

Dealing with PFAS Mixtures: Approaches to Predicting Joint Effects of PFAS Mixtures on Molecular Initiating Events



Greylin Nielsen, MPH
nielseng@bu.edu
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Research Team:
Jennifer Schlezinger, PhD
Thomas Webster, PhD
Wendy Heiger-Bernays, PhD

**BOSTON
UNIVERSITY**

Boston University School of Public Health

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Advisor

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Per- and polyfluoroalkyl substance (PFAS) exposure is a mixtures problem



Humans are exposed to mixtures of PFAS through drinking water, food, air, household dust, soil, and consumer, personal care products, and more

Multiple PFAS are found in humans:

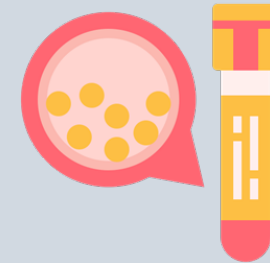
PFOS, PFOA, PFHxS, and PFNA are consistently measured in more than 90% of the U.S. population

Different PFAS have similar health effects



Impaired immune response

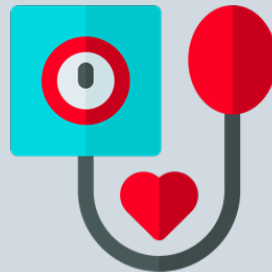
PFAS



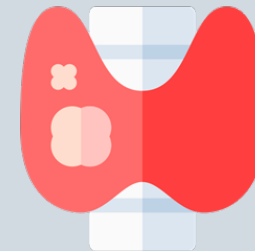
Increased cholesterol



Low birth weight



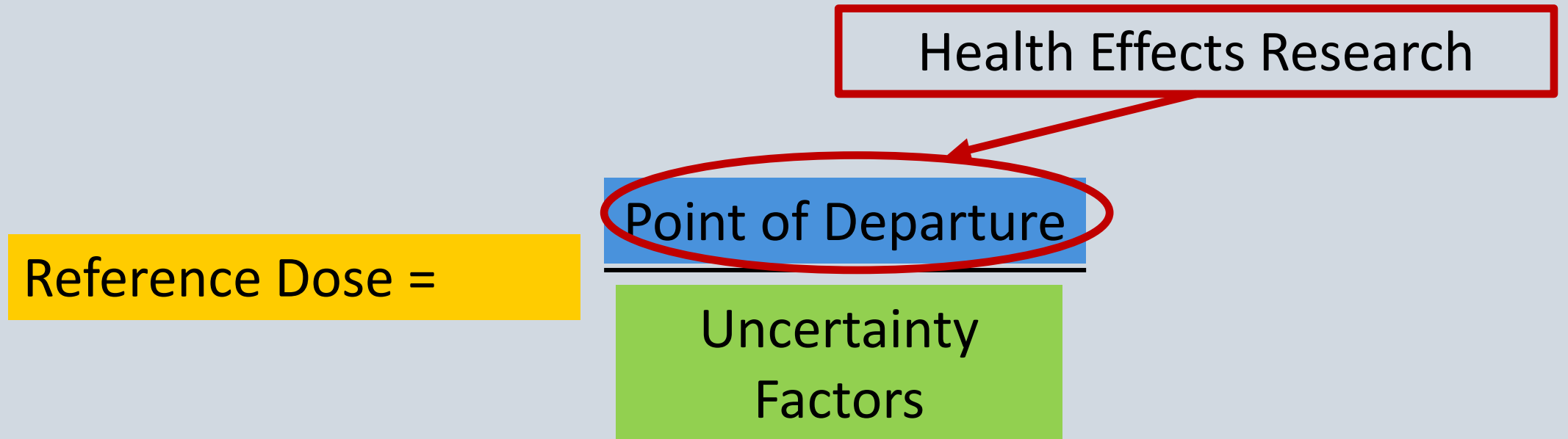
