

# Correlating Ignition Properties with Critical Species Concentrations

Zachary Buras, Nils Hansen, Dario Lopez Pintor, Leonid Sheps and Craig Taatjes

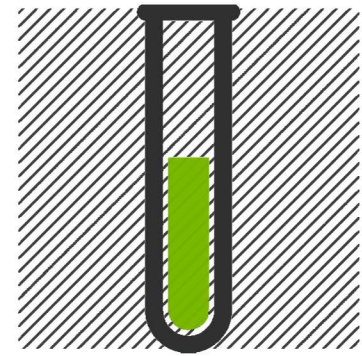


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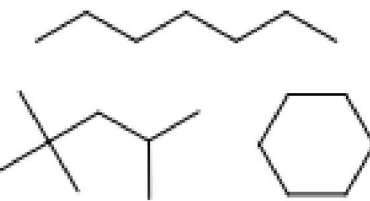
# Vision for an Ideal Fuel Screening Platform

## Realistic Candidate Fuel

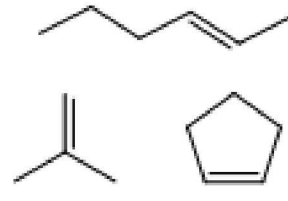


Mix of 100's of Chemical Species

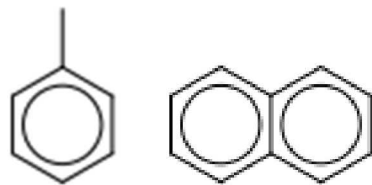
### Alkanes



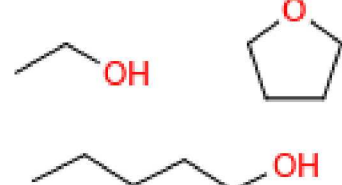
### Alkenes



### Aromatics



### Oxygenates

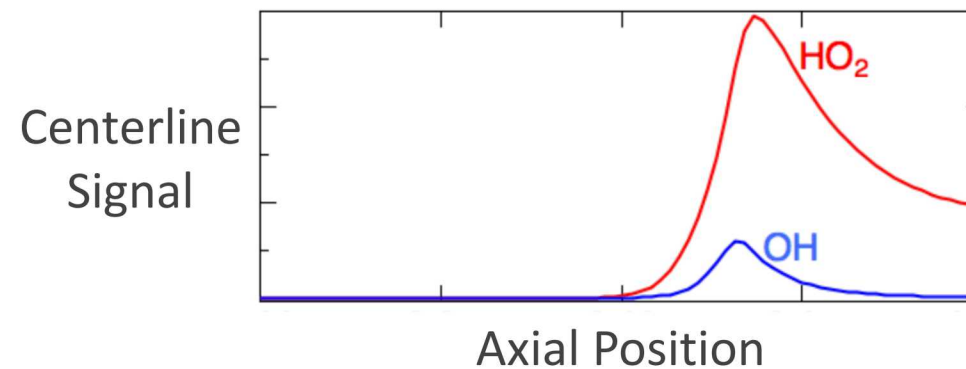
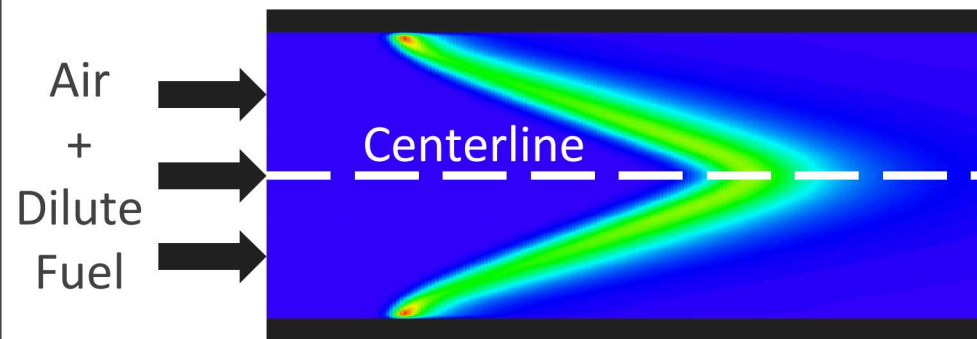


## Ideal Screening Platform:

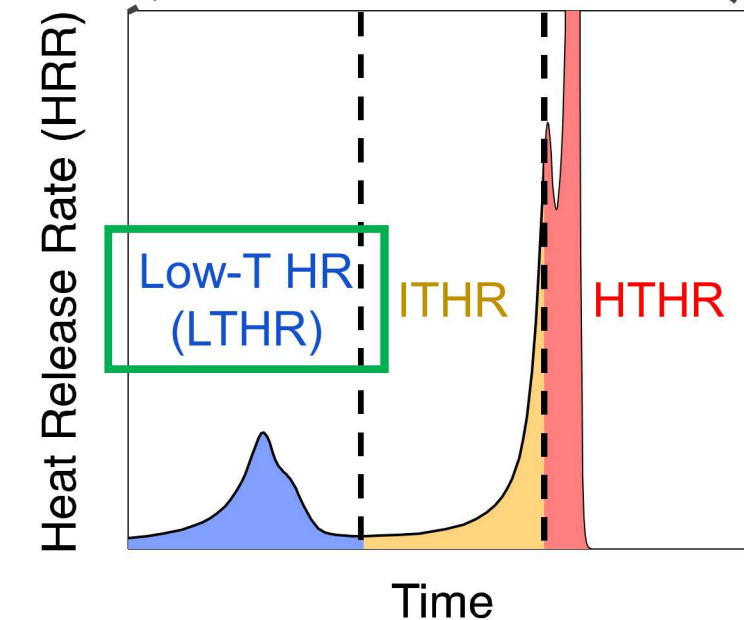
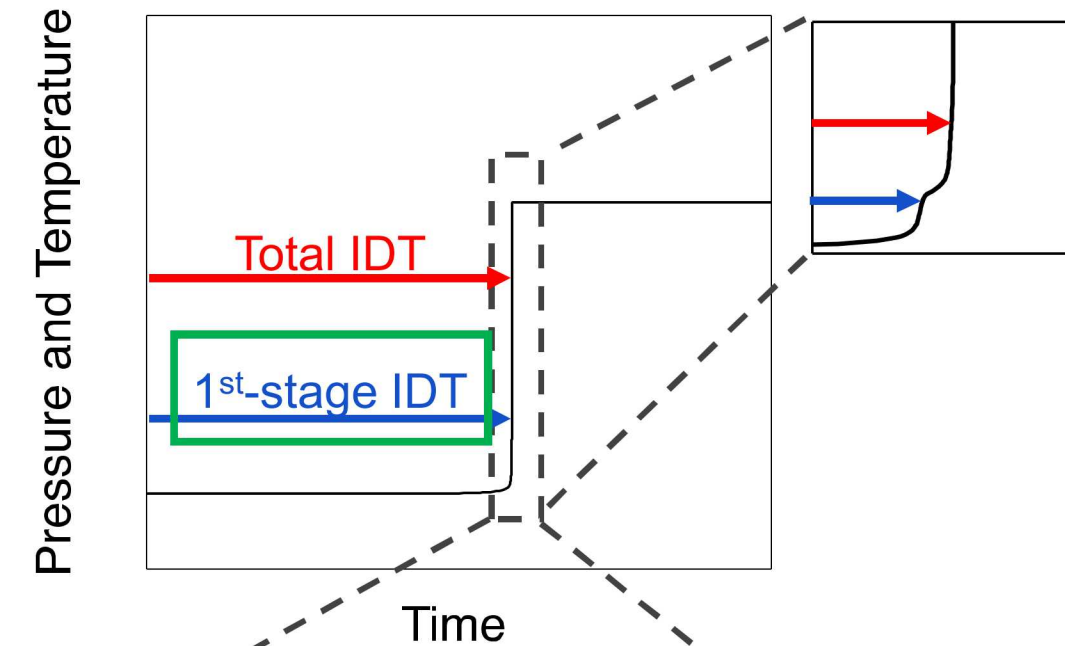
1. General ✓
2. Small Fuel Quantities ✓

### Our Idea:

Measure Universal Oxidation Species (e.g., OH & HO<sub>2</sub>) in a High-P Flow Reactor

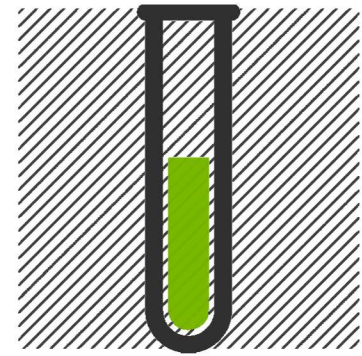


## Ignition Properties



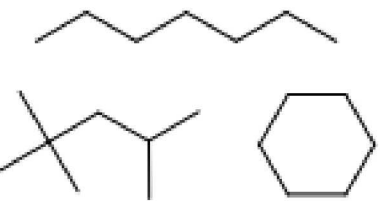
# Vision for an Ideal Fuel Screening Platform

