with ozonated crude oil.

The categorical variables make it possible to parse the model outcomes based on the effects of organic matter and dose level as shown in Figure 5.3. The results for the full model are shown in Figure 5.3A, in which the probability of adverse effects (i.e., no germination) with 95% confidence intervals (dashed boundaries) are modeled as a function of DOC (ppm); here, *TREATMENT\_2* and *b-ORGANIC* are held at mean values. The model parsed by low (< 10% by mass) versus high (> 10% by mass) *b-ORGANIC* is shown in Figure 5.3B, where only *TREATMENT\_2* is held in the mean position. The model of low *b-ORGANIC\_2* parsed by *TREATMENT\_2* is shown in Figure 5.3C, while the high *b-ORGANIC* parsed by *TREATMENT\_2* is in Figure 5.3D. The steep slopes of the model at low organic conditions vs. high organic conditions (Figure 5.3B) show that background organic matter strongly attenuated the adverse effects of increasing DOC concentration while Figure 5.3C and Figure 5.3D show the increase in toxic effects of DOC produced from lower doses of O<sub>3</sub>.



Figure 5.3(A-D). Predictive margins with 95% confidence intervals: (A) the full model; (B) the model parsed by high (navy) and low (maroon) background organic; (C) the model of low background organic parsed by the 5 g (dark navy), 10 g (medium navy), and 40 g (light navy) O<sub>3</sub> dose; (D) the model of high background organic parsed by the 5 g (dark maroon), 10 g (medium maroon), and 40 g (light maroon) O<sub>3</sub> dose.

I used the full model and the parsed models to evaluate the positions of risk of

adverse effects. If p(d) is defined as the probability of adverse outcomes (i.e., no germination), and p(0) is defined as the probability at background level, additional risk is defined as:

$$y(d) = p(d) - p(0)$$
 Equation 5.2.<sup>221</sup>

Extra risk, y(d), is defined as additional risk of adverse outcomes in the fraction of plants expected to germinate normally:

$$y(d) = \left[\frac{p(d) - p(0)}{1 - p(0)}\right]$$
Equation 5.3

When background effects are small (e.g., background organic > 10%), the BMD results are comparable between additional risk and extra risk; when background effects are large, the difference is greater. Thus, extra risk considers background effects.

Table 1.1 lists the 10%, 25%, and 50% extra-risk levels ( $\pm$  std. error) for the full model, the model parsed by *b-ORGANIC\_2*, and the model parsed by *b-ORGANIC\_2* and *TREATMENT\_2*. These values compute the additional risk of adverse germination outcomes given the background risk of adverse germination. Figure 5.4 maps those risk levels along a tree diagram and shows that the mean position of the full model can be subdivided first by background organic and then by dose. For example, at the average position for all criteria, a 10% extra risk of adverse germination is expected at 450 ppm DOC. If I specify *b-ORGANIC\_2*<10%, 10% extra risk occurs at 260 ppm DOC, while a *b-ORGANIC\_2>10%* tolerates up to 650 ppm DOC (2.5x higher) Table 5.2 List of the 10%, 25%, and 50% extra-risk margins ( $\pm$  std. error) in ppm of DOC for the full model, the model parsed by high and low organic background, the model of low organic background parsed by dose, and the model of high organic background parsed by dose.

Model

Full Model	450±15, 900±24, 1550±50
High Organic	250±44, 500±40, 900±36
Low Organic	650±23, 1150±50, 1750±79
Low Organic 5 g Dose	n/a, n/a, 250±79
Low Organic 10 g Dose	450±11, 650±11, 1050±87
Low Organic 40 g Dose	1250±16, 1500±15, 1850±12
High Organic 5 g Dose	150±37, 600±54, 1150±74
High Organic 10 g Dose	900±44, 1400±70, 1950±91
High Organic 40 g Dose	1750±67, 2200±98, 2700±11

Extra Risk (10%, 25%, and 50%)



Figure 5.4. The 10%, 25%, and 50% extra-risk margins for the full model (black), the model in *b*-ORGANIC\_2<10% (navy), and the *b*-ORGANIC\_2>10% (maroon). At each risk level, risk is delineated first for the full model, then for the *b*-ORGANIC\_2, and, finally, for the TREATMENT\_2.

Low and high *b-ORGANIC* can be further subdivided by dose level. The model could not predict 10% extra risk in *b-ORGANIC\_2<10%* because of the steepness of the curve – an area future studies can address. In *b-ORGANIC\_2>10%*, the 10% risk at a 5-g

dose is drawn at 150 ppm DOC (~3% the full concentration of all the DOC produced at the 40-g dose). Indeed, the first measurable risk level at low *b-ORGANIC* for a 5-g dose of O<sub>3</sub> is the 50% extra-risk level predicted at 250 ppm DOC – in other words, less than  $1/5^{\text{th}}$  of the DOC produced by a 5-g dose conferred a nearly 50% increase in adverse germination outcomes. This number is comparable to the LOAEL (480 ppm) (Figure 5.2I). Conversely, the 10% risk level in low *b-ORGANIC* can be resolved for the 10-g O<sub>3</sub> dose (450 ppm) and 40-g O<sub>3</sub> dose (1250 ppm). Increasing dose increased the tolerance to DOC at a given risk level. The same trends are observed with *b-ORGANIC*>10% w/w, where DOC tolerance is even higher.

Our findings are consistent with those of the Luster-Teasely et al., who examined dose levels of 1.75, 3.00, 4.25, and 5.00 mol O<sub>3</sub>/mol chrysene and found the lowest dose to be more toxic than chrysene itself.<sup>139</sup> Our dose levels of 5 g, 10 g, and 40 g O<sub>3</sub>, expressed as molar ratios, are 1.63, 3.26, and 13.1 mol O<sub>3</sub>/mol TPH, respectively. I find that 1.63 mol O<sub>3</sub>/mol TPH is considerably more toxic to radish germination than either 3.26 or 13.1 mol O<sub>3</sub>/mol TPH. The reaction mechanisms and thermodynamics likely explain these results. First, for ringed structures, the first ozonation step is rate-limiting and has a positive activation energy barrier (e.g., 15.8 kcal/mol in benzene), while the second step is predicted to be faster, more exothermic (-40 to -50 kcal/mol), and with a negative activation energy of -5 kcal/mol. <sup>130,134</sup> Hence, direct O<sub>3</sub> attack may thermodynamically favor the oxidation of a first set of intermediate products over initial products, thereby creating an evolving group of intermediate products that peak in reactivity (and toxicity) after the first ozonation step, where a highly reactive

intermediate is created, and then steadily decrease as downstream products become more oxidized. The reaction path for aliphatic compounds involves a complex chain of radical reactions, and is less understood; however, a changing group of intermediates also occurs in such scenarios.<sup>120</sup> The role of background organic matter in quenching the toxicity has been shown for nanoparticles (Zn-O NP), heavy metals (cadmium), and other trace elements by chemisorption or complexation.<sup>222–225</sup> This finding is also true for the more complex molecules like herbicides: For instance, an early study found that five times more herbicide was required at 20% organic matter than at 4% for equal toxicity, regardless of the herbicide.<sup>226</sup> Such results are recapitulated in our study, which shows the ameliorating effects of greater than 10% w/w potting mix (itself containing ~75% organic matter).

### 5.4 Environmental Implications

Our study highlights that ozonation of weathered-petroleum hydrocarbons in soil is a dynamic process that creates intermediates whose toxicity to radishes depended on the level of ozonation. This finding poses a risk-management paradox. A low dose of O<sub>3</sub> removed less TPH and produced a lower absolute quantity of oxidized byproducts, but that material was more toxic per unit mass. In contrast, a higher dose removed more TPH and produced more DOC, but that DOC was less toxic per unit mass. The tradeoff between toxic potential and absolute quantity of DOC produced must be evaluated with respect to the time it takes to remediate partially oxidized intermediates efficiently, particularly by biodegradation.<sup>83,84,98</sup> Previous findings have indicated that a multicycle treatment process that integrates O<sub>3</sub> doses with periods of bioremediation can reduce contaminant levels to strict regulatory limits of 1% TPH (10,000 mg/kg), remove the residuals created by ozonation treatment, and improve soil quality.<sup>98,79</sup> Until bioremediation of oxidized residuals is complete, ozonation must be coupled with bioremediation, regardless of the dosing regimen.<sup>84,98</sup>

# 6 RESEARCH: OZONATION OF PETROLEUM HYDROCARBONS IN SOIL COLUMNS: EFFECTS OF OZONE LOADING RATE ALONG THE AXIAL DISTANCE

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#### 6.1 Introduction

Aeration-based *in situ* treatment technologies are an established means to remediate petroleum-based contaminants in subsurface source zones and dissolved-contaminant plumes.  $^{59,227,228}$  For example, *in situ* air sparging injects clean air directly into an aquifer to provide the oxygen (O<sub>2</sub>) necessary for aerobic biodegradation. The analogous process for unsaturated soils is bioventing, or the delivery of air to the vadose zone. Air sparging and bioventing are bioremediation tools that promote aerobic biodegradation processes: e.g., mono-oxygenation followed by  $\beta$ -oxidation, tricarboxylic acid cycle, and aerobic respiration.<sup>59</sup>

A non-biological option is *in situ* soil vapor extraction (SVE) for remediating unsaturated soils contaminated with volatile organic chemicals such as chlorinated solvents or petroleum derivatives like the light aromatics benzene, toluene, ethylbenzene, and xylenes (BTEX).<sup>229</sup> An SVE system uses compressors or vacuum pumps to move air through the vadose zone and extract volatile compounds, which are then sent to an aboveground treatment system to condense, adsorb, biodegrade, or incinerate the vapors.<sup>228</sup> In the case of soil contaminated with unrefined crude oil, these technologies can attenuate some degree of contamination, because raw crude oil contains components with a wide range of water solubility, vapor pressure, and Henry's Law constant.<sup>1</sup> SVE can volatilize lighter fractions, and bioventing or air-sparging can stimulate biodegradation of some n-alkanes (usually C10 to C26), slightly branched alkanes (isoprenoid alkanes), and low-molecular-weight aromatics such as BTEX.<sup>8,37,51</sup> However, SVE, air sparging, and bioventing are not effective for petroleum components that are semi- to non-volatile or recalcitrant to normal oxidative bioremediation. In fact, these technologies enrich the recalcitrant components by removing more labile ones, thus shifting the residual crude oil profile to one with a higher proportion of large aromatic molecules and molecules with greater heteroatom character (i.e., molecules containing nitrogen, sulfur, or oxygen).