Preeclampsia



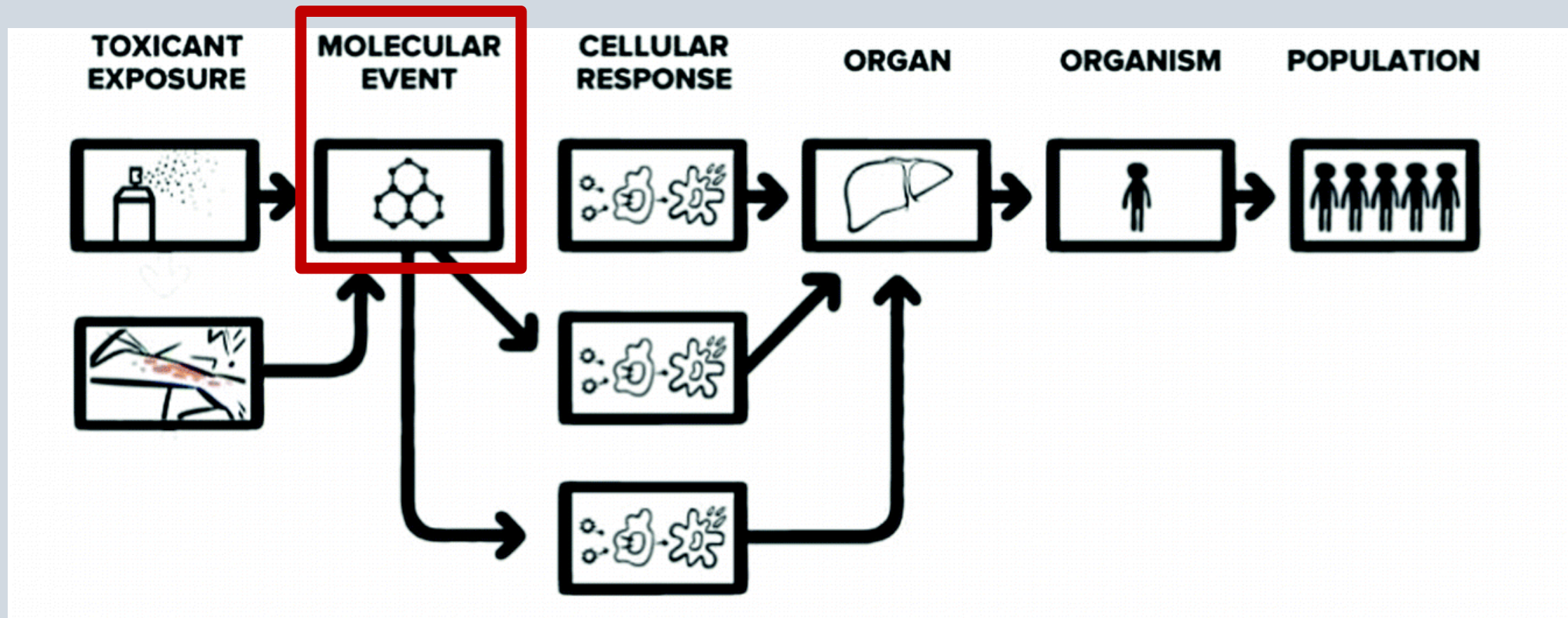
Thyroid disease

PFAS guidelines, advisories, and regulations are based on health risk

Drinking Water Standards and Guidance Values are Based on Reference Doses



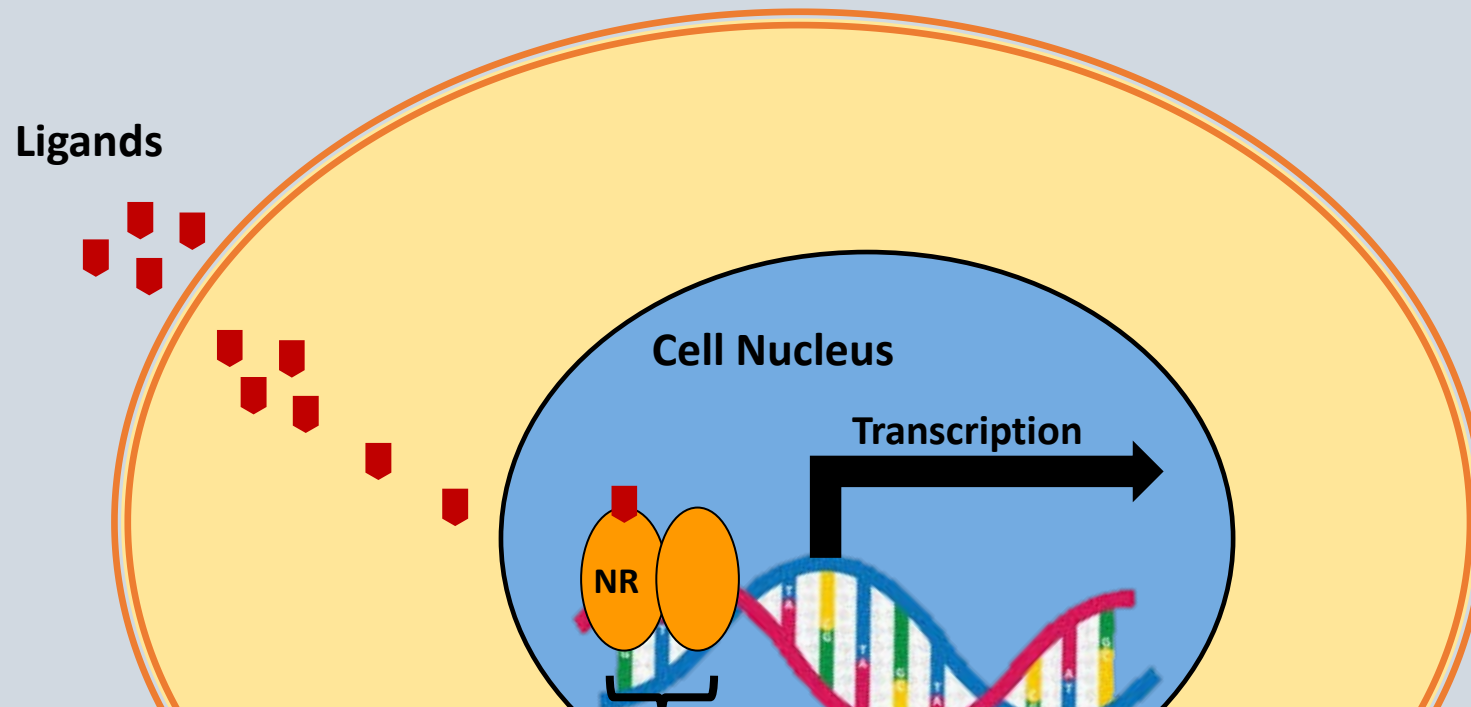
Adverse Outcome Pathway



Nuclear receptor activation is an important molecular initiating event for PFAS

Nuclear receptors = proteins in cells that **recognize** and **respond** to molecules in the body (like hormones), therapeutic drugs, and environmental chemicals