## Realistic Candidate Fuel

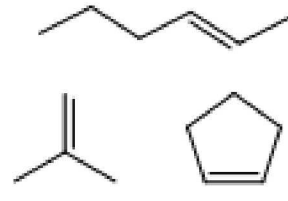


Mix of 100's of Chemical Species

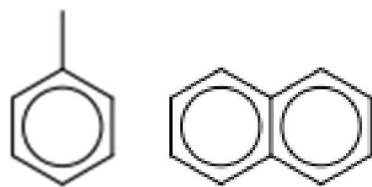
### Alkanes



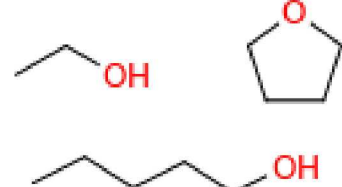
### Alkenes



### Aromatics



### Oxygenates

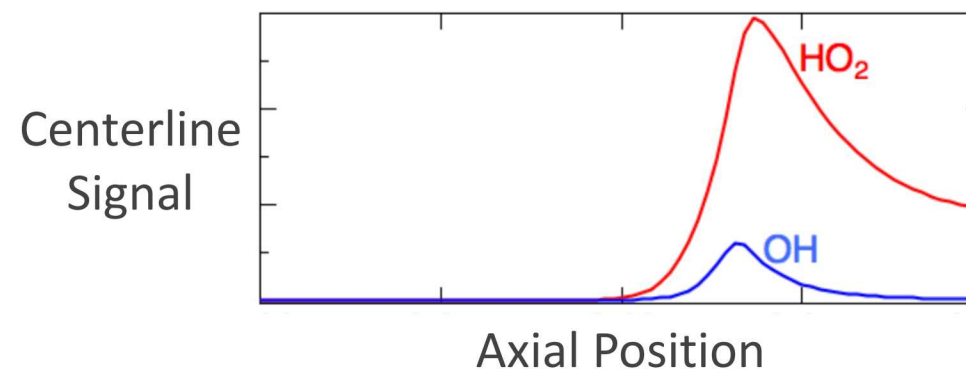
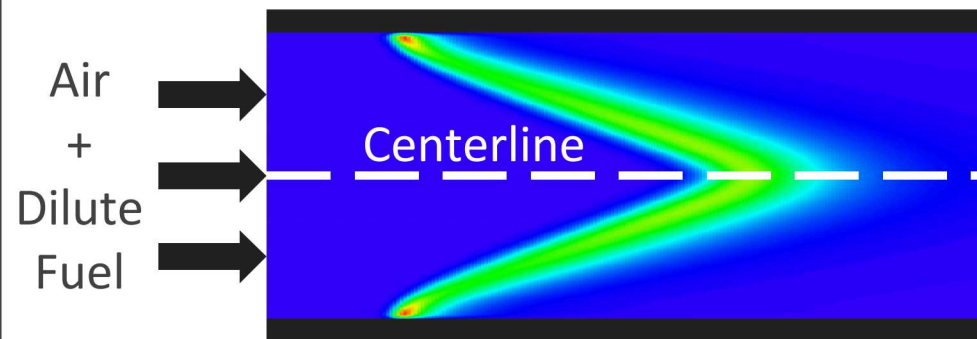


## Ideal Screening Platform:

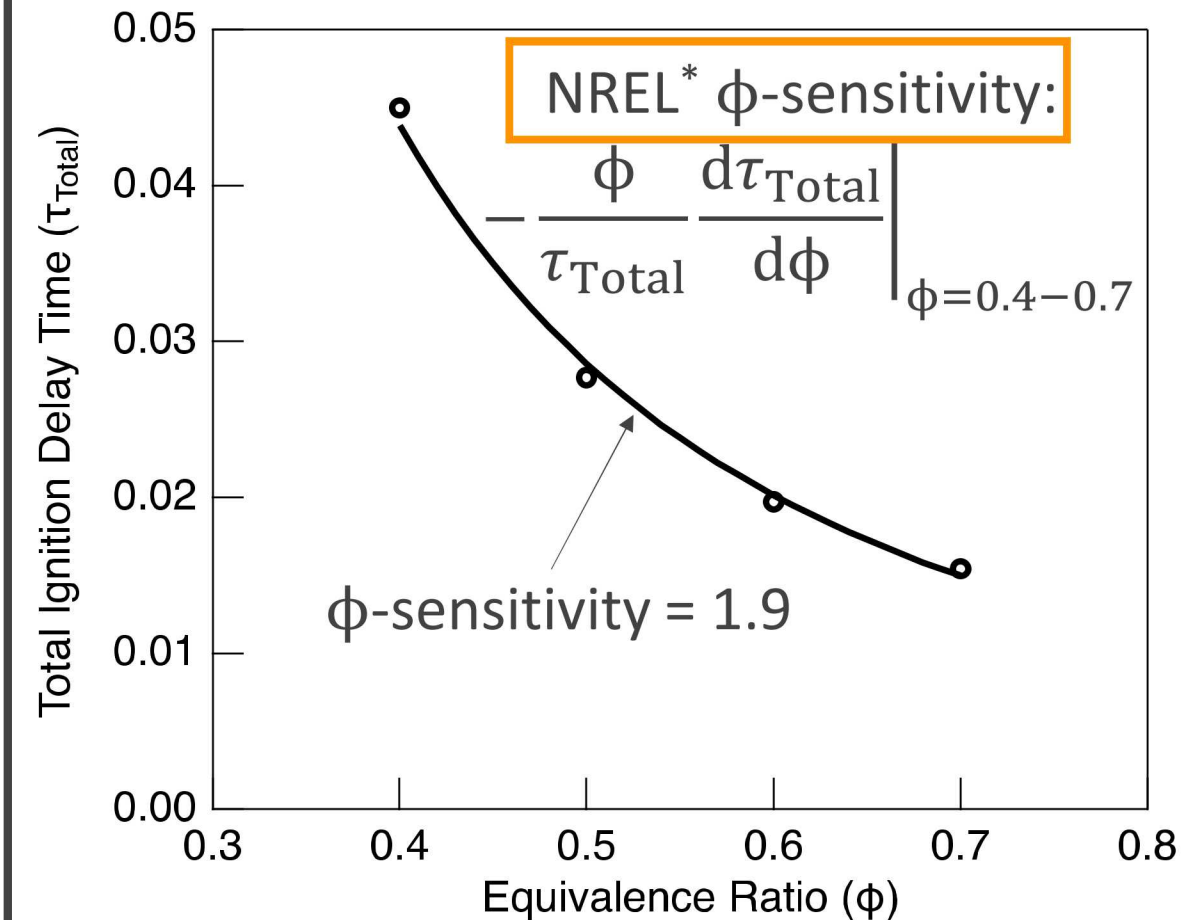
1. General ✓
2. Small Fuel Quantities ✓

### Our Idea:

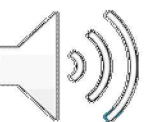
Measure Universal Oxidation Species (e.g., OH & HO<sub>2</sub>) in a High-P Flow Reactor