Contacting recalcitrant compounds with ozone (O<sub>3</sub>) is a means to add oxygencontaining functional groups and overcome the limitations of the conventional *in situ* technologies.<sup>230</sup> The addition of oxygen-containing functional groups to recalcitrant petroleum compounds (e.g., saturated or condensed aromatic rings) often increases solubility and biodegradability.<sup>83,84</sup> Due to the high redox potential of O<sub>3</sub> (2.08 eV) and its primary decomposition product, the hydroxyl radical (•OH) (3.06 eV), O<sub>3</sub> exposure oxidizes a wide range of organic compounds to produce alcohols, aldehydes, ketones, carboxylic acids, and quinones.<sup>97,101,231</sup> Generation of O<sub>3</sub> typically occurs via a highvoltage discharge across an oxygen or air feed-gas; the technology is mature, can be performed on-site, and requires no storage. <sup>86,97,108,192</sup> Hence, *in situ* oxidation with O<sub>3</sub> gas may present a technical avenue to decrease the total time needed for bioremediation and to allow removal of petroleum contamination that is inherently recalcitrant to bioremediation.<sup>232</sup>

How  $O_3$  transports through the soil profile is complex, because  $O_3$  reacts rapidly and non-specifically with many organic and inorganic compounds.<sup>101,193,231,233</sup> Since many factors can promote or impede the ability of  $O_3$  to transport along a soil column,  $O_3$ transport has been the subject of numerous studies.<sup>35,192,193,234–236</sup> Hsu and Masten found O<sub>3</sub> to be an effective oxidant against phenanthrene, with water content and organic matter being factors that impeded O<sub>3</sub> transport in 10-cm and 30-cm columns.<sup>237</sup> Choi et al. examined the effect of soil media, OH-radical scavengers, O<sub>3</sub> dosage, and humic acid for the ozonation of 10 ppm of PAHs (e.g., phenanthrene) in glass beads, sand, and baked sand in a variety of slurry experiments.<sup>236</sup> These authors found that the time needed for O<sub>3</sub> to break-through decreased with greater soil moisture, a result they attributed to decreased pore volume and access to soil organic matter (SOM) and metal oxides. Chen et al. also showed that the reaction of  $O_3$  with petroleum hydrocarbon was impeded by increased soil moisture, even at high concentrations of residual petroleum (18,000 ppm and 33,000 ppm).<sup>99</sup> Most recently, Ying et al., examining the importance of iron-content and soil particle-size distribution, corroborated the impact of SOM in two soil types of an Israeli coastline aquifer.<sup>233</sup>

The prior studies agree that increased water content, SOM, and metal oxides impede O<sub>3</sub> transport, either by blocking gas pores or creating an O<sub>3</sub> demand; the outcome is that the O<sub>3</sub> dose has to be increased to reach a target contaminant. Each of the studies, however, looked at bulk contaminant removal within the column without examining reactivity with axial distance, which affects treatment efficacy for *in situ* applications. Only Zhang *et al.* looked at the degradation of anthracene along 6 points in sand-packed columns, but with a relatively low anthracene concentration, 50 ppm. Moreover, no studies have evaluated treatment regimens with higher than 1 wt% of O<sub>3</sub> gas.

Small-scale O<sub>3</sub> generators can produce between 1-5 wt% O<sub>3</sub>, and high-efficiency O<sub>3</sub> generators can reach concentrations of 15 wt% using an O<sub>2</sub> feed gas, the upper limit for safe-handling.<sup>102</sup> High concentrations deliver treatment mass in a smaller volume of carrier gas (i.e., increased loading of mass O<sub>3</sub>/mass soil/time), thereby decreasing treatment time and the volume of the total of gas that must be contacted with soil. On the other hand, increasing the concentration of a reactive gas in complex soil matrix will have non-linear consequences for O<sub>3</sub> half-life, transport distance, and the generation of a hydroxyl radical, a key secondary oxidant that is dependent on available catalytic surfaces.

The spatial reactivity of O<sub>3</sub>, the effective O<sub>3</sub> concentration, and the efficiency of a given total dose level are key concerns for *in situ* application of O<sub>3</sub> for soil contaminated with >1 wt% petroleum.<sup>77</sup> Yet little direct evidence demonstrates how O<sub>3</sub> reacts along the gas-flow path using treatment-relevant O<sub>3</sub> concentrations for field-relevant contaminant conditions. This work expands beyond previous work by evaluating O<sub>3</sub> consumption along the axial distance of a 45-cm column using high concentrations of O<sub>3</sub> gas (~2 wt%, ~5 wt%, and ~14 wt %) for soils contaminated with petroleum at 5 wt%, initially by looking at the ability of O<sub>3</sub> to traverse the column ("break-through") under each condition and secondarily at the removal of total petroleum hydrocarbons (TPH) along axial
distance. In addition, the axial length for temperature change, water (H<sub>2</sub>O) flux, and total heat evolved based on the specific heat of soil+H<sub>2</sub>O, temperature, and  $\Delta$ H<sub>2</sub>O are examined. The results show clear spatial patterns with respect to O<sub>3</sub> transport and utilization efficiency based on a 3x3 array of concentration and total dose, and they reveal key spatial concerns about the balance of heat as the reaction proceeds through a soil column.

## 6.2 Materials and Methods

## 6.2.1 Crude Oil Source and Characteristics

Chevron Technical Center (a Chevron U.S.A. Inc. division, Richmond, CA) provided a crude oil known as ARAB having an American Petroleum Institute gravity of 30-32° and classified as a medium crude oil. The crude oil characteristics are described in 3.2.3 and 3.3.3.

## 6.2.2 Soil Source and Characteristics

Locally sourced topsoil (All Star Materials, Guadalupe, AZ) served as the background soil in all experiments. Soil preparation and classification analyses are described in 3.2.1 and 3.3.1.

### 6.2.3 Preparation of Petroleum Contaminated Test Soil

A petroleum contaminated test soil using ARAB crude mixed with background soil (initial moisture < 1-2% w/w) at a concentration of 5% w/w was created. The mixture was vigorously mixed with a hand trowel for even consistency, and the soil was transferred to clean, heat-resistant (up to 60°C) 57-L polypropylene containers. Soils were artificially weathered in the lab, in methods described in further detail in 3.2.4.

## 6.2.4 Soil Column Ozonation Apparatus

The ozonation setup is shown in Figure 6.1. Each experiment was conducted using 600 g of contaminated soil containing 5% w/w crude oil and moistened to 10% w/w moisture. Before ozonation, the experimental soil was loaded to a height of 45 cm into a custom reaction vessel (4.0 cm ID x 60 cm) comprised of two fused chambers: a 700-cm<sup>3</sup> main reaction chamber for soil and a 50-cm<sup>3</sup> antechamber separated by a coarse-grit diffusion plate (ASU Glassblowing Facility, Tempe, AZ). A temperature-indicating label (McMaster-Carr; Aurora, OH) was placed every 5 cm from 0 to 45 cm (inclusive) along the length of the column for a total of 10 measurement points; the labels indicated surface temperature in 5-degree increments from 25°C to 100°C and are rated for accuracy of  $\pm 2^{\circ}$ C (Figure 6.1, right panel). Ambient laboratory temperature was 24.4°C.

All hosing connections and fittings were made of O<sub>3</sub>-compatible polytetrafluoroethylene (PTFE). A tank of ultra-high purity (UHP) compressed O<sub>2</sub> (S.3A) was supplied to a dual-stage pressure regulator (S.3B) and then passed through a flow meter (S.3C) to regulate flow to 2 liters per minute (LPM). The gas then flowed into an Ozonia (Trevose, PA) Triogen LAB2B laboratory O<sub>3</sub> generator (S.3D), which delivered O<sub>3</sub> at a loading rate of ~2 wt% (10,000 ppmv) for the low loading rate and ~5 wt% (30,000 ppmv) for the medium loading rate. For high-loading rate experiments at ~14 wt% (84,000 ppmv), the setup was connected to an Ozonia Model CFS-1 2G O<sub>3</sub> generator.



Figure 6.1. Left-panel shows the schematic of the experimental setup for soil ozonation: (A) ultra-high purity (UHP) compressed tank provided  $O_2$  to a (B) dual stage pressure regulator, then to a (C) flowmeter, (D) Ozonia Triogen LAB2B laboratory  $O_3$  generator for low and medium loading rate experiments, or Ozonia Model CFS-1 2G  $O_3$  generator for high loading rate experiments, (E) gas-washing bottle containing 500mL of 18M $\Omega$ water for humidification, the (F) <sup>1</sup>/<sub>4</sub>"-inlet connection to reaction vessel antechamber, the (G) <sup>1</sup>/<sub>4</sub>"-outlet connection, and (H) Model 465M Ozone Monitor. Right-panel shows detail of column (Figure 1. F/G) with temperature indicating labels in position.

The O<sub>3</sub>-bearing gas was directed through a gas-washing bottle (S.3E) filled with 500 mL of acidified (pH 2) 18-M $\Omega$  deionized water to attenuate stripping of moisture from the soil and then allowed to passively advect in up-flow mode into the first chamber (S.3F), across the diffusion plate, and then into the chamber containing the soil (S.3G). Effluent gas was directed into a Model 465M Ozone Monitor (S.3H) (Teledyne Advanced Pollution Instrumentation, San Diego, CA).

A total of 9 experimental conditions (Table 6.1) were run in duplicate. The O<sub>3</sub> concentration in the effluent gas was recorded every five minutes during an ozonation experiment. Temperature at each of the ten points along the surface of the glass column was also recorded every five minutes. To quantify the spatial differences, the soil in the reaction vessel was removed in 5 discrete sections (as demonstrated in Figure E, Appendix E) and analyzed in triplicate for TPH and moisture. An O<sub>2</sub>-only control column

was run for 240 minutes to determine moisture stripping effects of gas-flow along the five column sections.

Ozone Gas	Conditions to Achieve Targeted Ozone Dose						
Loading Rate	For a Gas flow rate of 2 LPM for different times and Ozone						
$(mg_{ozone}/g_{soil}/$	Gas Phase Concentrations						
h)	5 g Ozone Dose	10 g Ozone Dose	40 g Ozone Dose				
4	120 min of	240 min of 10,000	480 min of 10,000				
	10,000 ppmv	ppmv [O <sub>3</sub> ]	ppmv [O <sub>3</sub> ]				
	[O <sub>3</sub> ]						
12	40 min of 30,000	80 min of 30,000	160 min of 30,000				
	ppmv [O <sub>3</sub> ]	ppmv [O <sub>3</sub> ]	ppmv [O <sub>3</sub> ]				
36	15 min of 84,000	30 min of 84,000	60 min of 84,000				
	ppmv [O <sub>3</sub> ]	ppmv [O <sub>3</sub> ]	ppmv [O <sub>3</sub> ]				

Table 6.1. Summary of the 9 ozonation experiments, each using 600 g of TSC.

# 6.2.5 Quantification for TPH and Moisture

Extraction and quantitation of TPH (C9-C36) closely followed the methods described in 3.2.7.

# 6.3 Results and Discussion

# 6.3.1 Extractable TPH Prior to Ozonation of Soil Columns

Figure 6.2 compares TPH concentrations (C9-C36) between raw and weathered crude oil. The initial pre-weathering concentration was ~23,600±700 ppm TPH

(coefficient of variation [CV] = 3%). After weathering, the TPH concentration was on average 20,000 ± 1,200 ppm TPH (CV = 6%). DCM-extractable carbon accounted for ~40% of available hydrocarbons, since asphaltenes and resins were not quantified in the analysis.<sup>83</sup> The synthetic weathering process removed 86% of hydrocarbons from C9 to C12, 26% from C12 to C13, and ~15% of overall TPH.



Figure 6.2 Arab medium crude oil before and after laboratory weathering processes.

## 6.3.2 Effluent Ozone Profiles ("Break-through") over Time

Effluent  $O_3$  is defined as the concentration of  $O_3$  in the gas exiting during the ozonation experiments. Integrated over time, I measured how much for the supplied dose exited the column unreacted. Gas flowrates influenced the change in measured gas phase

ozone concentrations across the lengths of the soil column. For experiments at the lowgas loading rate, 2-3% of the supplied O<sub>3</sub> dose exited as effluent at the 5 g total dose, 7% at the 10 g total dose, and 32% at the 20 g total dose. Thus, O<sub>3</sub> traveled the length of the column and broke through for the low O<sub>3</sub>-loading rate. At the medium loading rate, the O<sub>3</sub> concentration in the effluent was negligible at the 5 g and 10 g total dose, and it was 2% at the 20 g dose. No effluent O<sub>3</sub> was detected at any total dose level for highest gas loading rate.