Nuclear receptor activation is an important molecular initiating event for PFAS



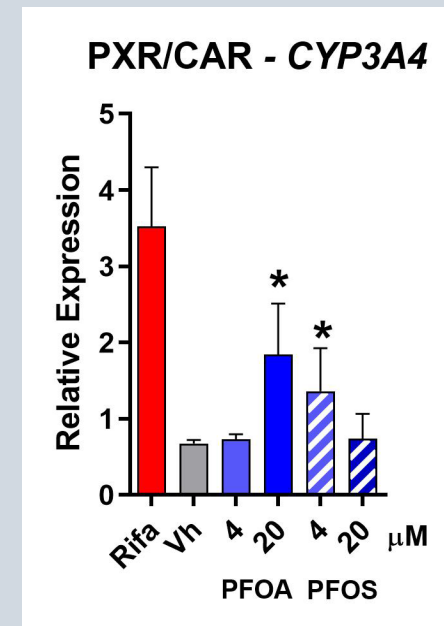
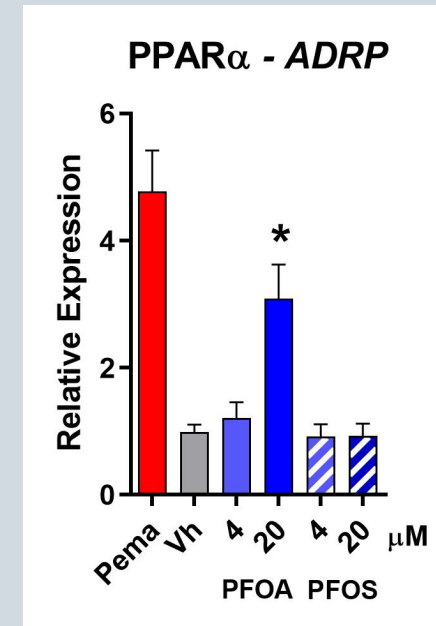
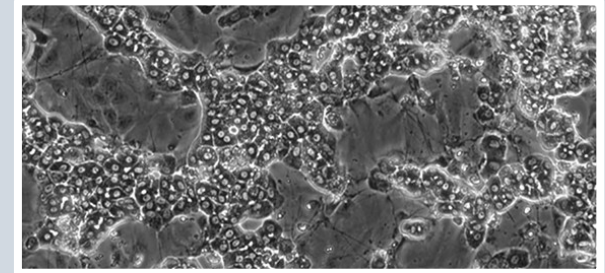
Nuclear receptor ligands can be full agonists, partial agonists, and antagonists

PFAS Engage Multiple Nuclear Receptor Pathways

PFOA and PFOS upregulated target gene expression of:

- Peroxisome Proliferator-Activated Receptor α (PPAR α)
- Pregnane X Receptor (PXR)
- Constitutive androstane receptor (CAR)
- Liver X receptor
- Farnesoid X receptor
- Receptor affinity studies have shown that PFOA binds to human ER α