## Ignition Properties

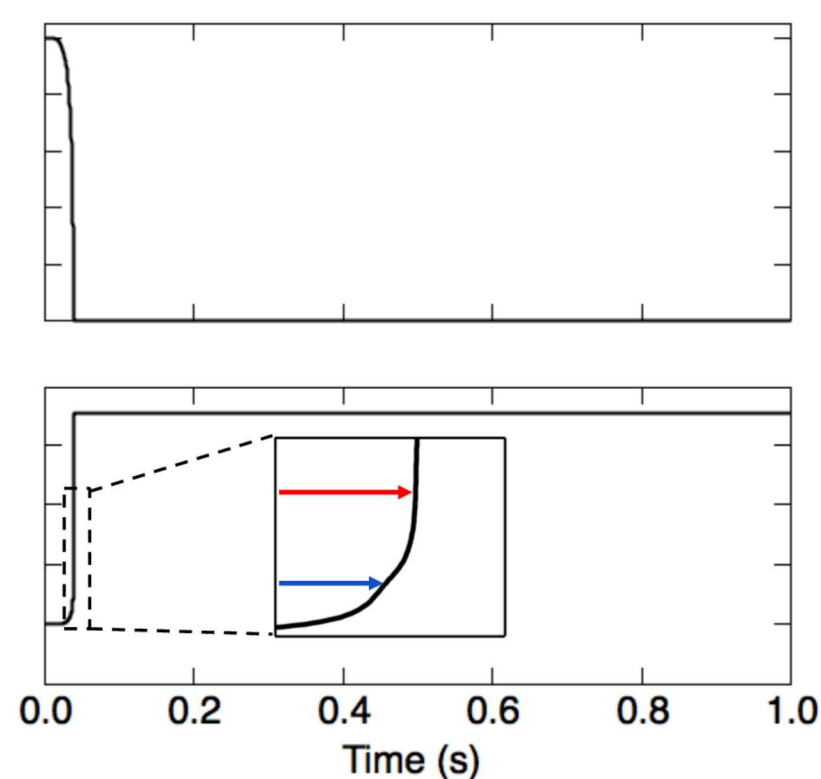
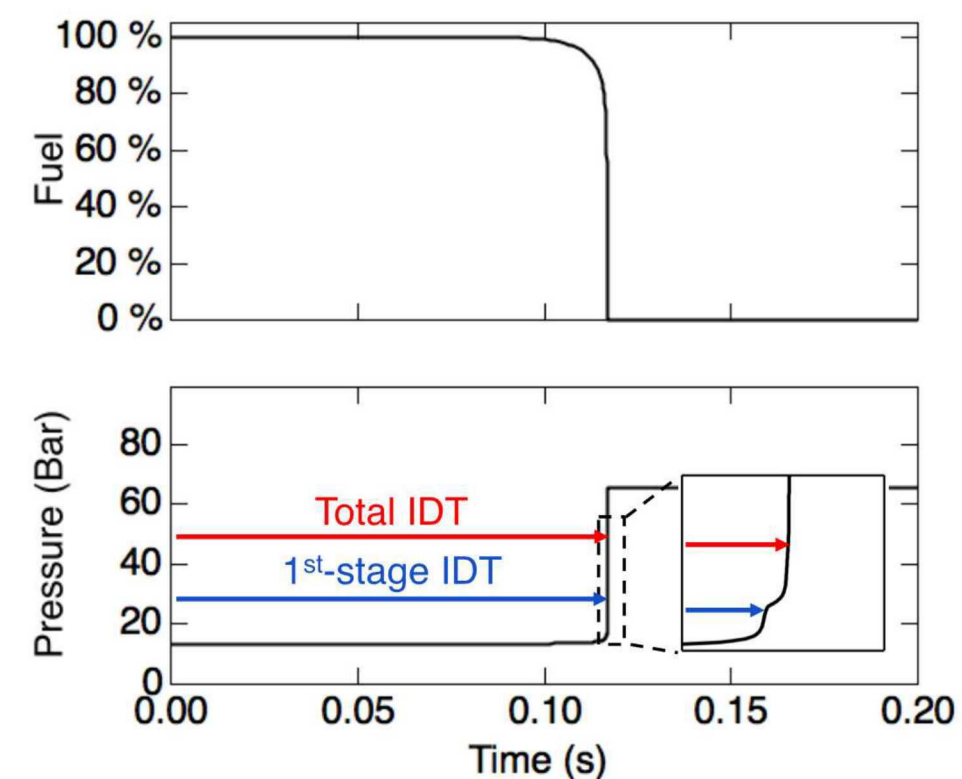
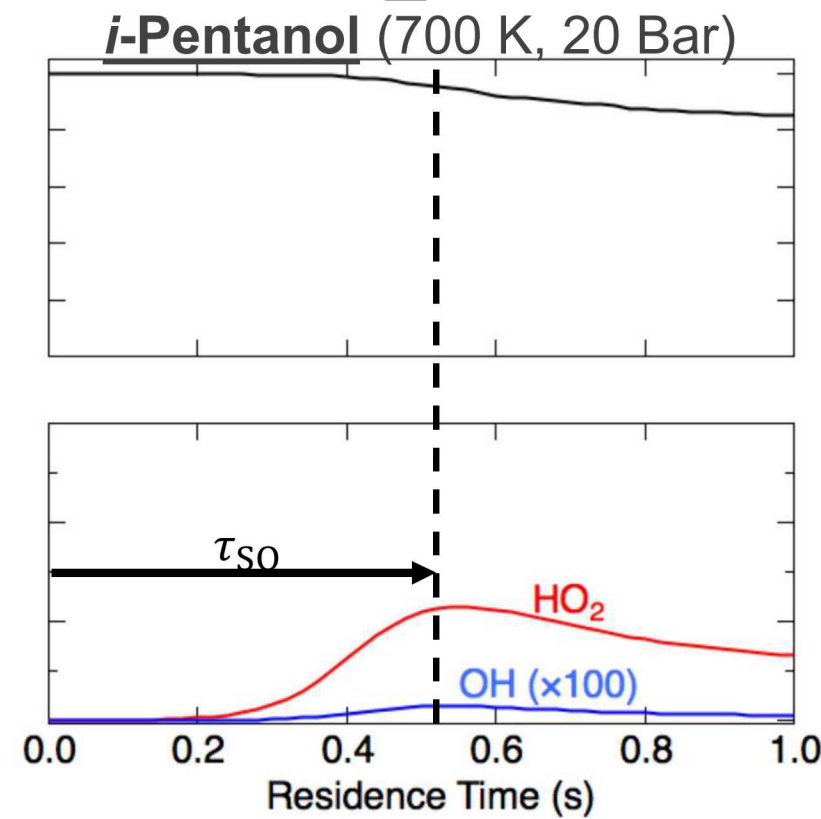
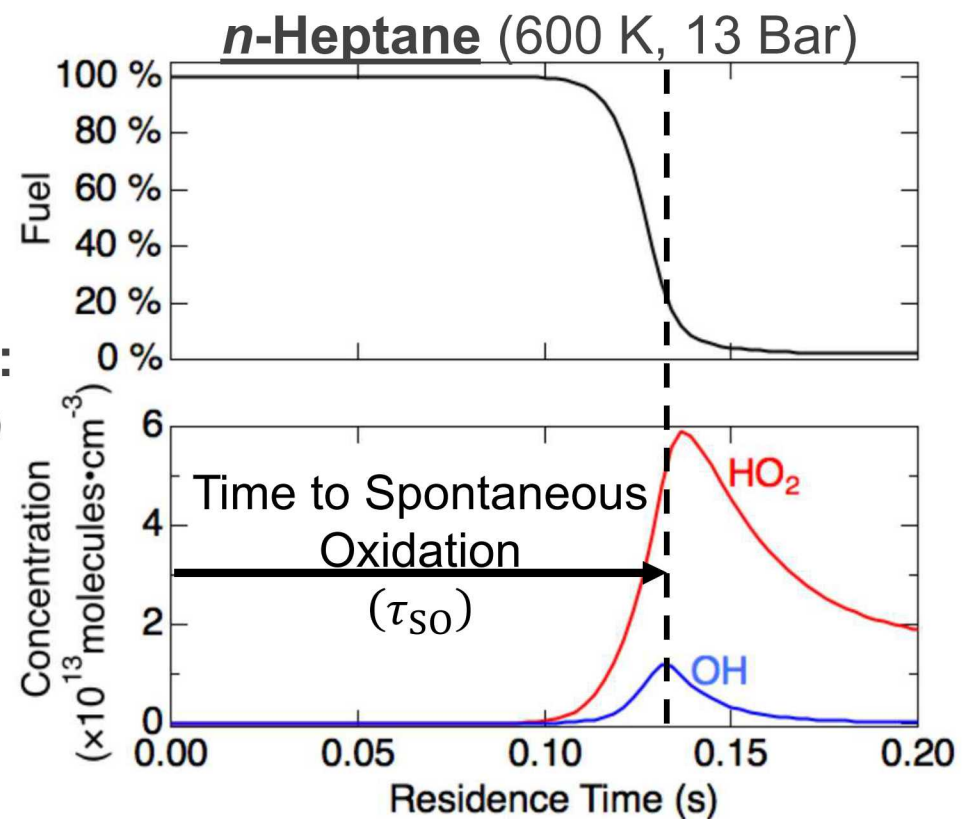


**φ-sensitivity too complicated to be correlated with OH/HO<sub>2</sub> from dilute fuel measurements alone**



# Simulations of Expected OH/HO<sub>2</sub> Profiles

Flow Reactor Simulations:  
(~1 Torr of Fuel,  $\phi \approx 0.001$ )



For *n*-heptane:

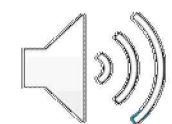
- $\tau_{SO} \approx 1^{\text{st}}$ -Stage IDT
- Peak [OH]  $\approx 10^{13} \text{ cm}^{-3}$

For *i*-pentanol:

- $\tau_{SO} \gg 1^{\text{st}}$ -Stage IDT
- Peak [OH]  $\approx 10^{10} \text{ cm}^{-3}$

Is this a general trend among all fuels?

- To answer, simulated ~14k perturbed mechanisms for a diversity of fuels from 600-700 K and 10-40 bar