### 6.3.3 Bulk TPH Removal and O<sub>3</sub>-utilization Efficiency

TPH results for the matrix of O<sub>3</sub> loading rates and total O<sub>3</sub> doses are summarized in Table 6.2. TPH loss rates (g  $\Delta$  C /h) increased with increasing O<sub>3</sub> loading rate: from 0.44 g  $\Delta$ C/hr for the lowest O<sub>3</sub>-loading rate to 2.3 g  $\Delta$ C/hr for the highest rate. This trend is expected, given that organic oxidations involving O<sub>3</sub> are commonly bimolecular, i.e., first-order with respect to each reactant.<sup>101,238,239</sup> In contrast, the efficiency of the reaction between O<sub>3</sub> and TPH was greatest at the lowest O<sub>3</sub> loading rate at every total dose, as evidenced by the O<sub>3</sub> utilization ratios, which were highest for the lowest loading rate.

A possible reason for decreased O<sub>3</sub> utilization with increased loading rate is that the higher gas loading rates of ozone led to more direct attacks by molecular O<sub>3</sub> and fewer radical reactions. The generation of hydroxyl radicals is a dominant reaction when O<sub>3</sub> is deployed in a complex matrix like soil, where metals in soil mineral backbone (Table 3.1) catalyze the formation of hydroxyl radicals.<sup>214–216,240</sup> Catalytic ozonation has been found to be almost 3-fold more efficient than ozonation alone for the oxidation of hydrocarbons.<sup>241</sup> The major catalytic mechanisms depend on surface absorption such that either (1) the O<sub>3</sub> decomposes to free radicals by metal ions which react with hydrocarbons or (2) the complexation between organic molecule and the catalyst and subsequent oxidation of the complex.<sup>242–246</sup> With a high ozone loading rate, radicalgenerating sites may have become saturated, thereby increasing the proportion of molecular O<sub>3</sub> present.<sup>236,247</sup> Direct attack by the O<sub>3</sub> molecule is more selective and slower than radical attack and may favor larger, more complex hydrocarbons.<sup>101,237</sup> Table 6.2. TPH Summary of average TPH values for 9 ozonation experiments are noted below. Ozonation-utilization was tabulated from grams of carbon removed (85% of TPH).

Total O <sub>3</sub> Applied		5 g O <sub>3</sub>	10 g O <sub>3</sub>	20 g O <sub>3</sub>
	Start TPH	21,000	19,000	21,000
Low Loading rate	End TPH	18,000	15,000	15,000
4 mg <sub>ozone</sub> / g <sub>soil</sub> / h	% TPH Reduction	13%	20%	30%
	g TPH removed	1.4	2.0	3.0
	Utilization ratio, g O <sub>3</sub> /g C	4.1	5.8	7.9
	Start TPH	18,000	19,000	20,000
Medium Loading	End TPH	17,000	16,000	15,000
rate	% TPH Reduction	9%	17%	24%
12 mg <sub>ozone</sub> / g <sub>soil</sub> / h	g TPH removed	0.84	1.8	2.4
	Utilization ratio, g O <sub>3</sub> /g C	7.0	6.5	9.9
	Start TPH	21,000	20,000	22,000
High Loading rate	End TPH	19,000	17,000	18,000
36 mg ozone/ g soil/ h	% TPH Reduction	8%	10%	18%
	g TPH removed	0.90	1.1	2.2
	Utilization ratio, g O <sub>3</sub> /g C	6.5	11	11

# 6.3.4 TPH Removal by Distance Through the Length of the Soil Column

The removal of TPH along the column is presented in Figure 6.3. The horizontal axis is the TPH concentration normalized to the respective control, while the vertical axis

represents axial distance along the column. The top row of Figure 6.3 (A-C) shows the low loading rate (4 mg<sub>ozone</sub>/  $g_{soil}$ / h), the middle row (D-F) shows the medium loading rate (12 mg<sub>ozone</sub>/  $g_{soil}$ / h), and the bottom row (G-I) shows the high loading rate (36 mg<sub>ozone</sub>/  $g_{soil}$ / h).

Because O<sub>3</sub> gas reacts with the first available hydrocarbons along the transport path, the inlet end always had a more pronounced TPH removal than the outlet end. This TPH pattern was also shown for the degradation of phenanthrene.<sup>35</sup> The degree of asymmetry between the ends of the column increased sharply with increasing O<sub>3</sub> loading rate. At the low loading rate, TPH removal began to equalize as the dose time moved from 120 to 480 min (top row). TPH removal for medium loading rate, however, retained a pronounced difference between the two ends, and the difference was more extreme at high O<sub>3</sub> loading rate, where TPH removal stalled at the 20-cm mark, even at the highest dose (20 g O<sub>3</sub>). A trade-off was that the high loading rate conferred a significant improvement in TPH reduction at a short distance (0-10 cm) compared to the medium and low loading rates: 62%, 56%, and 48%, for high, medium, and low loading rate, respectively. This feature, combined with the lack of effluent O<sub>3</sub> observed for high loading rate experiments, may be an advantage to the high-loading rate regimen for contamination scenarios that have a shallow depth.



Figure 6.3 (A-I). The vertical axis represents distance (cm) from the inlet end, and the horizontal axis represents % TPH removal normalized to respective control experiments. The axes correspond to a column's orientation, i.e., upright (Figure 6.1).

### 6.3.5 Temperature at Input, Mid-Point, and Outlet End of the Soil Columns

Temperature measurements made at 10 points along the axial length every five minutes enabled the monitoring of a "heat front" that began at the inlet end and moved along the soil column in each of the 9 experimental conditions. Figure 6.4 (A-I) shows the temperature profile (y-axis) as a function of experimental duration (x-axis) at the inlet (5 cm), mid-point (10-20 cm), and outlet (>40 cm) ends of the column. For the low O<sub>3</sub>loading rate (Figure 6.4 (A-C)), the heat front emerged within 1-2 minutes, traversed >40 cm in  $60\pm 20$  min, and then dissipated, although the column did not completely cool to the ambient temperature,  $\sim 24^{\circ}$ C. Peak temperature, which was 35°C at each total-dose level of low loading, was observed only between 10 and 20 cm and only in the first 60 minutes. After 60 minutes of ozonation, the heat front reached >40 cm, but the column temperature did not continue to increase along the length, and remained at  $27\pm2^{\circ}C$  for the duration of the experiment, even though TPH removal continued from 120 to 480 minutes (Figure 6.3B and 1C). The temperature results show that the initial reactions were strongly exothermic, while later reactions were less so.<sup>231,248</sup> The stable temperatures indicate that the energy emission from the oxidation reactions was balanced by heat loss due to the advection of warm gas, latent heat of evaporation, and losses to the surroundings.

The heat front generated by the medium O<sub>3</sub>-loading rate (Figure 6.4 (D-F)) shows that tripling the O<sub>3</sub>-loading rate increased the reaction rate and, thus, shortened the time for a temperature increase to reach >40cm from  $60\pm20$  min to  $36\pm20$  minutes. Heat accumulated more quickly, as evidenced by the increase in peak temperature, to  $40-45^{\circ}$ C recorded at 10-20 cm along the column. Since O<sub>3</sub> lost in the effluent was significantly decreased (<2%), the higher temperature may have increased O<sub>3</sub> reaction kinetics, which decreased its half-life.<sup>109,249</sup> The increase in O<sub>3</sub> consumption was not matched by more removal of TPH, as shown in Figure 6.3 (D-F); instead, O<sub>3</sub> may have been oxidizing asphaltenes and resins, which were not measured. Similar to the low O<sub>3</sub> loading, medium loading showed no further increases in temperature >60 min, but converged to ~35±4°C for the remainder of the experiment at the highest total dose (20 g).

The trends intensified at the highest loading rate (Figure 6.4 (G-I)), which had an additional tripling of the O<sub>3</sub> loading rate to 36 mg<sub>ozone</sub>/ g<sub>soil</sub>/ h. Temperature increases occurred at >40cm after only 18±5 min, and peak temperatures at 10-20 cm were higher than for lower O<sub>3</sub> loading rates: 55°C for the total dose of 5 g O<sub>3</sub>, 60°C for 10 g O<sub>3</sub>, 65°C for 20 g O<sub>3</sub>. The 20-g total dose yielded a second heat front after 55-60 minutes at the O<sub>3</sub> inlet (0-5cm): There, the temperatures spiked to >100°C. The temperature spike was exacerbated by the substantial loss of water from the inlet end of the column (discussed below). Schubert et al. noted that 100°C is approximately the lower limit wherein alkanes can be induced into slow combustion in the presence of O<sub>2</sub> and O<sub>3</sub>. The combustion reactions increase temperature still further, which vaporizes more moisture and further propagates the reaction,<sup>250,251</sup> a smoldering phenomenon that was noted by Chen et al.<sup>99</sup>



Figure 6.4 (A-I). The vertical axis represents distance (cm) from the inlet end, and the horizontal axis represents time (min) of each experimental condition. For each condition, temperature is monitored at the inlet (green), mid-point (blue), and outlet (yellow) to O<sub>3</sub> distribution.

### 6.3.6 Movement of Moisture Across the Column

Precise moisture measurements taken across the column for each of the 9 experimental conditions allowed us to evaluate the mass of water gained or lost (compared to the starting level) along the axial direction; the moisture results are shown in Figure 6.5 (A-I). These data provide a "snapshot" of the moisture profile at each dose level (i.e., each time point) and demonstrate that a moisture "front" moved along the reaction path, creating a non-uniform moisture pattern; water loss near the column's inlet and gain near the column's outlet. For total doses >5 g O<sub>3</sub>, experiments indicated a net loss of moisture. The low loading rate experiments (Figure 6.5 A-C) delivered volumetrically more gas than those for higher loading rates; hence, the moisture-stripping effect was more pronounced. At the highest total  $O_3$  dose, the low loading rate experiment yielded a net loss of 9 g H<sub>2</sub>O from the column over 480 minutes, with the inlet and outlet ends showing approximately -8 g H<sub>2</sub>O and +3 g H<sub>2</sub>O, respectively. The medium loading rate experiments (Figure 6.5 D-F) showed a greater degree of imbalance between moisture at inlet and outlet ends for the highest dose: approximately -9 g and +7 g H<sub>2</sub>O, respectively. This pattern was heightened at the highest O<sub>3</sub>-loading rate (Figure 6.5 G-I): approximately -12 g and +7 g H<sub>2</sub>O, respectively.

The flux of water along the axial distance was reinforced by the balance point (net zero  $\Delta$ H<sub>2</sub>O). At low loading, the axial position for the balance point of water increased from ~15 to 30 cm as the reaction time increased, showing that moisture moved up and out of the column (as evidenced by the 9 g net loss of water from the entire column at the 20 g total dose). The balance point for medium loading also advanced, but at a lower final

position (~25 cm). The balance point of high loading, on the other hand, stalled at ~15 cm, even while the temperature increased still further at the inlet end to 100°C due to both a decrease in water content near the diffusion plate and stalled evaporative cooling. Moreover, the accumulation of water at the outlet end had a detrimental effect on O<sub>3</sub> reactivity at >20cm.<sup>99,192</sup> The finding that moisture impedes ozonation by blocking catalytic surfaces and access to the contaminant target has been shown to be one of the chief hindrances to O<sub>3</sub> transport in the soil column, which was recapitulated here at high loading.<sup>99,192</sup>



Figure 6.5 (A-I). The vertical axis represents distance (cm) from the inlet end, and the horizontal axis represents g of moisture (lost is in orange and gained is in blue). The axes correspond to a column's orientation, i.e., upright (Figure 6.1).