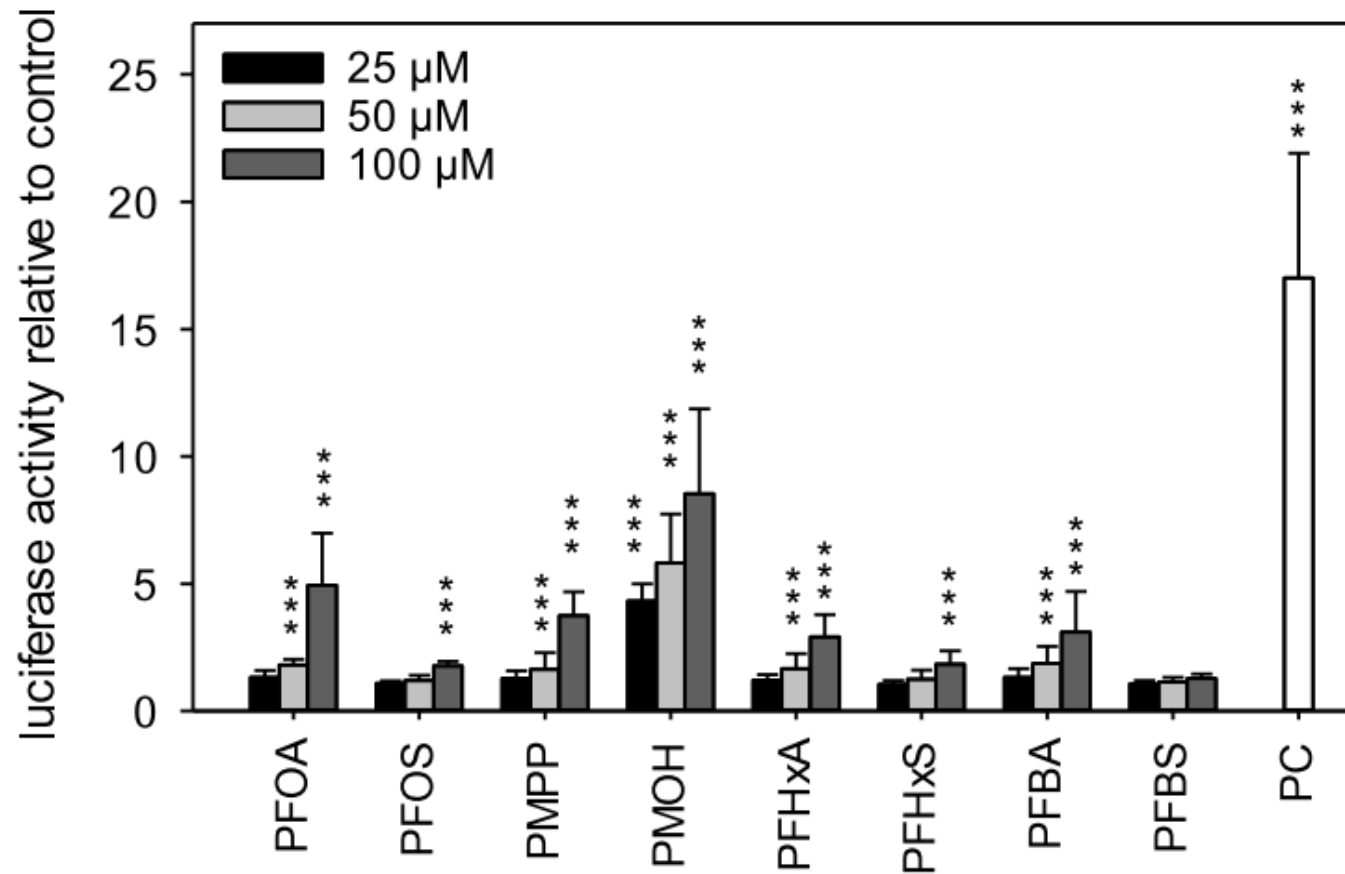
Human Liver Cell Model



PFAS Engage Multiple Nuclear Receptor Pathways

**PPAR α accounts 80-90% of PFAS
regulated genes in WT mice¹
but only ~55-60% in mice expressing
human PPAR α**

Multiple PFAS Activate PPAR α

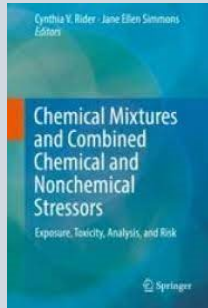




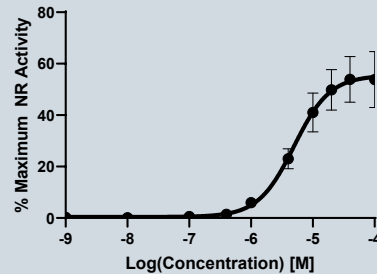
1. Can we model the effects of multiple PFAS on a single molecular initiating event (PPAR α activity)?



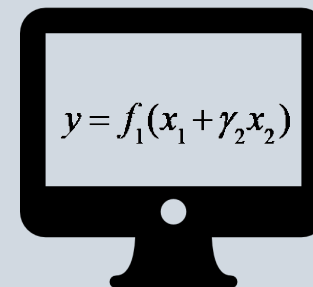
Can we model the effects of multiple PFAS on PPAR α activity?



1. Define null hypothesis mixtures models



2. Generate data on individual PFAS and PFAS mixtures



3. Compare activity predicted by models to empirical PFAS mixtures activity

Models of Additivity

Concentration/Dose Addition

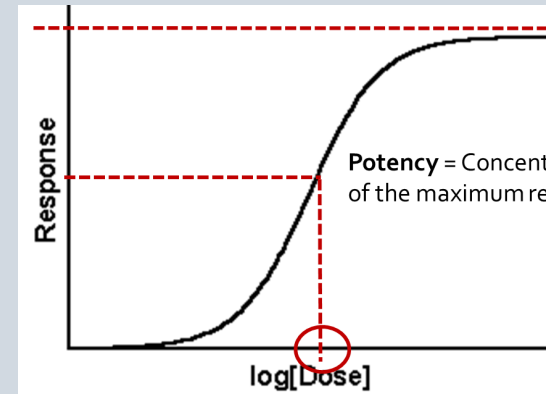
Applied to chemicals with "similar" mechanisms of action