# Perturbing Mechanisms to Generate Dataset

## "Real" Fuels with Validated Chemical Mechanisms

## "Hypothetical" Fuels with Perturbed Chemical Mechanisms

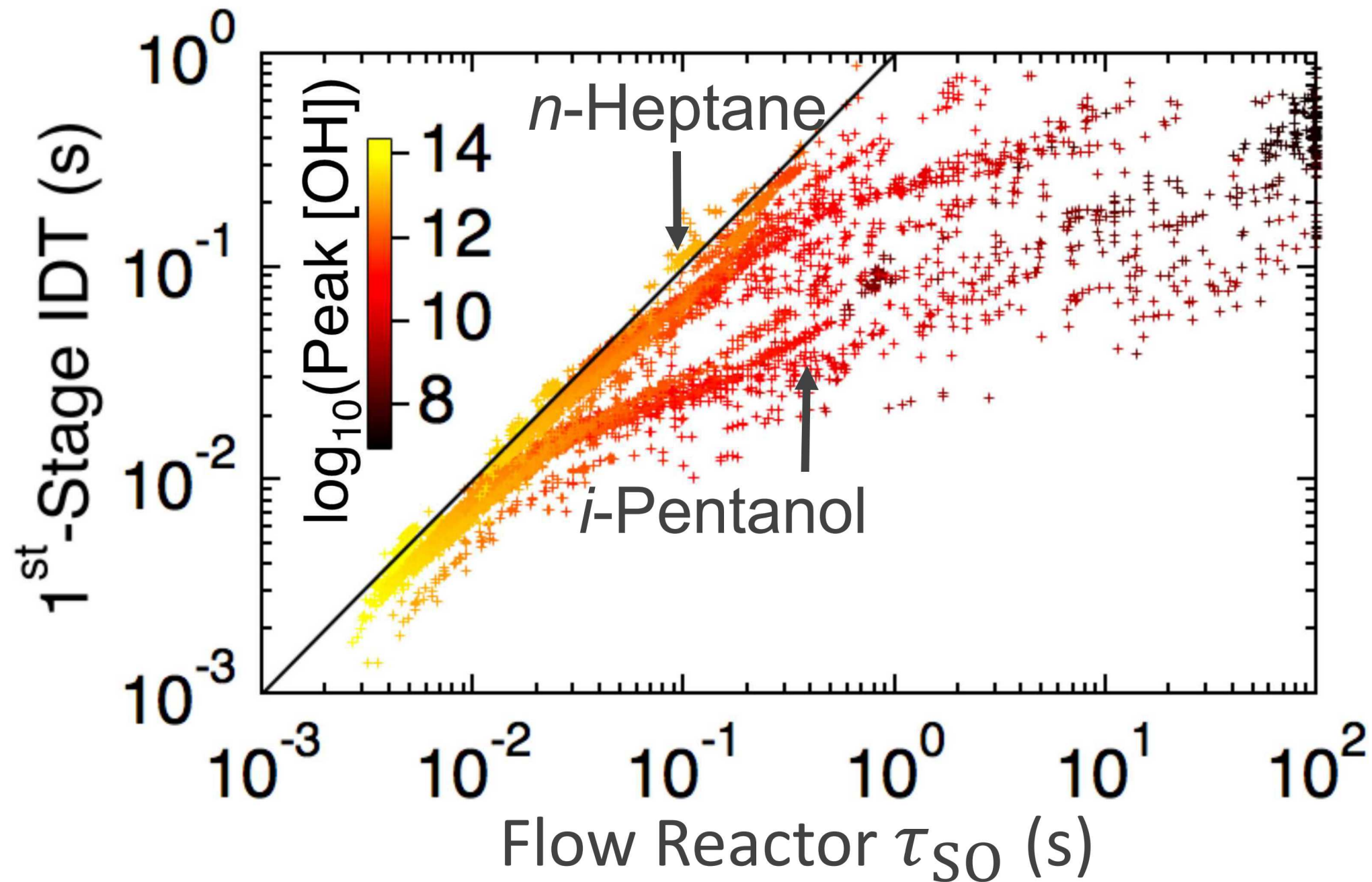
Class	Fuel
Alkanes	Pentane isomers
	<i>n</i> -Heptane
	<i>i</i> -Octane
	Cyclohexane
	Methylcyclohexane
Alkenes/Aromatics	Butene isomers
	Hexene isomers
	Butylbenzene
	1-Butanol
Oxygenates	<i>i</i> -Pentanol
	Dimethyl Ether (DME)
	Dimethoxy Methane (DMM)
	Tetrahydrofuran (THF)
	Methyl Decanoate
Blends	Binary/Ternary/Quaternary Blends of
	<i>n</i> -Heptane/ <i>i</i> -Octane/Ethanol/Toluene

1. Sensitive Reaction  $\text{ch}_3\text{och}_2\text{o}_2 \rightleftharpoons \text{ch}_2\text{och}_2\text{o}_2\text{h}$  A-factor Multiplied by 0.5 ×
2. Sensitive Reaction  $\text{ch}_3\text{och}_2\text{o}_2 \rightleftharpoons \text{ch}_2\text{och}_2\text{o}_2\text{h}$  A-factor Multiplied by 2.0 ×
3. Sensitive Reaction  $\text{ho}_2\text{ch}_2\text{ocho} \rightleftharpoons \text{och}_2\text{ocho} + \text{oh}$  A-factor Multiplied by 0.5 ×
4. Sensitive Reaction  $\text{ho}_2\text{ch}_2\text{ocho} \rightleftharpoons \text{och}_2\text{ocho} + \text{oh}$  A-factor Multiplied by 2.0 ×
5. Sensitive Reaction  $\text{o}_2\text{ch}_2\text{och}_2\text{o}_2\text{h} \rightleftharpoons \text{ho}_2\text{ch}_2\text{ocho} + \text{oh}$  A-factor Multiplied by 0.5 ×
6. Sensitive Reaction  $\text{o}_2\text{ch}_2\text{och}_2\text{o}_2\text{h} \rightleftharpoons \text{ho}_2\text{ch}_2\text{ocho} + \text{oh}$  A-factor Multiplied by 2.0 ×
7. Sensitive Reaction  $\text{ho}_2 + \text{oh} \rightleftharpoons \text{h}_2\text{o} + \text{o}_2$  A-factor Multiplied by 0.5 ×
8. Sensitive Reaction  $\text{ho}_2 + \text{oh} \rightleftharpoons \text{h}_2\text{o} + \text{o}_2$  A-factor Multiplied by 2.0 ×

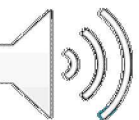
~10 Validated Chemical Mechanisms → ~14,000 Hypothetical Fuel Mechanisms



# Qualitative Trend between $\tau_{S0}$ and 1<sup>st</sup>-Stage IDT

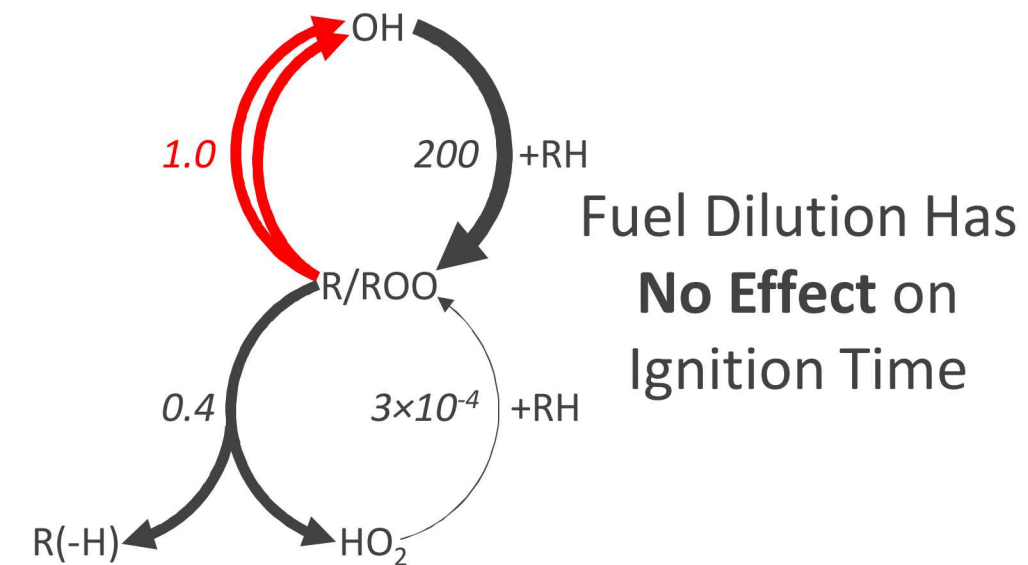
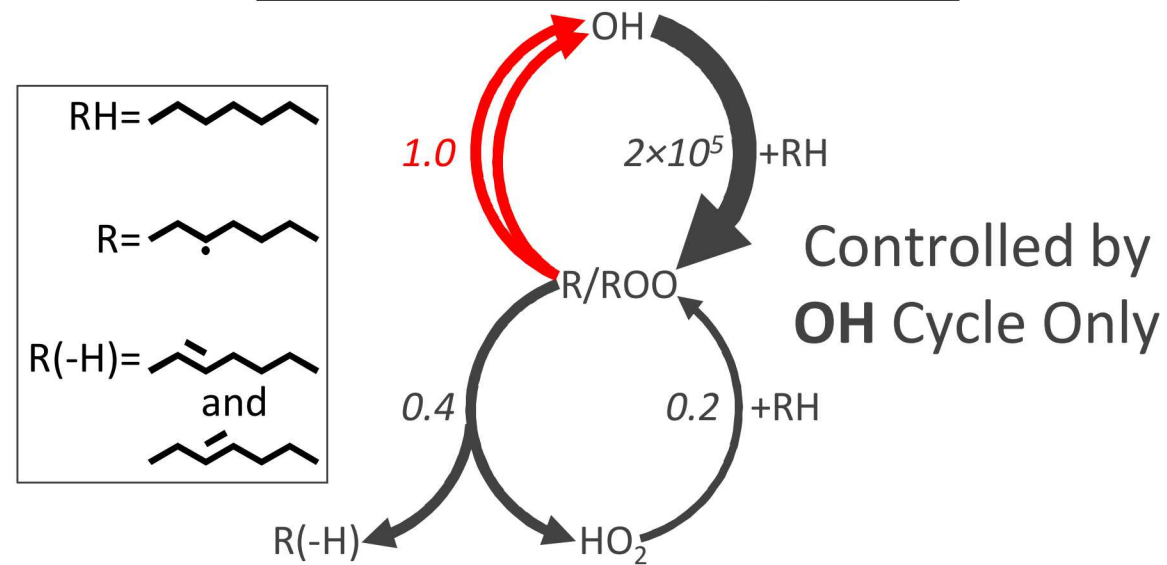


Why are some fuels affected by dilution (e.g., *i*-pentanol) and others are not (e.g., *n*-heptane)?