## 6.3.7 Heat Gain and Loss Along the Column

The continuous temperature measurements (Figure 6.4) and changes in moisture content (Figure 6.5) make it possible to compute the net heat generated or lost by a change in temperature (specific heat) and by the latent heat of evaporation or condensation (latent heat) by location and time. The specific heat (kJ) was computed from:

$$Q_{spec} = \Delta T [ (M_{dry \, soil} C_{dry \, soil}) + (M_{water} C_{water}) ] \qquad \text{Equation 6.1}$$

The latent heat (kJ) was:

$$Q_{lat} = M_{water (loss/gain)} L_{water}$$
 Equation 6.2

The net heat (kJ) was calculated from:

$$Q_{net} = \Delta T [ (M_{dry \, soil} C_{dry \, soil}) + (M_{water} C_{water}) ] + M_{water \, (loss/gain)} L_{water}$$
Equation 6.3

where  $\Delta T$  is the temperature change for a given time interval (°C),  $M_{dry \ soil}$  is the mass (g) of dry soil,  $C_{dry \ soil}$  is the specific heat capacity of the dry soil (0.837 J/g/°C),  $M_{water}$  is the mass of water in the fraction,  $C_{water}$  is the specific heat capacity of the water (4.186 J/g/°C),  $L_{water}$  is the latent heat of vaporization for water (2,260 J/g), and  $M_{water \ (loss/gain)}$  is the net change in water for a given time interval at a given position. Latent heat measurements were corrected for moisture losses due to the movement of O<sub>2</sub> gas only, as described in the Appendix F with Figure F and Table F. The moisture adjustment preserved all original trends such that the final reported values for Q<sub>lat</sub> are conservative.

Figure 6.6 (A-I), which presents  $Q_{spec}$ ,  $Q_{lat}$ ,  $Q_{net}$ , and the sum of  $Q_{net}$  along the column, identifies three key trends. First,  $Q_{net}$  was positive for all experiments and

increased with loading rate and dose, such that the highest total heat production occurred at the 20 g dose of high loading (bottom-right panel). Second, increasing the loading rate at each dose level increased the  $Q_{net}$  sum, even though TPH reduction was not increased, as evidenced in Figure 6.3 (A-I). Hence, heat generation likely was the result of O<sub>3</sub> oxidation of hydrocarbons outside the C9-C36 TPH range, particularly with aromatics.<sup>101,120,237</sup> Third,  $Q_{net}$  (Figure 6.6, grey lines) was nearly always net negative at >20cm on the columns in every experiment, indicating that the heat measured at the outlet end was overwhelmingly due to the condensation of heat removed from the inlet end. Heat deposition was primarily due to heat released from condensation, and Q<sub>net</sub> closely tracks latent heat throughout the column. Thus, moisture changes along the reaction path were key to controlling temperature. For example, heat release from the reaction with the low loading rate could be balanced by evaporating moisture such that the inlet, midpoint, and outlet points of the column converged to ~27°C (Figure 6.4 B, C). In contrast, overall heat production for the highest loading rate was great enough that the evaporation could not moderate the temperature rise, particularly in the middle of the column (Figure 6.4 G, H, and I). The high rate of moisture loss at the inlet end was matched by high condensation at the outlet end, effectively blocking evaporative cooling such that high loading became self-limiting with respect to axial transport but selfpropagating with respect to heating at the inlet end. This created a risk for smoldering near the diffusion plate which has been observed previously.99



Figure 6.6 (A-I). Spatial distribution of specific heat and latent released or gained along the column in the same orientation as the experimental design, i.e., upright (Figure 6.1). The vertical axis represents distance (cm) from the inlet, and the horizontal axis represents heat released (+) or lost (-) (J).  $Q_{lat}$  is in blue bars,  $Q_{spec}$  is in red bars, and  $Q_{net}$  is in the grey line. The sum of  $Q_{net}$  for the entire column is listed in kJ.

## 6.4 Summary and Conclusion

The results have immediate applicability to the *in situ* use of  $O_3$  to accelerate the bioremediation of soils contaminated with crude oil. The O3 reaction in the soil column was made more uniform by using a low  $O_3$  concentration and gas phase loading rate. A more uniform reaction improved the O<sub>3</sub>-utilization efficiency for removing TPH in the C9-C36 range. It also lowered the net heat generation, making the temperature more even along the axial direction of the column and minimizing the disparity of moisture content from the inlet to the outlet. Evaporation and condensation of water were crucial to determining the heat balance and temperature as the reaction moved forward. The rate of TPH oxidation, causing heat release, could be well-balanced at the low loading rate, and the temperature did not increase to >35°C. Evaporative heat losses were less able to moderate the temperature for the high loading rate, and a heat pocket with a possible ignition risk occurred, especially near the O<sub>3</sub> inlet, where moisture losses were greatest. Overall, it is clear that O<sub>3</sub> deployment has great potential for in situ oxidation, but concentration, total dose, and moisture dynamics must be balanced to maintain a reaction that reaches the intended treatment zone.

# 7 SUMMARY AND FUTURE WORK

# 7.1 Summary and Implications

The remediation of petroleum hydrocarbons will remain a global concern even as crude oil is displaced in the energy mix by renewables like solar, wind, and hydroelectric.<sup>1-5</sup> Site closure will entail investigation of petroleum contamination and remediation of contaminated soil stockpiles. Oxidation with O<sub>3</sub> is a valuable component of the technology toolbox needed to remediate residuals left from decades of crude oil handling.

I experimentally evaluated a wide range of ozonation conditions for the loss of TPH, utilization of O<sub>3</sub>, and formation of DOC.

Table 7.1 lists the experimental conditions evaluated in Chapters 3 and Chapter 6. In aggregate, O<sub>3</sub> gas was capable of removing 18%-30% of TPH hydrocarbon at single high dose. Chapter 3 demonstrated that increasing the crude oil's API led to improved ozonation efficiency: 5.6, 4.8, and 4.9 g O<sub>3</sub>/gTPHc removed for SJV (API 13-15), ARAB (API 30-32), and ANS (API 29-32), respectively. However, Chapter 6 demonstrated that O<sub>3</sub> concentration was a stronger governing factor over O<sub>3</sub> utilization, as illustrated by the differences at a 20-g dose among low, medium, and high loadings (i.e., via the input O<sub>3</sub> concentration). The over-arching conclusion is that O<sub>3</sub> could remove close to 25% of TPH, regardless of crude API, with dosing strategy being more important than crude oil type.

Crude	API	[O <sub>3</sub> ]	Flow	<b>O</b> <sub>3</sub>	Start	End	% TPH	gO <sub>3</sub> /gTPHc
oil	gravity	(ppmv)	(LPM)	(g)	TPH	TPH	Removal	Removed
ARAB	30-32	17,000	5	5	45,000	44,000	4%	5.0
ARAB	30-32	17,000	5	10	45,000	42,000	8%	4.8
ARAB	30-32	17,000	5	40	45,000	35,000	23%	7.1
ANS	29-32	17,000	5	5	33,000	33,000	1%	25.7
ANS	29-32	17,000	5	10	33,000	30,000	11%	4.9
ANS	29-32	17,000	5	40	33,000	25,000	27%	8.8
SJV	13-15	17,000	5	5	38,000	37,000	2%	10.9
SJV	13-15	17,000	5	10	38,000	35,000	9%	5.6
SJV	13-15	17,000	5	40	38,000	29,000	23%	7.9
ARAB	30-32	10,000	2	5	21,000	18,000	13%	4.1
ARAB	30-32	10,000	2	10	19,000	15,000	20%	5.8
ARAB	30-32	10,000	2	20	21,000	15,000	30%	7.9
ARAB	30-32	30,000	2	5	18,000	17,000	9%	7.0
ARAB	30-32	30,000	2	10	19,000	16,000	17%	6.5
ARAB	30-32	30,000	2	20	20,000	15,000	24%	9.9
ARAB	30-32	84,000	2	5	21,000	19,000	8%	6.5
ARAB	30-32	84,000	2	10	20,000	17,000	10%	11
ARAB	30-32	84,000	2	20	22,000	18,000	18%	11

Table 7.1 Summary of the impacts of  $O_3$  dosage among the three crude oils,  $O_3$  dosages,  $O_3$  concentrations

A key focus of this dissertation is to determine whether ozonation byproducts have toxic effects on seedling germination, since the utility of applying O<sub>3</sub> for large stockpiles of soil is necessarily linked to toxicity of remaining residuals as soils wait for or undergo bioremediation treatment. Chapter 4 focused on screening of three distinct ozonated crude oils (ANS, ARAB, and SJV) for the germination of three seeds (Grass, Lettuce, and Radish). The key finding from Chapter 5 was that radish (*Raphanus lativus* L.) germination was demonstrably affected by the presence of DOC, but not by the presence of remaining petroleum as TPH. These findings were critical in the identification of radish as an indicator species of oxidized petroleum residuals, a result that is greatly relevant to eco-toxicity assessments after petroleum clean-up. Moreover, the differences in radish germination among the oxidized residuals of three distinct crude oils (Chapter 5) were minimal, with only a slight increase in adverse germination effects of oxidized heavy crude oil, SJV. This is an important finding, since it shows that toxicity thresholds maybe broadly applicable among different crude oils when using radish as an indicator species.

The continuous measurements and the categorical variables allowed me to build a multiple logistic regression model of radish germination (in Chapter 5) to assess the relative toxicity of ozonation byproducts (measured as DOC), while controlling for variables like TPH concentration, crude oil type, organic background, and O<sub>3</sub> dose-level. The final model showed that, while absolute concentration of DOC could be used to draw boundaries for risk to germination, lower overall doses of O<sub>3</sub> yielded products that had greater effective toxicity. These results are corroborated by other studies that have shown toxic effect of ozonation of hydrocarbons increasing before they decrease with further oxidation.<sup>139</sup> Organic background content was important to attenuating toxic effects, while petroleum could be excluded from the model entirely. Establishing benchmark doses for adverse effects of oxidized petroleum hydrocarbon is a key step to field deployment of O<sub>3</sub> gas.

Another field concern addressed by this dissertation is  $O_3$  transport within the soil column. For a static contacting scenario in which ozone is being pumped through a given volume of soil, the utilization of  $O_3$  greatly depends on distance, especially at higher concentrations of  $O_3$  as demonstrated in low, medium, and high loading rate experiments in Chapter 6. The use of three distinct doses for each of the three loading rates provided

a timeline of O<sub>3</sub> reactivity across the column length. By looking at the spatial orientation of the reaction, I provided a visualization of reaction position with time. I demonstrated that a lower loading rate improved the efficiency of O<sub>3</sub> utilization and increased O<sub>3</sub>transport distance. These trends suggest that a lower loading rate favored oxidation reactions with TPH over secondary reactions with already oxidized intermediates. Alternatively, a higher loading rate increased oxidation reactions with organics outside the TPH range.

The low loading rate ([O<sub>3</sub>] at 10,000 ppmv) was self-propagating in that heat was evolved from the reaction path and transported out of the column (~45cm); in other words, those columns experienced net cooling. Alternatively, the high loading experiments ([O<sub>3</sub>] at 84,000 ppmv) were self-limiting as demonstrated by net heating. These studies demonstrate that maintaining a heat balance by taking advantage of the high latent heat of water can ensure that the reaction is maintained at a safe temperature (e.g., 35°C in low loading). The alternative is to risk a reaction, particularly at the distribution point, that undergoes a runaway heat spike. These results are relevant to scenarios in which O<sub>3</sub> may be deployed either to treat large batches of soil (e.g., 1000 m<sup>3</sup>) in which gas would have to be contacted with bulk soil volumes or to amend already existing gas-based technologies for *in situ* soil treatment.