Relative Potency Factor (RPF)

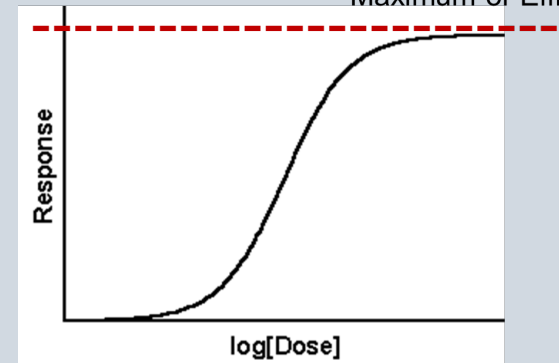
Sums: doses as dilutions of a reference compound

Assumes: equal efficacy

$$y = f_1(x_1 + \gamma_2 x_2)$$



Maximum or Efficacy



Models of Additivity

Concentration/Dose Addition

Applied to chemicals with "similar" mechanisms of action

Relative Potency Factor (RPF)

Sums: doses as dilutions of a reference compound

Assumes: equal efficacy

$$y = f_1(x_1 + \gamma_2 x_2)$$

Generalized Concentration Addition (GCA)

Sums: doses

Assumes: equal or unequal efficacy

$$y = \frac{\alpha_1 \frac{x_1}{K_1} + \alpha_2 \frac{x_2}{K_2}}{1 + \frac{x_1}{K_1} + \frac{x_2}{K_2}}$$

Response Addition

Applied to chemicals with "dissimilar" mechanisms of action

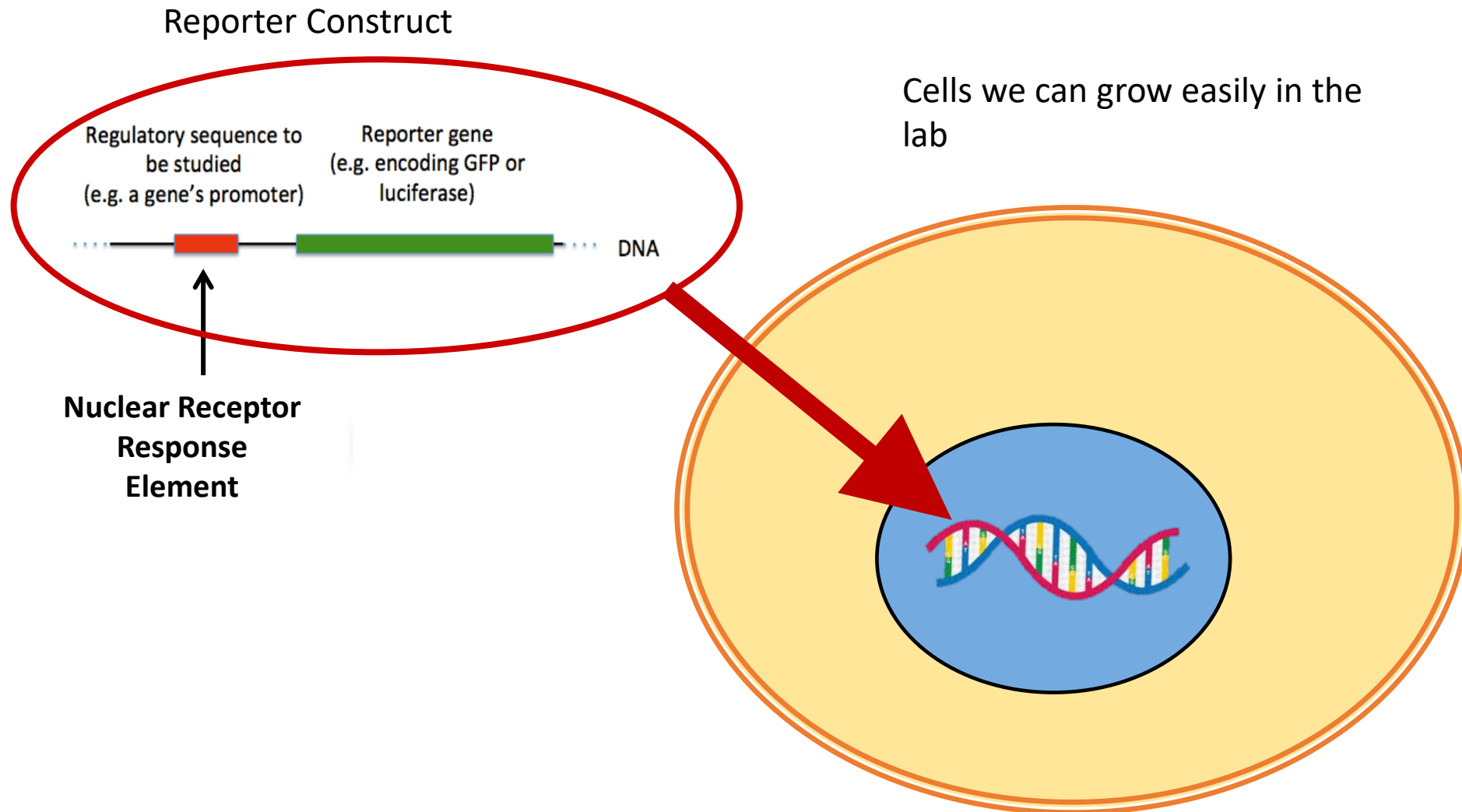
Effect Summation (ES)