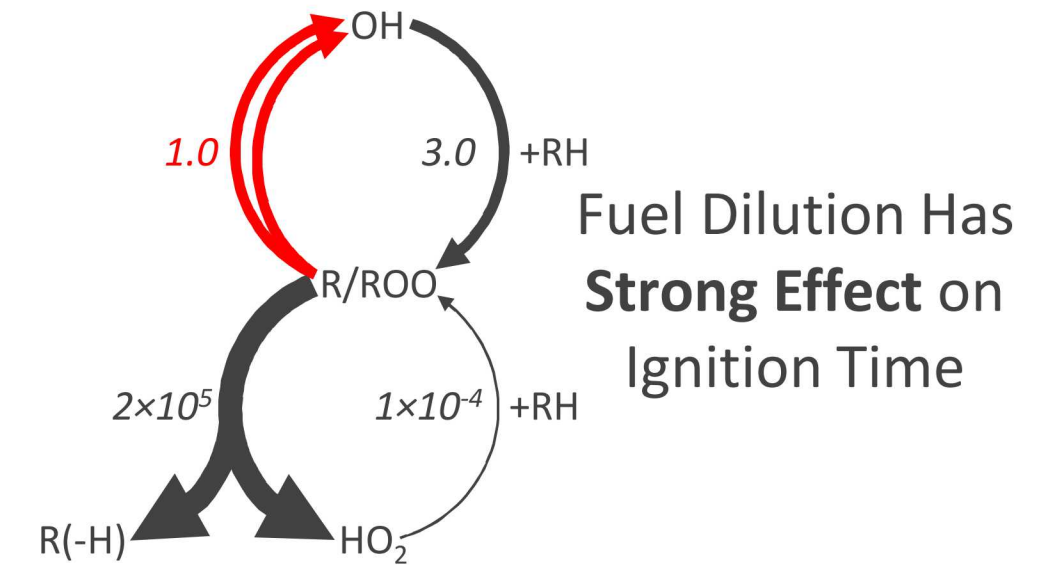
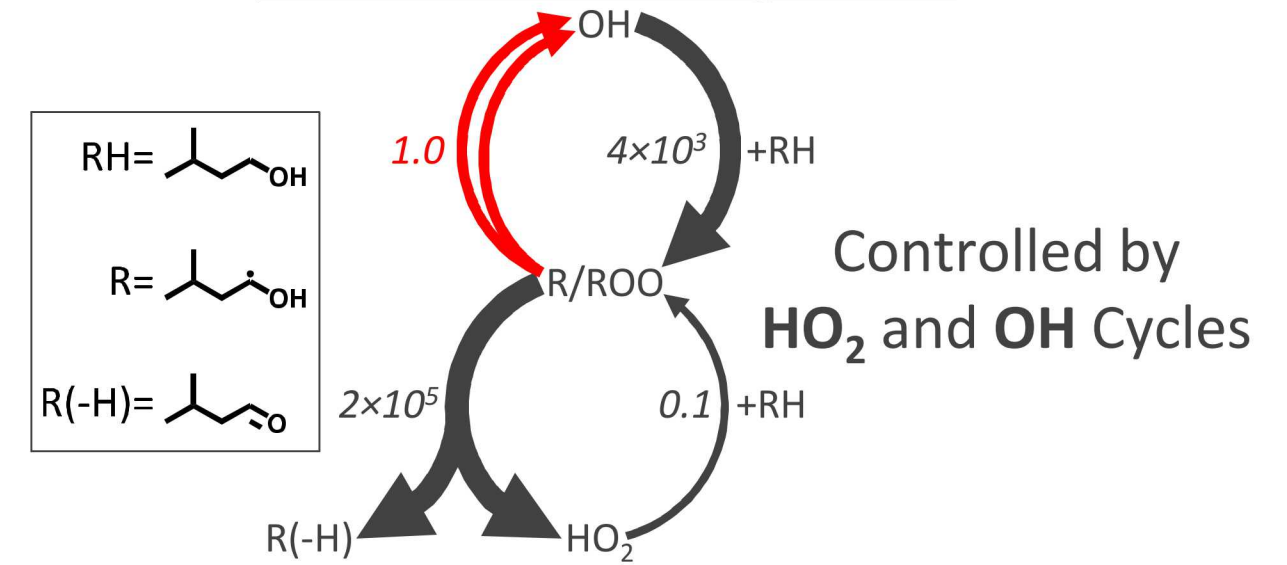


# Mechanistic Effect of Fuel Dilution

## *n*-Heptane Autoignition

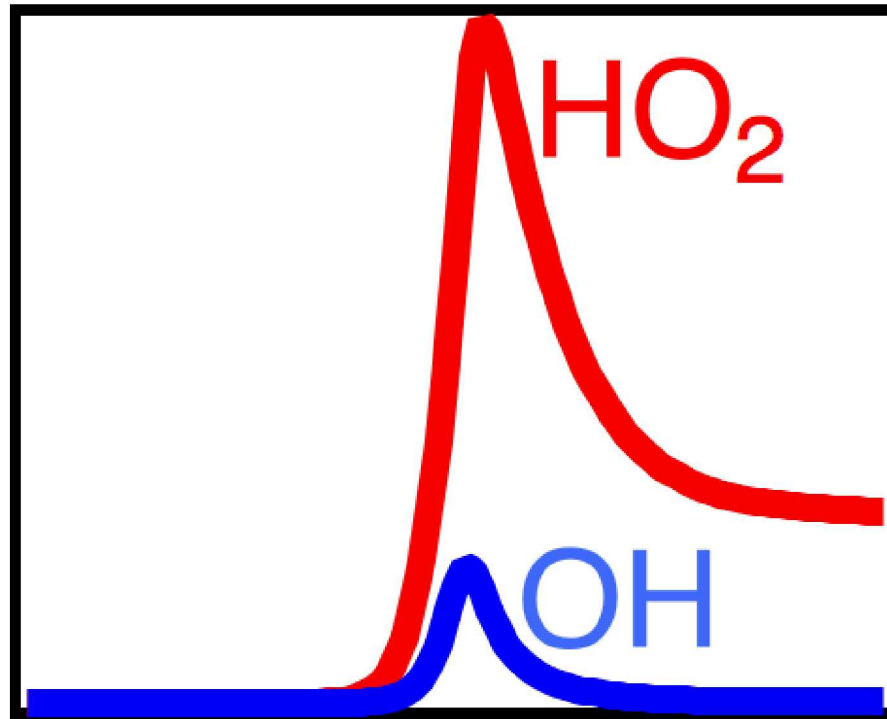


## *i*-Pentanol Autoignition



# Correlation from Polynomial Chaos Expansion (PCE) with Regularization

Inputs ( $\underline{x}$ )



Flow Reactor Residence Time

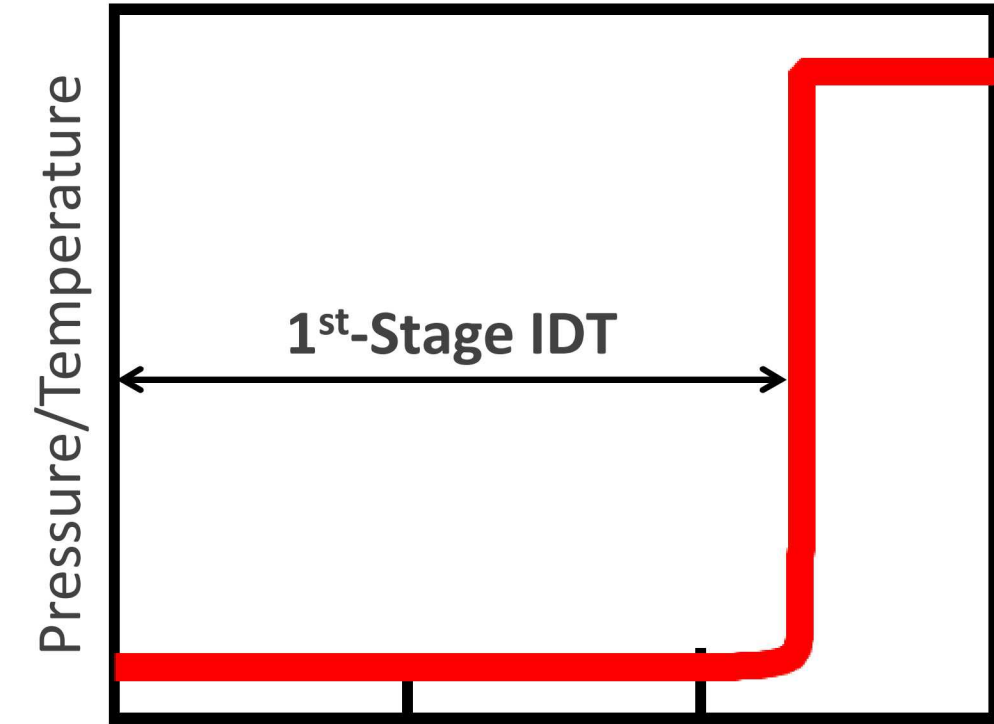
Fitting Function ( $\underline{w} \cdot \underline{f}(\underline{x})$ )

Fitting weights: Polynomial Order  $\leq 2$ :

$$\underline{w} = \begin{bmatrix} w_1 \\ w_2 \\ w_3 \\ w_4 \\ w_5 \\ \dots \\ w_{35} \\ w_{36} \end{bmatrix}$$

$$\underline{f}(\underline{x}) = \begin{bmatrix} 1 \\ x_1 \\ x_1^2 \\ x_1x_2 \\ x_1x_3 \\ \dots \\ x_6x_7 \\ x_7^2 \end{bmatrix}$$