In conclusion, ozonation has the potential to be an important technology for remediating soils contaminated with residual crude oil, since O<sub>3</sub> is effective for removing substantial percentages petroleum hydrocarbon. However, the byproducts of ozonation pose ecological toxicity, and radish emerges as an important indicator species that is sensitive to oxidized byproducts but not sensitive to untreated petroleum. The risk of ecological toxicity underscores that importance of coupling ozonation with bioremediation, as the soluble products of ozonation are biodegradable.<sup>83,84,98</sup> The column studies show that O<sub>3</sub>-transport distance, O<sub>3</sub>-utilization efficiency, and heat/moisture balancing can be enhanced by using lower O<sub>3</sub>-loading rates. This is particularly important to bioremediation settings when large volumes of soil must be contacted with O<sub>3</sub> gas over extended periods.

# 7.2 Potential for Field Deployment

This research lays the foundation for a practical means to optimize field deployment of O<sub>3</sub>+bioremediation. The fundamental concept driving a field-practicable application is one in which ozone is delivered intermittently in a series of discrete applications that reduce TPH hydrophobicity and increase its biodegradability. Chen *et al.* showed how a multi-cycle approach can remove TPH and other organic carbon using sequence of biodegradation and ozonation.<sup>98</sup> In this treatment regimen, DOC becomes the dominant substrate for microbial consumption as the concentration of readily biodegradable TPH decreases. While O<sub>3</sub> treatment does not directly enhance the biodegradation rate of the residual TPH after ozonation, the conversion of TPH into DOC makes it possible to utilize microbial activity for greater overall TPH reductions.

One example of a treatment regimen is one in which O<sub>3</sub> generation takes advantage of a pulsed-injection technology applicable for *in-situ* and *ex-situ* applications. For example, pulsed-injection technology was initially developed by Arizona State University as a low-cost, low-Operations and Maintenance (O&M) method for the treatment of dissolved-phase hydrocarbons in groundwater.<sup>252,253</sup> Pulsed injection enabled effective treatment and minimized infrastructure investment to successfully remediate hydrocarbon-contaminated groundwater in a large-scale (500-ft long, 250-injection well) biobarrier application in Port Hueneme, CA.<sup>252</sup> Translating the pulsed-injection technology into a treatment mechanism for soil containing residual weathered petroleum in the soil has great potential. The resulting technology could be utilized *in-situ* for large-scale treatment areas or *ex-situ* as a method to more quickly and more effectively treat stockpiled soils with weathered-petroleum residuals.

My research evaluates key concerns of field-scale deployment, such as a pulsed injection sequence. First, I show important advantages and disadvantages for using a high ozone loading rate versus a low loading rate. The application of a maximum  $O_3$  concentration (10% v/v) over a short treatment time (i.e., a high loading rate) yielded the greatest reductions in TPH for points physically closest to the ozone distribution point. In contrast, applying the same dose of ozone using a lower concentration and longer reaction time (i.e., a low loading rate) enhanced the overall efficiency of  $O_3$  utilization and distributed the reaction over a greater treatment volume. As such, a pulsed-injection scenario utilizing  $O_3$  at the highest concentration (i.e., taking advantage of the maximum generator capacity) will require closely spaced injection points; on the other hand, delivery of  $O_3$  at a lower concentration will improve spatial reach and utilization efficiency requiring fewer wells and treating larger soil volumes.

For *ex situ* settings like land farms or biopiles, the pulsed injection approach may be coupled to gas-extraction wells to aid in containing and distributing  $O_3$  gas, as well as improving timeframes for bioremediation post-contact with O<sub>3</sub>. Soil-gas extraction has been in use for decades as a cost-effective and relatively low-tech strategy for the removal of volatile or semi-volatile contaminants from the vadose zone, where it is termed soil vapor extraction (SVE).<sup>229,254,255</sup> In attempting to remediate heavy weathered crude oil, which is low in volatile elements, SVE is not utilized as a remediation tool. Instead, gas-extraction wells can be used to create a closed injection loop through the subsurface without the need for full containment infrastructure, thereby eliminating the possibility of escaping O<sub>3</sub>. This may be especially useful in low-loading rate scenarios which have proven effluent discharge. Extracted gas can also be monitored for effluent O<sub>3</sub> creating an effective and simple way to determine that O<sub>3</sub> consumption is nearing completion for a given dosing sequence. After a pulse of O<sub>3</sub> is passed through the treatment radius, the pulsed-injection system can be used to introduce air into the treatment zone to meet the minimum needs of aerobic biodegradation *in situ*, or can take the place of tilling in an *ex situ* land-farming scenario.83,84,98

My research provides a picture of the trends in the reaction profile in the direction of gas flow in soil columns. It also outlines a risk management strategy for periods between ozonation and biodegradation. Here, I show minimum distances for treatment, the profile of TPH reduction along the O<sub>3</sub> reaction path, the transfer of heat and the movement of water in the direction of gas flow, all as functions of loading rate and dose. I also demonstrate that, if biodegradation is not completed, the ecological risk of oxidized residuals may be monitored by the impacts on radish germination. Taken together, my loading-rate experiments help determine the O<sub>3</sub>-application strategy, and my risk-assessment model can be utilized to manage risks associated with the generation of oxidized petroleum byproducts.

### 7.3 Future Research

The plateau of O<sub>3</sub> utilization during petroleum treatment must be better understood, especially for *in situ* scenarios. At the molecular scale, this may be understood as a function of the molecular scale transport and reactivity of O<sub>3</sub> at the soilpetroleum interface. While some authors describe agglomerated petroleum particles, it is more likely that petroleum spreads and coats soil surfaces, creating non-aqueous phase liquid (NAPL) on a microscopic scale.<sup>256,257</sup> Asphaltenes and resins stack toward to soil minerals.<sup>160,258</sup> A molecular simulation by Wu et al. showed that the most likely oil distribution on quartz surface was a complex of asphaltenes surrounded by resins, into and out which transported aromatics and saturates. <sup>160</sup> If O<sub>3</sub> transport is limited by the diffusion across a NAPL layer, advanced imaging technologies -- like scanning electron microscopy, spectroscopy of sorbed O<sub>3</sub>, or molecular simulations -- may be helpful to determine the nature of the layer.<sup>256,259,260</sup>

Studies of O<sub>3</sub> reactivity would be greatly aided by measuring hydroxyl radical production directly. The quantitation of radical activity is particularly important for detecting a shift in chemistry from hydroxyl radical attack to direct O<sub>3</sub> attack. While heat

measurements showed an increase in absolute heat production in high loading experiments, this finding was not directly linked to a relative decrease in radical activity in favor of direct O<sub>3</sub> attack. The production of hydroxyl radicals can be tested indirectly by measuring the production of hydroxyl-radical adducts to petroleum hydrocarbons through the use of chemical derivatization and then measurement with high-performance liquid chromatography linked mass spectrometry.<sup>132,248,261,262</sup> Other techniques include direct measurement using liquid chromatography with electrochemical detection and mass spectrometry, gas chromatography with mass spectrometry, capillary electrophoresis, electron spin resonance and chemiluminescence.<sup>263</sup>

Advanced methods for total hydrocarbon characterization are necessary to go beyond the analysis of saturates, aromatics, resins, and asphaltenes (SARA). The fractions of crude oil that may be reacting O<sub>3</sub> may change significantly based on overall composition and dynamically as the reaction of O<sub>3</sub> oxygenates larger molecular groups.<sup>258</sup> Physical approaches take advantage of dominating affects like solubility in solvents of differing polarity. Dichloromethane was used in this dissertation, but this solvent did not capture the initial or changing composition of asphaltenes and resins. For instance, thin layer chromatography with flame ionization detector (TLC/FID) has been shown to be a sensitive indicator of compositional changes of coal derived liquids and may be applicable to the changing composition of petroleum contamination after contacting with O<sub>3</sub> gas.<sup>29</sup>

Once the characteristics of O<sub>3</sub> diffusion at the NAPL surface and the reaction of O<sub>3</sub> with the complete crude oil matrix are better characterized, experimental and

theoretical analysis of O<sub>3</sub> transport in the soil column will be much better understood. While this dissertation explored greater distances than reported elsewhere, it did not ascertain a fundamental limit for O<sub>3</sub> transport and reactivity along the macroscopic scale. Typical soil vapor extraction (SVE) technologies, for instance, can operate from 15 to 100 feet between injection wells.<sup>228,265</sup> At the lower limit, this is 10 times the distance explored here. Hence, building a theoretical and empirical knowledge base of O<sub>3</sub> transport will be key before the technology could be recommended on a large scale. Detailed techno-economic analysis would also be of high value as a means to integrate advancements on the molecular scale and the industrial scale.

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### APPENDIX A

SOIL PHYSICAL AND CHEMICAL DATA

Sieve (Particle Diameter)	Particle Diameter (mm, μM)	Classifica tion	Size Terms (Wentworth, 1922)	% Mass Retained on Sieve	Cumulative % Passing
All particles	All Sizes				2
3/8 in	>9.5 mm	Pebbles	Medium Pebbles and above	0.00%	0.00%
No. 4	9.5 mm – 4.75 mm	_	Medium and Fine Pebbles	0.00%	_
No. 10	4.75 mm – 2 mm		Very fine pebbles	0.00%	_
No. 20	$2\ mm-850\ \mu M$	Sand	Very course/Course Sand	6.25%	71.3%
No. 40	$850 \ \mu M - 425 \ \mu M$	_	Course and Medium Sand	21.30%	_
No. 60	425 μM – 250 μM		Medium Sand	14.91%	_
No. 140	250 μM – 106 μM	_	Fine and Very fine Sand	20.22%	_
No. 200	106 μM – 75 μM		Very fine Sand	8.64%	_
Pan	<75 μM	Silt & Clay	Very fine sand, All Silt, All Clay	28.68%	28.7%
All particles	All Sizes			100.00%	100.00%

Table A.1 Sieve analysis to determine particle size distribution of TS.



Figure A.1 Liquid limit of the test soil (TS).

Table A.2 Plastic limit results of the test soil (TS).

Tri	Сир	Cup+Soil+Water	Cup+Soil	Soil+Water Only	Water	%
al	( <i>g</i> )	(g)	(g)	(g)	(g)	Water
1	14.10	15.95	15.64	1.85	0.31	16.76
2	14.02	18.85	18.07	4.83	0.78	16.15
3	14.19	17.54	17.01	3.35	0.53	15.82



Figure A.2. Soil classification using liquid limit and plastic limit. The red star indicates position for TS, which is classified as a silty-clayey sand (SC-SM), or a "course-grained soil with fines.

# APPENDIX B

# TPH CONCENTRATIONS OF RAW/WEATHERED CRUDE OILS



■ >C22-C24 ■ >C24-C26 ■ >C26-C28 ■ >C28-C30 ■ >C30-C32 ■ >C32-C34 ■ >C34-C36

Figure B. Normalized TPH concentrations for raw (left panels) and weathered (right panels) for (a) ANS, (b) ARAB, and (c) SJV crude oils.

# APPENDIX C

# SUPPLEMENTARY DATA FOR LOGISTIC REGRESSION

#### **Binary Codes**

*Treatment, Dose*, and *Crude* are polychotomous independent variables scaled with k > 2 possible levels. The *k* levels are categories without numeric significance. The method to evaluate such category levels in the logistic regression model is to transform *k* levels into a set of k - 1 design variables. Coded as either 0 or 1, k - 1 design variables can accommodate *k* levels when all design variables are set to zero for the reference cell. Table (a-c) demonstrates the use of reference cell coding for this study. In the logistic regression model, the slope of the logit assessed when a categorical variable is in effect (i.e., when k=1). Although the use of any reference cell yields mathematically equivalent relative comparisons, I selected the category with the lowest probability germination (where possible) as the reference cell to yield whole number odds ratios.