Sums: Effect levels

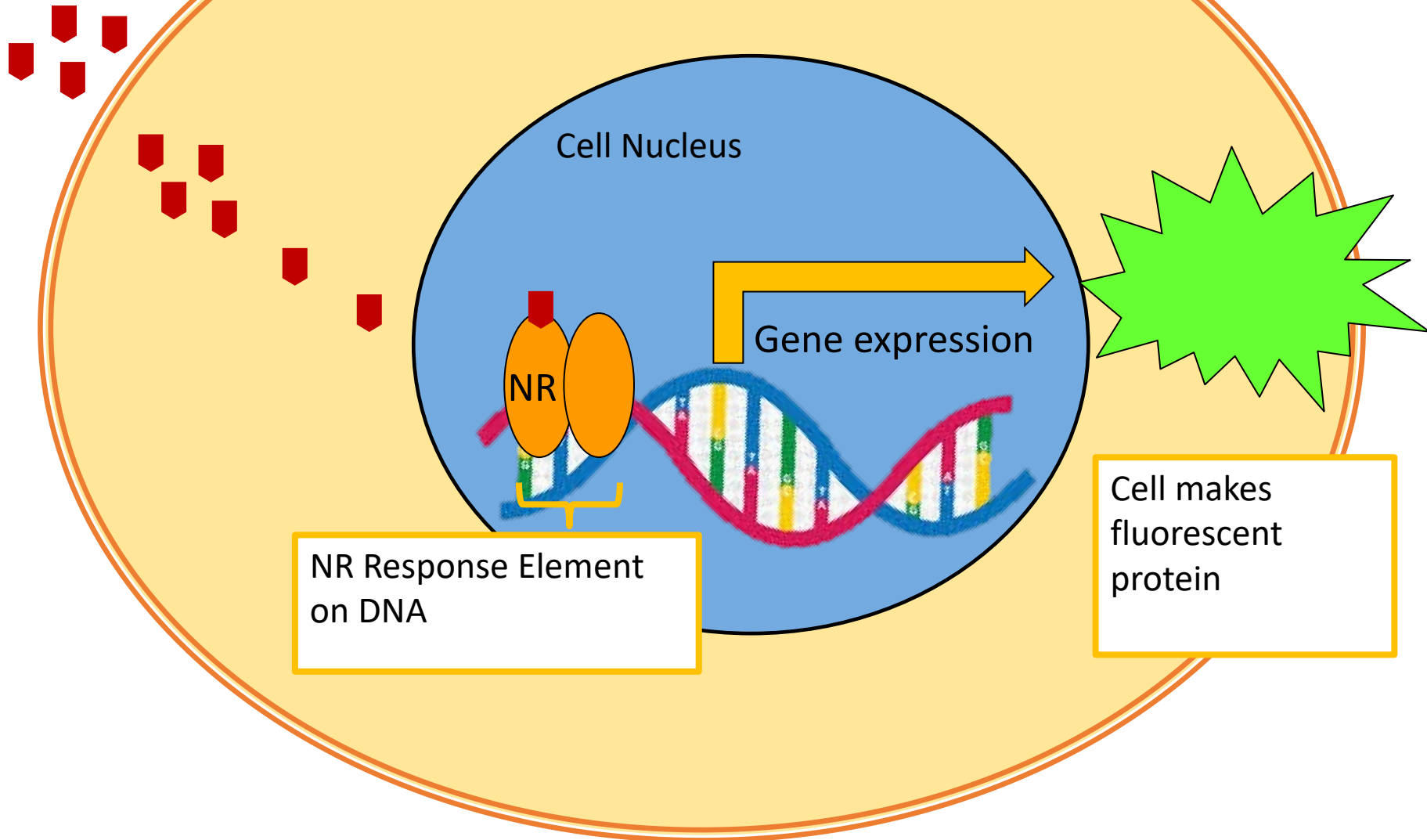
Assumes: Linear dose response curves

$$y = f_1(x_1) + f_2(x_2)$$

How do we study nuclear receptor activity?



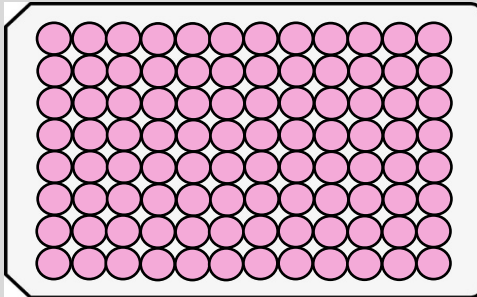
Environmental Chemicals