Target ( $y$ )



Time

$$\underline{x} = \begin{bmatrix} \tau_{SO} \\ \text{Max OH} \\ \text{Max HO}_2 \\ \text{Max OH Slope} \\ \text{Max HO}_2 \text{ Slope} \\ T \\ P \end{bmatrix} = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \\ x_5 \\ x_6 \\ x_7 \end{bmatrix}$$

Objective Function (L)

$$L = |y - \underline{w} \cdot \underline{f}(\underline{x})| + \lambda |\underline{w}|_1$$

$$y = \text{1st-Stage IDT}$$

or

$$y = \text{LTHR}$$

or

$$y = \phi\text{-Sensitivity}$$

Value that is minimized in order to fit a **parsimonious** function to data

Difference between polynomial fit and data

Regularization term to prevent overfitting ( $\lambda$  is adjustable parameter)

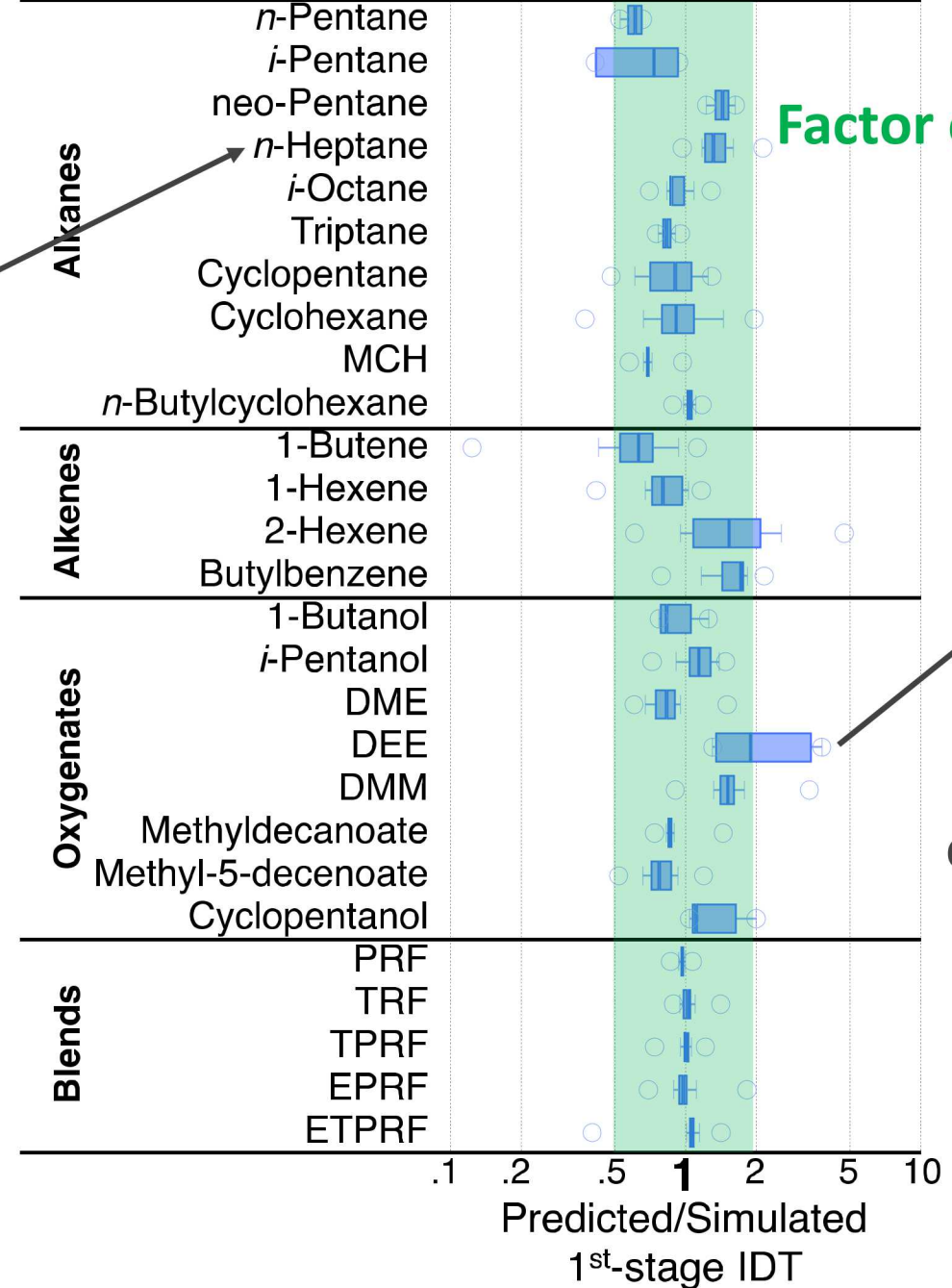
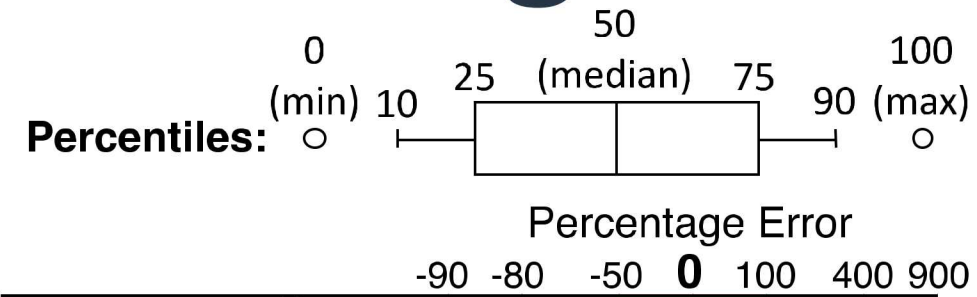
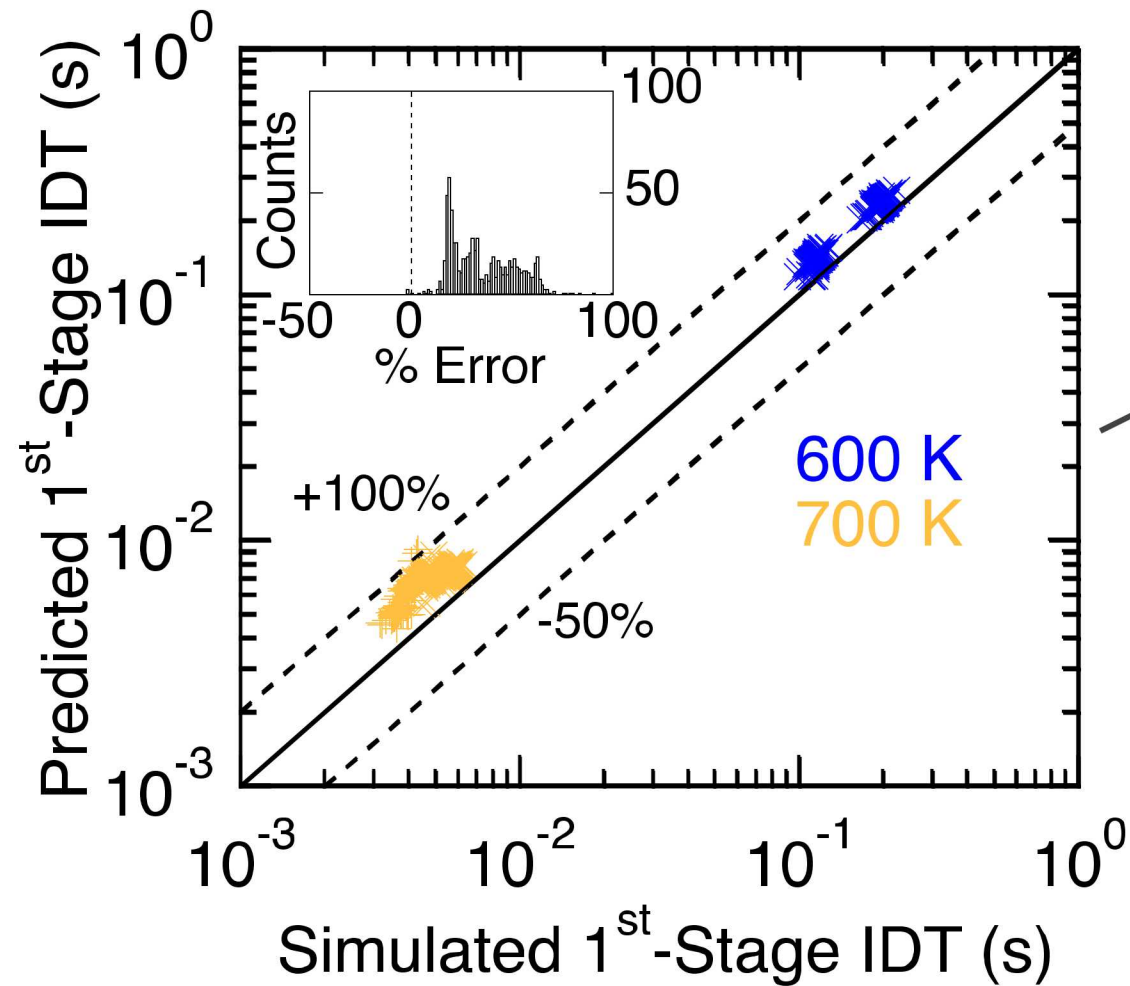