Table C.1. Reference-cell coding for scaled variables Treatment, Dose, and Crude

Treatment (Code)	BS	BSC
Background soil only	1	0
Background soil with crude	0	1
Background soil with oxidized crude	0	0

Dose (Code)	BS	BSC	BSOC-5g	BSOC-10g
Background soil only	1	0	0	0
Background soil with crude	0	1	0	0
Background soil with oxidized crude, 5g	0	0	1	0
Background soil with oxidized crude, 10g	0	0	0	1
Background soil with oxidized crude, 40g	0	0	0	0

Crude (Code)	BS	BSC-ANS	BSC-ARAB
Background soil only	1	0	0
Background soil with untreated ANS crude	0	1	0
Background soil with untreated ARAB crude	0	0	1
Background soil with untreated SJV crude	0	0	0

# Statistical Differences Between Treatment Groups by Seed

	Treatment	No	Yes	Total	Prob.	Odds	OR	Р	95% CI
Radish	TS	61	299	360	0.83	4.90	4.74	0.00	(3.51, 6.40)
	TSC	89	271	360	0.75	3.04	2.95	0.00	(2.25, 3.84)
	TSOC	531	549	1080	0.51	1.03	Base		
Lettuce	TS	120	240	360	0.67	2.00	2.56	0.00	(1.99, 3.28)
	TSC	191	169	360	0.47	0.88	1.13	0.31	(0.89, 1.43)
	TSOC	606	474	1080	0.44	0.78	Base		
Grass	TS	265	95	360	0.26	0.36	1.11	0.44	(0.84, 1.46)
	TSC	285	75	360	0.21	0.26	0.82	0.17	(0.61, 1.09)
	TSOC	817	263	1080	0.24	0.32	Base		

Table C.2. Probabilities, Odds, and Odds Ratios (OR) between treatment groups for Radish, Lettuce, and Grass.

### Statistical Differences Between Raw and Ozonated Crude by Seed

	Treatment	No	Yes	Total	Prob.	Odds	OR	Р	95% CI
Radish	TSC-ANS	26	94	120	0.78	3.62	3.13	0.00	(1.93, 5.06)
	TSOC-ANS	167	193	360	0.54	1.16	Base		
	TSC-ARAB	19	101	120	0.84	5.32	4.60	0.00	(2.70, 7.83)
	TSOC-ARAB	167	193	360	0.54	1.16	Base		
	TSC-SJV	44	76	120	0.63	1.73	2.09	0.00	(1.36, 3.19)
	TSOC-SJV	197	163	360	0.45	0.83	Base		

Table C.4. Probability, Odds, and OR for Lettuce germination by crude/oxidized crude.

	Treatment	No	Yes	Total	Prob.	Odds	OR	Р	95% CI
Lettuce	TSC-ANS	58	62	120	0.52	1.07	1.28	0.25	(0.84, 1.93)
	TSOC-ANS	196	164	360	0.46	0.84	Base		
	TSC-ARAB	62	58	120	0.48	0.94	0.93	0.71	(0.61, 1.39)
	TSOC-ARAB	179	181	360	0.50	1.01	Base		
	TSC-SJV	71	49	120	0.41	0.69	1.24	0.33	(0.80, 1.88)
	TSOC-SJV	231	129	360	0.36	0.56	Base		

Table C.5. Probability, Odds, and OR for Grass germination by crude/oxidized crude.

	Treatment	No	Yes	Total	Prob.	Odds	OR	Р	95% CI
Grass	TSC-ANS	108	12	120	0.10	0.11	0.44	0.01	(0.23, 0.85)
	TSOC-ANS	288	72	360	0.20	0.25	Base		
	TSC-ARAB	94	26	120	0.22	0.28	1.00	1.00	(0.60, 1.65)
	TSOC-ARAB	282	78	360	0.22	0.28	Base		
	TSC-SJV	83	37	120	0.31	0.45	0.97	0.91	(0.62, 1.52)
	TSOC-SJV	247	113	360	0.31	0.46	Base		

# Statistical Differences Between Ozonated Group by Dose and Seed

Table C.6 Probability,	Odds, and OR for	germination by	y TSOC dose.	Highest dose is	s the
base for all seeds.					

	Dose	No	Yes	Total	Prob.	Odds	OR	Ρ	95% CI
Radish	5g Ozone	161	199	360	0.55	1.24	1.49	0.01	(1.11, 2.00)
	10g Ozone	173	187	360	0.52	1.08	1.31	0.07	(0.97, 1.75)
	40g Ozone	197	163	360	0.45	0.83	Base		
Lettuce	5g Ozone	221	139	360	0.39	0.63	0.85	0.29	(0.63, 1.14)
	10g Ozone	178	182	360	0.51	1.02	1.38	0.03	(1.03, 1.85)
	40g Ozone	207	153	360	0.43	0.74	Base		
Grass	5g Ozone	276	84	360	0.23	0.30	0.96	0.79	(0.67, 1.34)
	10g Ozone	268	92	360	0.26	0.34	1.08	0.67	(0.76, 1.51)
	40g Ozone	273	87	360	0.24	0.32	Base		

# APPENDIX D

THE LOGISTIC REGRESSION METHOD

#### The Simple Logistic Regression Model

Linear regression determines the mean value of an outcome variable Y given a specific value for the independent variable x. This "expected value of Y given x" is a conditional mean and can be expressed as E(Y|x). An example of the equation of the line with an intercept  $\beta_0$  and a single independent variable  $\beta_1$  in the linear regression model is:

$$E(Y|x) = \beta_0 + \beta_1 x$$
 Equation D.1

Equation I.1 implies that (1) as x varies from  $-\infty$  to  $+\infty$ , so does Y and (2) that the equation is linear in x. I compare this to a logistic-regression scenario, in which the outcome Y is coded as either 1 or 0. Here, the scatterplot of Y by x falls along two lines: a set of values for the independent variable x when the outcome is present (Y = 1) and another set of x values when the outcome is absent (Y = 0). If x is a good predictor of Y, those two scatterplots will have greater separation along x.

To achieve some of the useful properties of the linear-regression method, the first step of logistic regression is to reframe the dichotomous *Y* values as a set of numbers that can vary along a single line. This is achieved if *Y* is expressed as the cumulative probability of the positive outcome (*Y* = 1) along *x*. In other words, the expression E(Y = 1|x)must denote the "conditional probability that the outcome is present given *x*". In simpler notation, E(Y = 1|x) is represented by  $\pi(x)$ .

This transformation has limitations, however. For the plot of  $\pi(x)$  along x, the continuous predictor x can vary from  $-\infty$  to  $+\infty$ , but the conditional probability  $\pi(x)$  can only vary between 0 to 1 (i.e.,  $0 \le \pi(x) \le 1$ ). Moreover, as  $\pi(x)$  approaches its lower and upper boundaries, the change in the conditional probability per unit change in

*x* becomes smaller, yielding a more gradual slope. Instead of a line, the plot of  $\pi(x)$  by *x* resembles an S-shaped curve. The functional form of that curve is one derived from the logistic distribution:

$$\pi(x) = \frac{e^{\beta_0 + \beta_1 x}}{1 + e^{\beta_0 + \beta_1 x}}$$
 Equation D.2

To regain some of the useful attributes of a linear model, the logistic regression method uses another transformation called the "logit transformation," one that is central to the procedure. This transformation, in terms of  $\pi(x)$ , is:

$$g(x) = \ln\left(\frac{\pi(x)}{1-\pi(x)}\right) = \beta_0 + \beta_1 x$$
 Equation D.3

By this transformation, the logit, g(x), becomes linear in its parameters, can be continuous, and can range from  $-\infty$  to  $+\infty$ ; it can also adhere to some of the principles that guide linear regression. If I denote the probability of the positive outcome as  $Pr(Y = 1|x) = \pi(x)$ , the multiple logistic-regression model (with *p* independent variables) is given by:

$$g(x) = \ln\left(\frac{\pi(x)}{1-\pi(x)}\right) = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_p x_p \text{ Equation D.4}$$

where  $\pi(x) = \frac{e^{g(x)}}{1 + e^{g(x)}}$ . If the collection of *p* independent variables (also called "covariates") in a multivariable model can be denoted by the following vector:

$$\mathbf{x}' = (x_1, x_2, \dots, x_p)$$
 Equation D.5

then the collection of coefficients (also called "parameters") of those variables can be denoted by:

$$\beta' = (\beta_0, \beta_1, \beta_2, \dots \beta_p)$$
 Equation D.6
The goal of logistic-regression modeling is to find the best collection of independent variables x' to predict g(x) and to find the best estimates for the coefficients of those variables in the set  $\beta'$ .

#### The log-likelihood

Linear regression uses the least squares function to find the unknown parameters that minimize the sum-of-squared deviations of the observed values from predicted values for a given model. The least-squares function is derived from a general method of estimation called *maximum likelihood;* this general method is also used to estimate values of predictive parameters in logistic regression.

In the context of logistic regression, the method of *maximum likelihood* yields a likelihood function, called  $l(\beta')$ , that expresses the probability of the observed data as a function of the set of unknown parameters  $\beta'$ . The objective is to find the set of values of  $\beta'$  that maximize  $l(\beta')$ . In practice, this is done by taking the log of the likelihood function  $l(\beta')$ , denoted  $L(\beta')$  and differentiating  $L(\beta')$  with respect to the unknown parameters (e.g.,  $\beta_0, \beta_1, \beta_2, ..., \beta_p$ ). The resulting equations (one for each parameter) are set to zero and solved for a set of *maximum likelihood estimators* called  $\hat{\beta}'$ . This process is iterative and requires statistical software.

I used Stata v. 16.1 (College Station, Texas) to find the values for the log-likelihood  $L(\beta')$  and the estimated coefficients  $\hat{\beta}'$ . The software provides estimates for the standard errors ( $\widehat{SE}$ ) of each coefficient in the model from the matrix of second partial derivative of the log-likelihood function as well as their respective 95% confidence intervals:

$$\hat{\beta} \pm z_{1-\alpha/2}\widehat{SE}(\hat{\beta})$$
 Equation D.7  
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where  $z_{1-\alpha/2}$  is the upper 100(1 –  $\alpha/2$ )% point from the standard normal distribution (i.e., 1.96). The value of the log-likelihood  $L(\beta')$  reflects the probability that the data would give the estimated parameters. A theoretically perfect (or saturated) model has a log-likelihood of zero ( $L(\beta') = 0$ ). Thus, the closer the value of log-likelihood is to 0, the better is the model.

#### **Building the logistic regression model**

When log-likelihood is multiplied by -2, it yields a statistic called the deviance (D), which follows a chi-square distribution with p degrees of freedom (equal to the number of variables in the model, not including the constant  $\beta_0$ ). The deviance D and the set of estimates  $\hat{\beta}'$  are the foundation of model building in logistic regression by a simple test called the *likelihood ratio*. The *likelihood ratio* produces the statistic G, which is chi-square distributed with degrees of freedom equal to the *difference* in the number of independent variables between the two models being compared:

 $G = D(model without the variable) - D(model with the variable)^{bb}$ 

Equation D.8

I used the statistic G in two important ways. First, I tested the importance of each independent variable of interest by subtracting the deviance of the univariable fitted model from the deviance of the intercept-only model:

$$G = Deviance_{g(x)=\beta_0} - Deviance_{g(x)=\beta_0+\beta_1 x}$$
 Equation D.9

 $G = -2\ln\left[\frac{(\text{likelihood of model without the variable})}{(\text{likelihood of model with the variable})}\right]$ 

<sup>&</sup>lt;sup>bb</sup> The likelihood ratio test gets its name from the following expression for *G*:

In this case of simple logistic regression, I test the null hypothesis that  $\beta_1 = 0$  against the alternative hypothesis that  $\beta_1 \neq 0$ ; the statistic *G* follows the chi-square distribution with 1 degree of freedom.