# Leave-One-Fuel-Out Tests: 1<sup>st</sup>-Stage IDT

For Example:

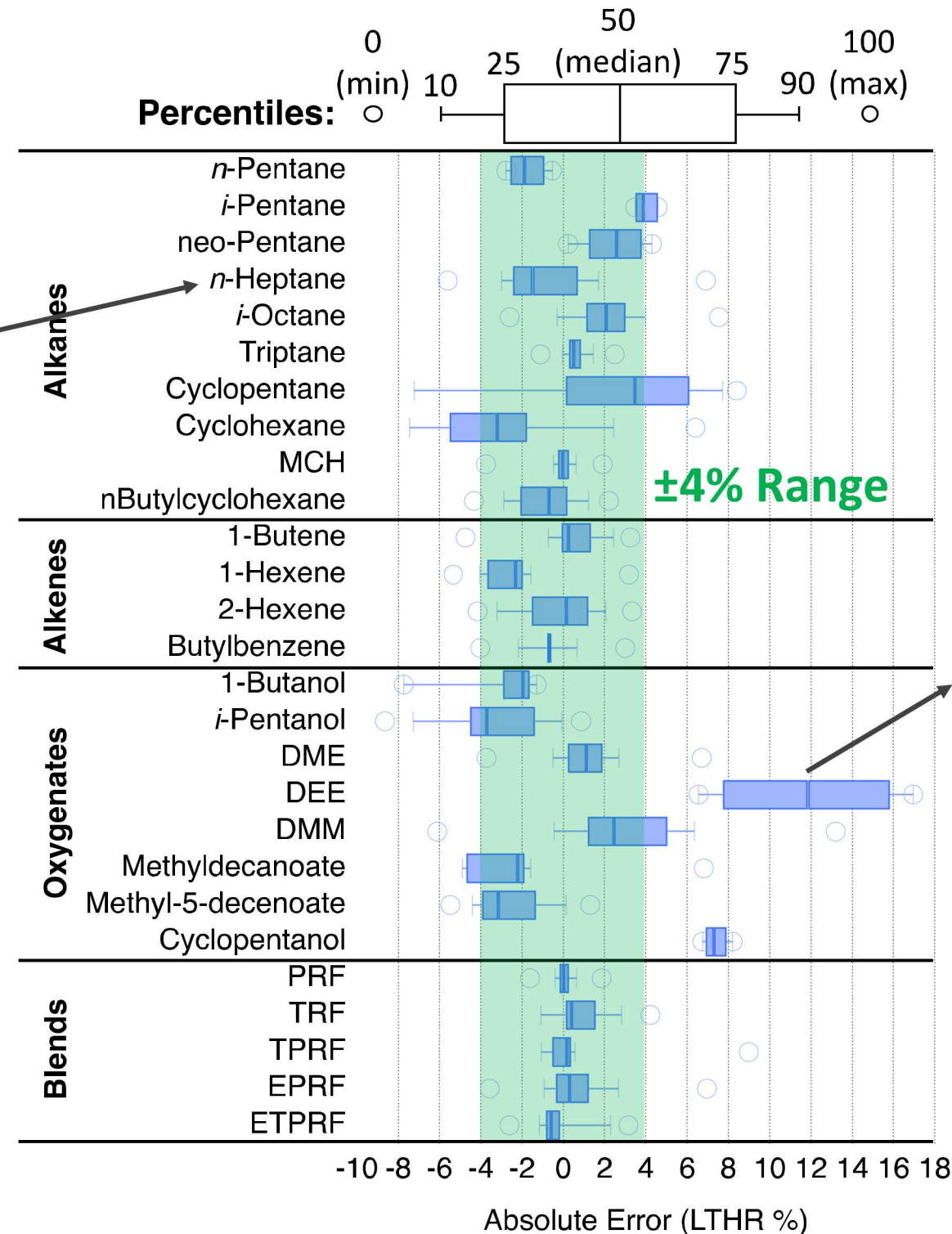
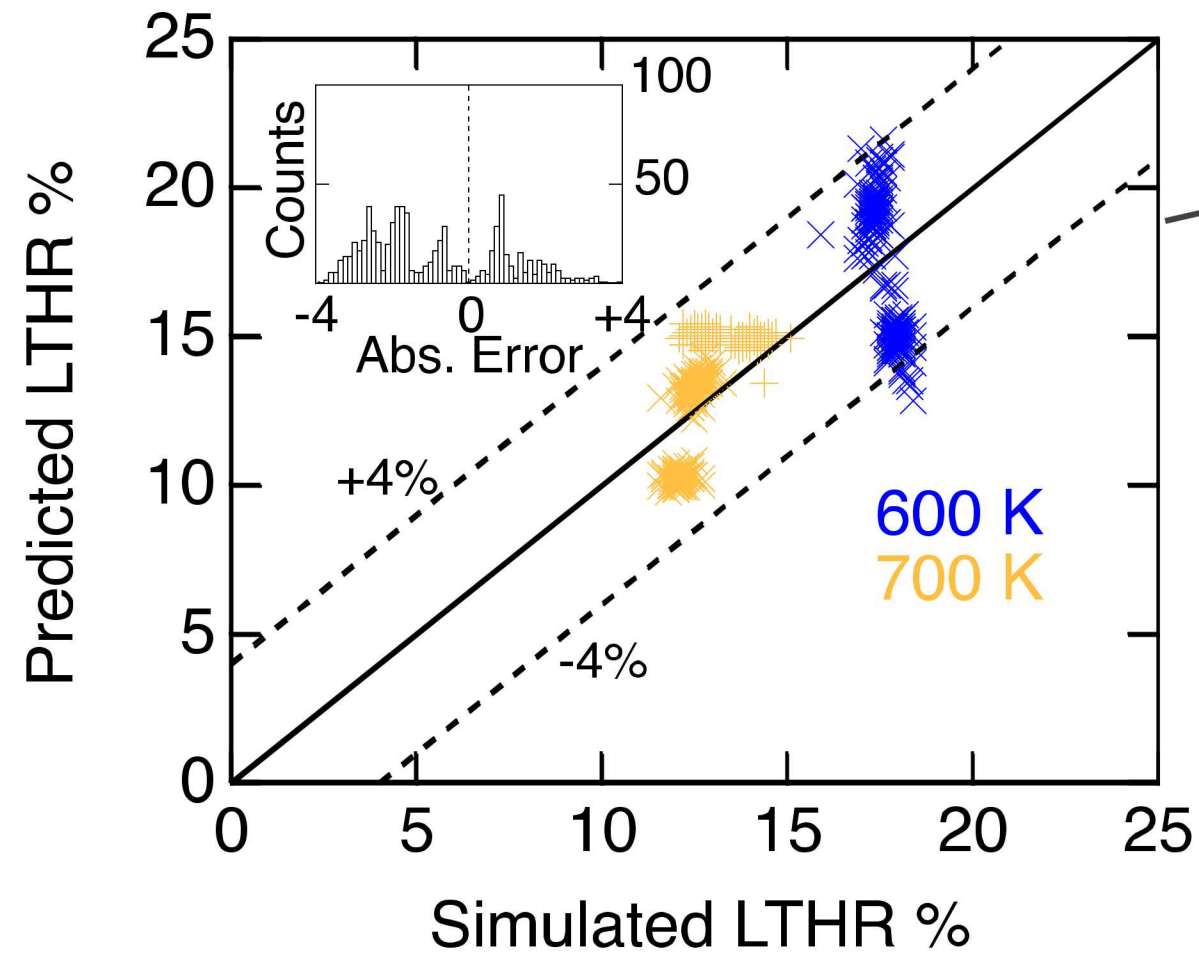
Train on All ~13k Simulations Except *n*-Heptane  
 Test on ~1k *n*-Heptane Simulations



# Leave-One-Fuel-Out Tests: LTHR

For Example:

Train on All ~13k Simulations Except *n*-Heptane  
 Test on ~1k *n*-Heptane Simulations:

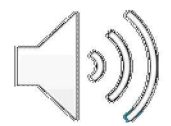
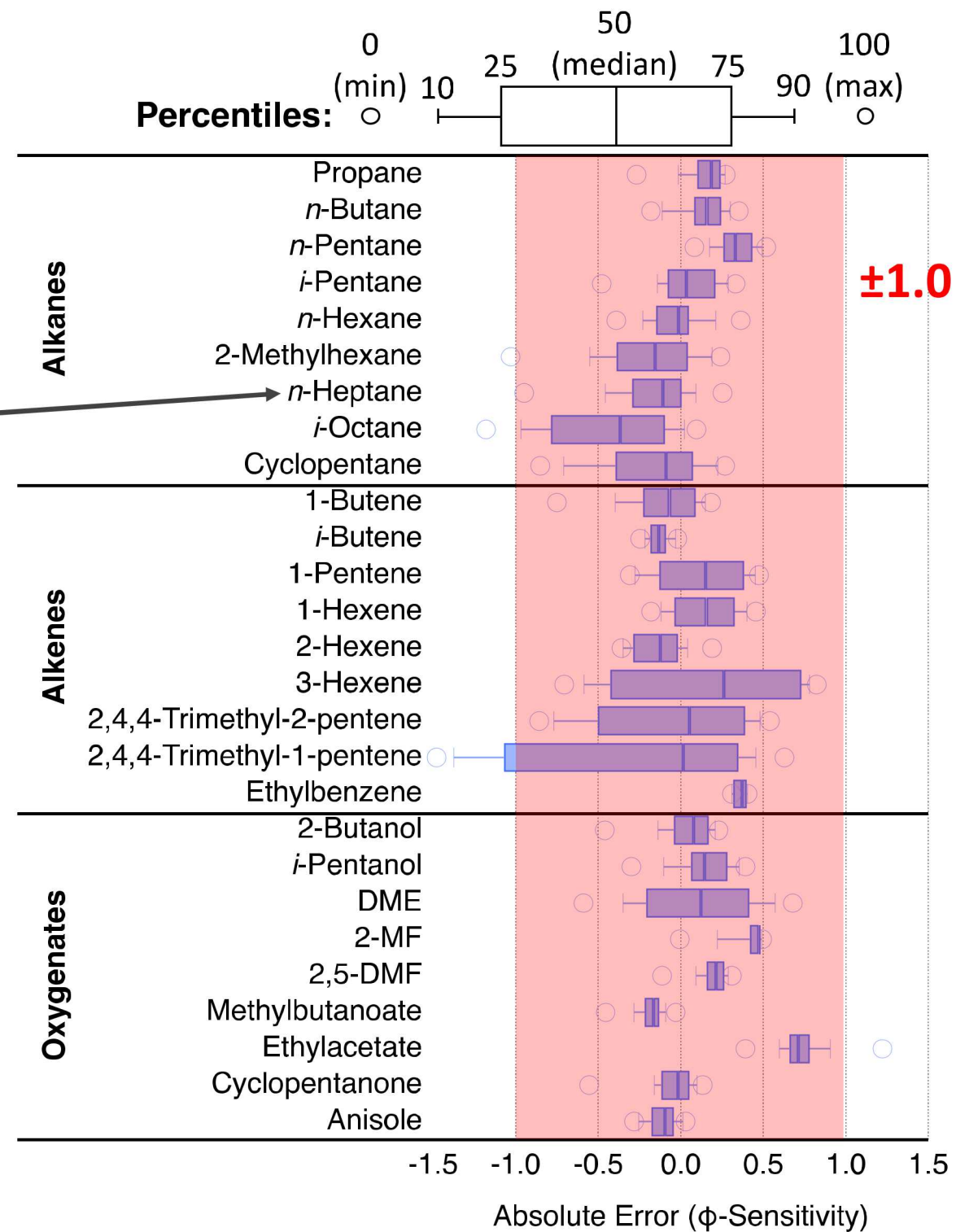
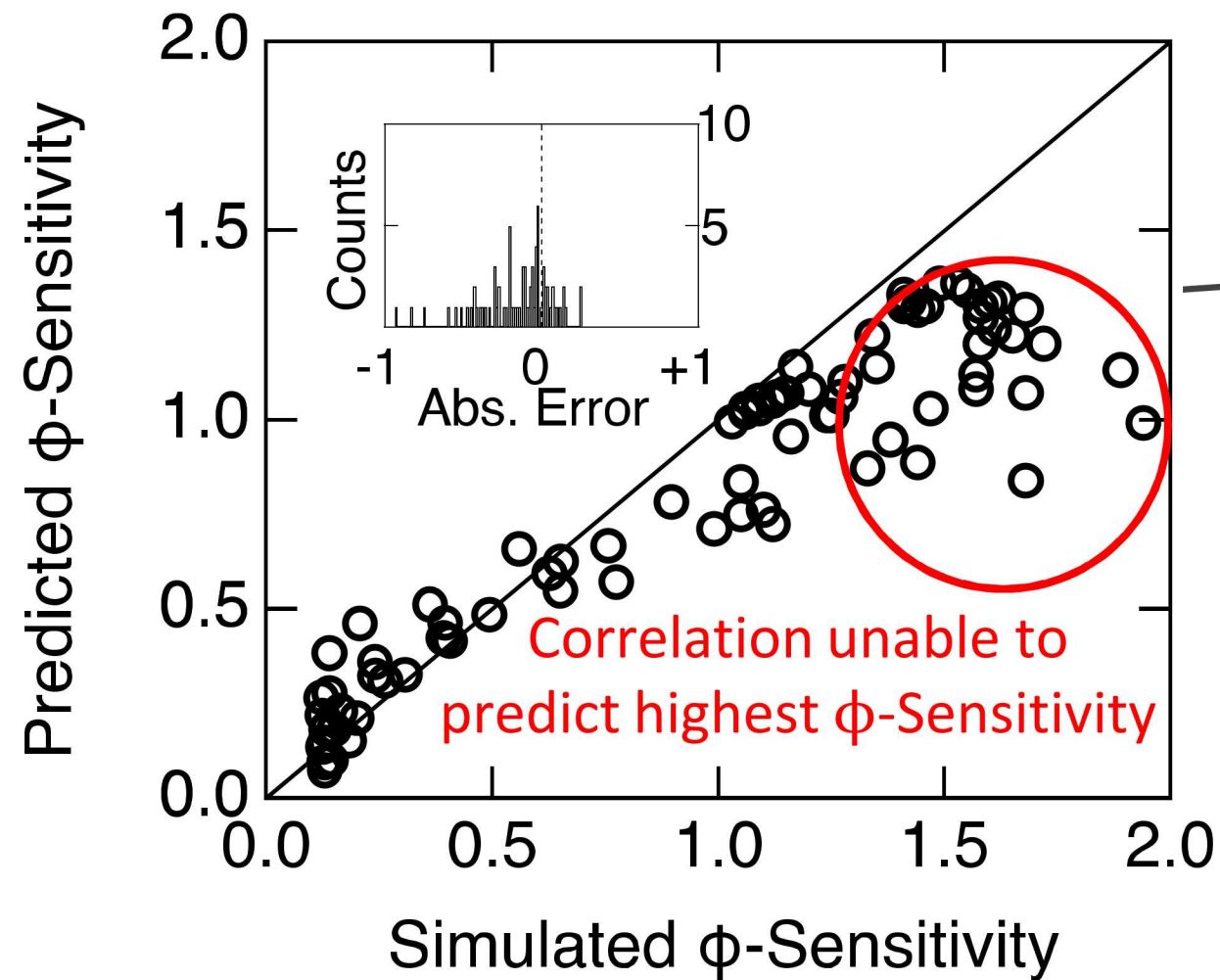


# Leave-One-Fuel-Out Tests: $\phi$ -sensitivity

For Example (smaller dataset):

Train on All  $\sim 1.8k$  Simulations Except *n*-Heptane

Test on  $\sim 80$  *n*-Heptane Simulations:



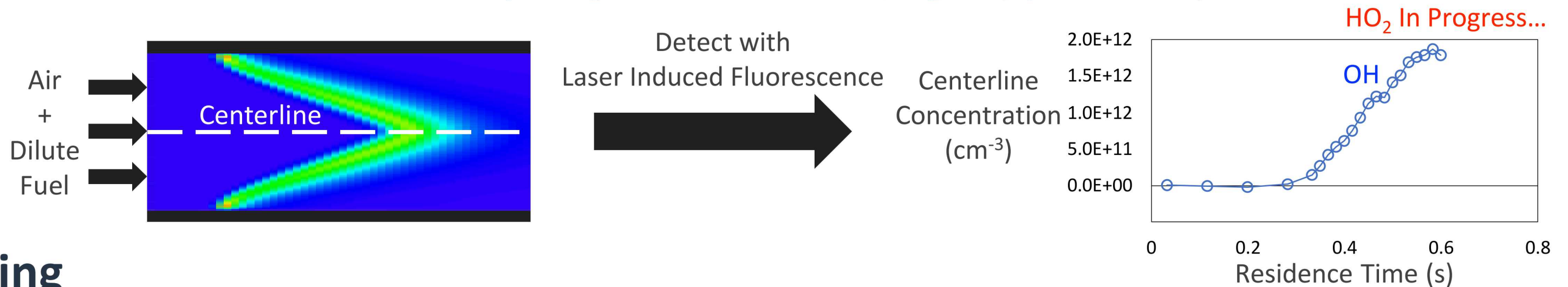
# Conclusions

Used PCE to find correlations between OH/HO<sub>2</sub> profiles simulated in a high-P flow reactor with dilute fuel and:

1. 1<sup>st</sup>-Stage IDT → Correlation predicts values within a factor of 2
2. LTHR % → Correlation predicts absolute values within 4%
3.  $\phi$ -Sensitivity → Correlation does not predict (interesting) high values  
→ A different experiment that can measure intermediate-T chemistry might be more suitable

# Next Steps

Experimental measurements of OH currently being conducted in a new, high-P (up to 100 bar) laminar flow reactor:



# Funding

This research was conducted as part of the Laboratory-Directed Research and Development (LDRD) program and the Co-Optimization of Fuels and Engines (Co-Optima) initiative sponsored by the US Department of Energy Office of Energy Efficiency and Renewable Energy and Bioenergy Technologies and Vehicle Technologies Offices. Co-Optima is a collaborative project of multiple national laboratories initiated to simultaneously accelerate the introduction of affordable, scalable, and sustainable biofuels and high-efficiency, low-emission vehicle engines. Special thanks to the Vehicle Technologies Office program managers Kevin Stork, Gurpreet Singh, Leo Breton, and Mike Weismiller, as well as the Bioenergy Technology Office Program manager Alicia Lindauer.

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