The likelihood ratio also allowed us to test whether any single coefficient in the set p coefficients for a multivariable model was equal to zero:

$$G = Deviance_{g(x)=\beta_0} - Deviance_{g(x)=\beta_0+\beta_1x_1+\beta_2x_2+\dots+\beta_px_p}$$

#### Equation D.10

Here, I tested the null hypothesis that all p coefficients are equal to zero against the alternative hypothesis that at least one coefficient is not equal to zero; the statistic G follows the chi-square distribution with p degrees of freedom.

The likelihood ratio allowed us to systematically build a logistic regression model by adding and removing coefficients and testing the significance of *G* using the *partial likelihood ratio test*:

$$G = Deviance_{g(x)=\beta_0+\beta_1x_1} - Deviance_{g(x)=\beta_0+\beta_1x_1+\beta_2x_2+\beta_3x_3}$$

#### Equation D.11

In the above case, I tested the null hypothesis that either  $\beta_2$  or  $\beta_3$  is equal to zero, against the alternative hypothesis that at least one of the added variables did not equal zero; the statistic *G* follows the chi-square distribution with 2 degrees of freedom. The *likelihood ratio* (*LLR*) *test* determined the overall significance of *p* coefficients in each model.

In summary, these tests (Equations I.9 to I.11), used in conjunction with the Chisquared table, tested the null hypothesis that any additional coefficients beyond that represented by the base model equal zero. The alternative hypothesis was that at least one of the added covariates had a coefficient that did not equal zero.

The univariable Wald test statistic (z) tested each individual variable for significance:

$$W_j = \frac{\widehat{\beta}}{\widehat{SE}_{\widehat{\beta}}}$$
 Equation D.12

The Wald test examined the null hypothesis that a given coefficient was zero and followed the standard normal distribution. It was used to evaluate each covariate in a multi-variable model.

Finally, the degree of statistical adjustment (i.e., *controlling for confounding*) was determined by looking at the relative change in the value of a coefficient between models. This occurred when a model contained a covariate, "d", that was important to the overall log-likelihood, and another covariate, "a," the adjustment covariate, that was not important to the predictive value of the model overall but affected the value of the coefficient "d". The coefficient of "d" in a model without the adjustment variate "a" was  $\hat{\theta}_1$ , while the coefficient of "d" in a model that contained the adjustment variate "a" was  $\hat{\beta}_1$ . The degree to which the presence of the covariate "a" in a model changed the value of the value of the coefficient of "d" is known as delta-beta-hat-percent and was determined from:

$$\Delta \hat{\beta} \% = 100 \left( \frac{\hat{\theta}_1 - \hat{\beta}_1}{\hat{\beta}_1} \right)$$
 Equation D.13

If the presence of "a" in the model changed the coefficient of "d" by more than some set minimum, then the covariate "a" was used to adjust the value of "d." The minimum % change was set to 20%.

#### **Preliminaries**

### Step 0. The independent covariates

Table J.1 demonstrates the use of reference cell coding for these variables. Any reference level yields mathematically equivalent relative comparisons; reference levels are noted in the table below. The blank test soil (*TS*) served as the control and was the reference cell against which all other levels were compared for the variable *TREATMENT* (k = 5; k - 1 = 4). The 0% Test soil (i.e., 100% potting mix) was the reference cell against which all other levels were compared for the parameter *b*-*ORGANIC* (k = 6; k - 1 = 5). The variables and their levels are listed in Table J.2. The equations of the line for each of the individual variables tested are listed in Table J.3.

(a) TREATMENT (Code)		BSC	BSOC-5g	BSOC-10g	BSOC-40g
Background soil only (Base)		0	0	0	0
Background soil with crude		1	0	0	0
Background soil with oxidized crude,	5g	0	1	0	0
Background soil with oxidized crude,	10g	0	0	1	0
Background soil with oxidized crude,	40g	0	0	0	1
(b) b- ORGANIC (Code)	10%	20%	60%	90%	100%
0% Test / 100% Organic (base)	0	0	0	0	0
10% Test / 900% Organic	1	0	0	0	0
20% Test / 80% Organic	0	1	0	0	0
60% Test / 40% Organic	0	0	1	0	0
90% Test / 10% Organic	0	0	0	1	0
100% Test / 0% Organic	0	0	0	0	1

Table D.1. Reference-cell coding for scaled variables *TREATMENT* and *b-ORGANIC* 

Covariate	Туре	Increment
ТРНс	Continuous	per 1000 ppm C
DOC	Continuous	per 1000 ppm C
TREATMEN T	Categorical $(k - 1 = 4 \ levels)$	TS (base)
		TSC
		TSOC+5 g Ozone
		TSOC+10 g Ozone
		TSOC+40 g Ozone
b-ORGANIC	Categorical $(k - 1 = 5 \ levels)$	0% Test / 100% Organic (base)
		10% Test / 90% Organic
		20% Test / 80% Organic
		60% Test / 40% Organic
		90% Test / 10% Organic
		100% Test / 0% Organic

Table D.2. Individual variables tested in the multiple logistic regression model

Table D.3. Equations of the line for each of individual variable tests

1	
Covariate	Univariable Model
ТРНс	$\hat{g}(x) = \hat{\beta}_0 + \hat{\beta}_{TPHc} x_{TPHc}$
DOC	$\hat{g}(x) = \hat{\beta}_0 + \hat{\beta}_{DOC} x_{DOC}$
TREATMENT*	$\hat{g}(x) = \hat{\beta}_0 + \hat{\beta}_{TSC} x_{TSC} + \hat{\beta}_{TSOC-5g  0_3} x_{TSOC-5g  0_3} +$
	$\widehat{\beta}_{TSOC-10gO_3} x_{TSOC-10gO_3} + \widehat{\beta}_{TSOC-40gO_3} x_{TSOC-40gO_3}^{**}$
<i>b-ORGANIC</i> **	$\hat{g}(x) = \hat{\beta}_0 + \hat{\beta}_{10\%} x_{10\%} + \hat{\beta}_{20\%} x_{20\%} + \hat{\beta}_{60\%} x_{60\%} + \hat{\beta}_{90\%} x_{90\%} +$
	$\hat{eta}_{100\%} x_{100\%}^{***}$

 $^*TS$  is base of categorical comparisons. When all other variables are 0, the interceptonly represents *TS*.

\*\*0% *Test Soil/100% Potting Soil* is base of categorical comparisons. When all other variables are 0, the intercept-only represents 0% *Test Soil/100% Potting Soil*.

## **Model Construction**

## Step 1. Univariable analysis of each independent variable

Table D.4. Results of fitting the univariable logistic regression model ( $n = 840$ )							
Covariate	Units	Coeff	Std. Err.	G(df)	$p^{***}$		
TPHc**	per 1000 ppm	0.125	0.00877	266 (1)	< 0.000		
DOC	per 1000 ppm	1.49	0.131	305 (1)	< 0.000		
TREATMENT	TS	Base		80.6 (4)	< 0.000		
	TSC	0.304	0.262				
	TSOC-5g	1.49	0.231				
	TSOC-10g	1.29	0.232				
	TSOC-40g	1.56	0.230				
b-ORGANIC	100%	Base		308 (5)	< 0.000		
	90%	-0.379	0.508				
	80%	0.445	0.427				
	40%	1.54	0.380				
	10%	2.68	0.369				
	0%	3.91	0.389				

Table D.4. Results of fitting the univariable logistic regression model  $(n = 840)^*$ 

\*Intercept-Only Loglikelihood is -515 for all variables.

\*\*TPH is input into the model as mass of carbon in the TPH (TPHc), or approximately 85% of the TPH by mass.

\*\*\*\*Stata does show more than 3 decimal places for the p-value

## Step 2. The multivariable model

	Units	Coeff	Std. Err.	Wald (z)	$P^{***}$	95% CI
TPHc**	per 1000 ppm	0.0068 9	0.0251	0.270	0.784	(-0.0423, 0.0562)
DOC	per 1000 ppm	1.99	0.355	5.60	0.000	(1.29, 2.68)
TREATMEN T	TS	Base				
	TSC	0.122	0.588	0.210	0.835	(-1.03, 1.27)
	TSOC-5g	0.865	0.474	1.82	0.068 0	(-0.0640, 1.79)
	TSOC-10g	-0.572	0.565	-1.01	0.312	(-1.68, 0.536)
	TSOC-40g	-2.34	0.952	-2.46	0.014 0	(-4.20, -0.474)
b-ORGANIC	100%	Base				
	90%	-0.605	0.516	-1.17	0.241	(-1.62, 0.405)
	80%	- 0.0462	0.444	-0.100	0.917	(-0.917, 0.824)
	40%	-0.710	0.540	-1.31	0.189	(-1.77, 0.348)
	10%	0.933	0.517	1.80	0.071 0	(-0.0803, 1.95)
	0%	2.84	0.492	5.77	0.000	(1.87, 3.80)

Table D.5. Results of fitting the multivariable logistic regression model  $(n = 840)^*$ 

\*Intercept-only loglikelihood is -514, the log-likelihood of the model is -260, and G (df = 11) is 510 for the model, statistically significant at  $\rho < 0.000$ .

\*\*TPH is input into the model as mass of carbon in the TPH (TPHc), approximately 85% of the TPH by mass.

\*\*\*Stata does show more than 3 decimal places for the p-value

	Category	Full Model	Reduced Model	$\Delta \hat{eta}$	Comment
ТРНс	Dropped				
DOC	Continuou s	1.99	2.03	- 2.07%	
TREATMEN T	TS	Base			
-	TSC	0.122	0.256	- 110%	TPHc2 is a modifier
	TSOC-5g	0.865	0.941	- 8.74%	
	TSOC-10g	-0.572	-0.526	7.96%	
	TSOC-40g	-2.34	-2.37	- 1.19%	
b-ORGANIC	100%	Base			
	90%	-0.605	-0.597	1.22%	
	80%	-0.0462	-0.0278	39.8%	TPHc2 is modifier
	40%	-0.710	-0.665	6.35%	
	10%	0.933	0.998	- 7.03%	
	0%	2.84	2.90	- 2.13%	

# *Step 3. Evaluation for Confounding (Delta-Beta-Hat%)* Table D.6a Delta-beta-hat-percent

	Category	Full Model	Reduced Model	$\Delta \hat{eta}$	Comment
ТРНс	Continuo us	0.00689	0.0354	- 414%	DOSE is a modifier
DOC	Continuo us	1.99	1.26	36.7%	DOSE is a modifier
TREATME NT		Dropped			
b-ORGANIC	100%	Base			
	90%	-0.605	-0.672	- 11.2%	
	80%	-0.0462	-0.200	-334%	DOSE is modifier
	40%	-0.710	-0.379	46.6%	DOSE is modifier
	10%	0.933	1.03	- 10.6%	
	0%	2.84	2.81	0.875 %	
ТРНс	Continuo us	0.00689	0.0839	- 1120 %	ORGANIC is a modifier
DOC	Continuo us	1.99	1.60	19.3%	
TREATMEN T	TS	Base			
	TSC	0.122	-1.32	1190 %	ORGANIC is a modifier
	TSOC-5g	0.865	-0.894	203%	ORGANIC is a modifier
	TSOC- 10g	-0.572	-2.17	-279%	ORGANIC is a modifier
	TSOC- 40g	-2.34	-3.41	- 45.6%	ORGANIC is a modifier
<b>b-ORGANIC</b>		Dropped			

Table D.6b Delta-beta-hat-percent (continued)

## Step 4. Establishing the preliminary main-effects model

Table D.7. Results of fitting the multivariable logistic regression model with *b*-

Covariate	Unit	Coef.	Std. Err.	Wald (z)	р	95% CI
ТРНс	per 1000 ppm	0.0013 1	0.0234	0.0600	0.955	(-0.0444, 0.047)
DOC	per 1000 ppm	1.73	0.305	5.68	0.000	(1.14, 2.33)
TREATMENT	TS	Base				
	TSC	0.184	0.569	0.320	0.747	(-0.932, 1.30)
	TSOC-5g	0.929	0.452	2.06	0.040 0	(0.0433, 1.82)
	TSOC-10g	-0.424	0.534	-0.790	0.427	(-1.47, 0.623)
	TSOC-40g	-1.83	0.834	-2.19	0.028 0	(-3.46, -0.193)
b- ORGANIC_2	Organic<10 %	Base				
	Organic>10 %	-2.30	0.301	-7.64	0.000	(-2.89, -1.71)

*ORGANIC* variable condensed to *b-ORGANIC*\_2 (n=840)<sup>\*</sup>

\*Intercept-only loglikelihood is -515, the log-likelihood of the model is -278, and G(df=7) is 474 for the model, statistically significant at  $\rho$ <0.000.

\*\*TPH is input into the model as mass of carbon in the TPH (TPHc), approximately 85% of the TPH by mass.

\*\*\*Stata does show more than 3 decimal places for the p-value.

Table D.8. Results of fitting the multivariable logistic regression model with

Covariate	Unit	Coef.	Std. Err.	Wald (z)	$P^{***}$	95% CI
TPHc**	per 1000 ppm	0.0077 1	0.0123	0.620	0.53 2	(-0.0165, 0.0319)
DOC	per 1000 ppm	1.69	0.264	6.39	0.00 0	(1.17, 2.20)
<i>TREATMENT_</i> 2	TS/TSC	Base				
	TSOC-5g	0.846	0.368	2.30	0.02 2	(0.124, 1.57)
	TSOC-10g	-0.479	0.503	-0.950	0.34 1	(-1.47, 0.507)
	TSOC-40g	-1.80	0.821	-2.20	0.02 8	(-3.41, -0.196)
<i>b-ORGANIC_2</i>	Organic<10 %	Base				
	Organic>10 %	-2.26	0.275	-8.22	$\begin{array}{c} 0.00 \\ 0 \end{array}$	(-2.80, -1.72)

*TREATMENT* variable condensed to *TREATMENT*\_2 (n = 840)<sup>\*</sup>

\*Intercept-only loglikelihood is -515, the log-likelihood of the model is -279, and G(df=6) is 474 for the model, statistically significant at  $\rho < 0.000$ .

\*\*TPH is input into the model as mass of carbon in the TPH (TPHc), approximately 85% of the TPH by mass.

\*\*\*Stata does show more than 3 decimal places for the p-value

Covariate	Units	Full	Reduced	Delta-Beta-Hat-Percent
ТРНс	per 1000 ppm	0.0077109	Dropped	n/a
DOC	per 1000 ppm	1.69	1.76	4.14%
TREATMENT_2	TS/TSC	Base		
	TSOC-5g	0.846	0.876	3.51%
	TSOC-10g	-0.479	-0.493	2.89%
	TSOC-40g	-1.80	-1.93	6.52%
b-ORGANIC_2	Organic<10%	Base		
	Organic>10%	-2.26	-2.30	1.64%

Table D.9. Delta-beta-hat-percent for *TPHc* removal.

Step 5. Linearity of the logit for continuous variables/the main effects model.



Figure D.1. Lowess smooth on the log-odds scale of the outcome, radish germination, versus DOC (per 1000 ppm), n = 600.

	df	Deviance	diff.	р	Powers	
omitted	4	556	4.98	0.290		
linear	4	556	4.98	0.290	1	
m = 1	2	552	0.979	0.613	3	
<i>m</i> = 2	0	551	0		0.5	2

Table D.10a. Fractional polynomial analysis of linearity of DOC in the logit.

Table D.10b Fractional polynomial analysis of linearity of DOC in the logit

Covariate	Units	Coef.	Std. Err.	Wald (z)	р	95% CI
DOC	per 1000 ppm	-1.15	1.76	-0.660	0.512	(-4.60, 2.29)
TREATMENT_ 2	TS/TSC	Base				
	TSOC-5g	1.14	0.421	2.71	0.007	(0.316, 1.96)
	TSOC-10g	- 0.0517	0.559	-0.0900	0.926	(-1.15, 1.04)
	TSOC-40g	-2.63	1.24	-2.12	0.034 0	(-5.05, -0.202)
b-ORGANIC_2	Organic<10 %	Base				
	Organic>10 %	-2.26	0.303	-7.44	0.000	(-2.85, -1.66)
DOC	m=1	2.06	1.84	1.12	0.264	(-1.55, 5.68)
DOC	m=2	0.625	0.320	1.95	0.051	(-0.00276, 1.25)

\*Intercept-only loglikelihood is -515, the log-likelihood of the model is -276, and G(df=5) is 479 for the model, statistically significant at  $\rho$ <0.000.

\*\*TPH is input into the model as mass of carbon in the TPH (TPHc), approximately 85% of the TPH by mass.

## Step 6. Interactions between terms are systemically checked/preliminary final model.

	Category	Coeff	Std. Err.	Wald (z)	р	95% CI
DOC	per 1000 ppm	5.70	2.47	2.31	0.021	(0.859, 10.5)
TREATMENT _2	TS/TSOC	Base				
	TSOC-5g	1.75	0.445	3.92	0.000	(0.872, 2.62)
	TSOC-10g	- 0.688	0.800	-0.86	0.390	(-2.26, 0.879)
	TSOC-40g	-2.67	1.35	-1.98	0.048	(-5.32, - 0.0293)
b- ORGANIC_2	Organic<10%	Base				
	Organic>10%	-2.18	0.325	-6.70	0.000	(-2.82, -1.54)
Interaction	DOC x TS/TSC	Base				
	DOC x TSOC- 5g	-4.91	2.41	-2.03	0.042	(-9.63, - 0.178)
	DOC x TSOC- 10g	-3.59	2.48	-1.45	0.148	(-8.45, 1.28)
	DOC x TSOC- 40g	-3.55	2.51	-1.42	0.156	(-8.47, 1.36)
	LL Interactions	-273		G	-0.17	
	LL Model	-278		p- value	0.019 6	

Table D.11 Results of fitting the multivariable model with interaction term *DOC x TREATMENT\_2* 

	Category	Coeff	Std. Err.	Wald	р	95% CI
DOC	per 1000 ppm	1.68	0.347	4.83	0.00 0	(0.997, 2.36)
<i>TREATMENT</i> _2	TS/TSOC	Base				
	TSOC-5g	0.893	0.369	2.42	0.01 5	(0.170, 1.62)
	TSOC-10g	- 0.487	0.509	-0.96	0.33 9	(-1.49, 0.511)
	TSOC-40g	-1.99	0.852	-2.34	0.01 9	(-3.66, - 0.323)
b- ORGANIC_2	Organic<10%	Base				
	Organic>10%	-2.34	0.299	-7.82	0.00 0	(-2.93, -1.75)
Interaction	DOC x Organic<10%	Base				
	DOC x Organic>10%	0.117	0.367	0.32	0.75 1	(-0.603, 0.836)
	LL Interactions	-278		G	- 0.64	
	LL Model	-278		p- value	0.75 5	

Table D.12. Results of fitting the multivariable model with interaction term *DOC x b*-*ORGANIC\_2*.

Table D.13. Results of fitting the multivariable model with interaction term

TREATMENT x b-ORGANIC\_2.

	Category	Coeff	Std. Err.	Wal d	р	95% CI		
DOC	per 1000 ppm	1.88	0.280	6.72	0.00	(1.33, 2.43)		
TREATMENT	TS/TSOC	Base						
	TSOC-5g	- 0.470	0.641	- 0.73	0.46 4	(-1.73, 0.786)		
	TSOC-10g	- 0.633	0.548	- 1.15	0.24 9	(-1.71, 0.442)		
	TSOC-40g	-2.12	0.903	- 2.34	0.01 9	(-3.89, - 0.347)		
b- ORGANIC_2	Organic<10%	Base						
	Organic>10%	-2.47	0.297	- 8.33	0.00 0	(-3.06, -1.89)		
Inter.	TS/TSC x Org<10%	Base						
	TS/TSC x Org >10%	Base						
	TSOC-5g x Org <10%	Base						
	TSOC-5g x Org >10%	1.65	0.680	2.43	0.01 5	(0.320, 2.99)		
	TSOC-10g x Org <10%	Empty						
	TSOC-10g x Org >10%	Omitted						
	TSOC-40g x Org <10%	Empt y						
	TSOC-40g x Org >10%	Omitted						
	LL Interactions	-274	G	G Obs differ: 760 vs. 840				
	LL Model	-278	p-value	n/a				





Figure D.2. Receiver operating characteristic (ROC) curve of Radish germination by the model.

# APPENDIX E COLUMN AND COLUMN BREAKDOWN



Figure E. The soil column after during ozonation experiments, including the five sections sampled at the end of the experiment.

## APPENDIX F

## LATENT HEAT ADJUSTMENT FOR MOISTURE LOSS

#### **Prediction of Moisture Flux**

An oxygen  $(O_2)$  only control column was run for 240 minutes to evaluate the effect of gas-flow on moisture changes across the column, without the element of heating. The column was evaluated in 5 segments for the change in moisture and the normalized results are graphed in Figure L to evaluate the slope changes.



Figure F. Normalized changes in column moisture over time for each column segment. Equations of the lines predict moisture (y) at given time (x) for 40 cm (y = 0.0005x + 1), 30 cm (y = -0.0001x + 1), 20 cm (y = -0.0001x + 1), 10 cm (y = -0.0005x + 1), and 0 cm (y = -0.0008x + 1).

The equation for the trendline shown in Figure L at each column segment was used to predict changes in moisture due to the flow of O<sub>2</sub> gas-only as a function of time. Table L shows the changes in absolute mass of H<sub>2</sub>O (from starting mass of ~6 g), expected for a given loading rate, time (i.e., total dose), and column position. Predictably,

changes are most significant at low loading, where gas-flow is the longest duration. The

final total moisture values in each experiment were adjusted by the amount of H<sub>2</sub>O

lost/gained due to gas flow of gas-only such that latent heat calculations for

evaporation/condensation increased from 0-30cm and decreased at >40 cm. These

moisture adjustments do not change trends and, in fact, decrease the degree of difference

observed between experimental groups. Hence, reported values for  $Q_{lat}$  are conservative.

Table F. Mass of H<sub>2</sub>O (g) change due to the flow of O<sub>2</sub> gas-only. The negative (-) values of moisture noted below are added back in to final moisture such that 0-30 cm is increased by the moisture lost and >40 cm is decreased by the water gained through the flow of gas-only.

	Time (min)	0 cm	10 cm	20 cm	30 cm	>40 cm
Low Loading	120 (5 g O <sub>3</sub> )	-0.58	-0.36	-0.07	-0.07	0.36
	240 (10 g O <sub>3</sub> )	-1.15	-0.72	-0.14	-0.14	0.72
	480 (20 g O <sub>3</sub> )	-2.30	-1.44	-0.29	-0.29	1.44
Medium Loading	40 (5 g O <sub>3</sub> )	-0.19	-0.12	-0.02	-0.02	0.12
	80 (10 g O <sub>3</sub> )	-0.38	-0.24	-0.05	-0.05	0.24
	160 (20 g O <sub>3</sub> )	-0.77	-0.48	-0.10	-0.10	0.18
High Loading	15 (5 g O <sub>3</sub> )	-0.07	-0.04	-0.01	-0.01	0.04
	30 (10 g O <sub>3</sub> )	-0.14	-0.09	-0.02	-0.02	0.09
	60 (20 g O <sub>3</sub> )	-0.29	-0.18	-0.04	-0.04	0.18