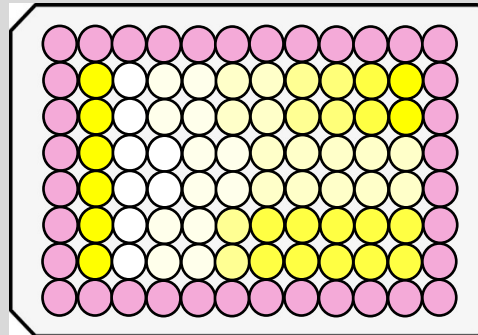
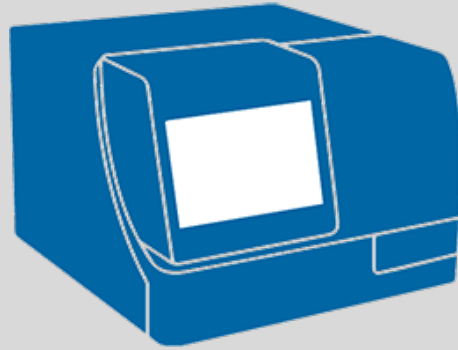
NR Response Element
on DNA

Cell makes
fluorescent
protein

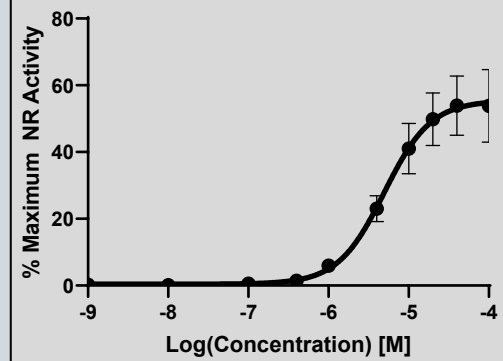
Treat cells with
chemicals or
chemical
mixtures



Measure light
intensity



Analyze Results



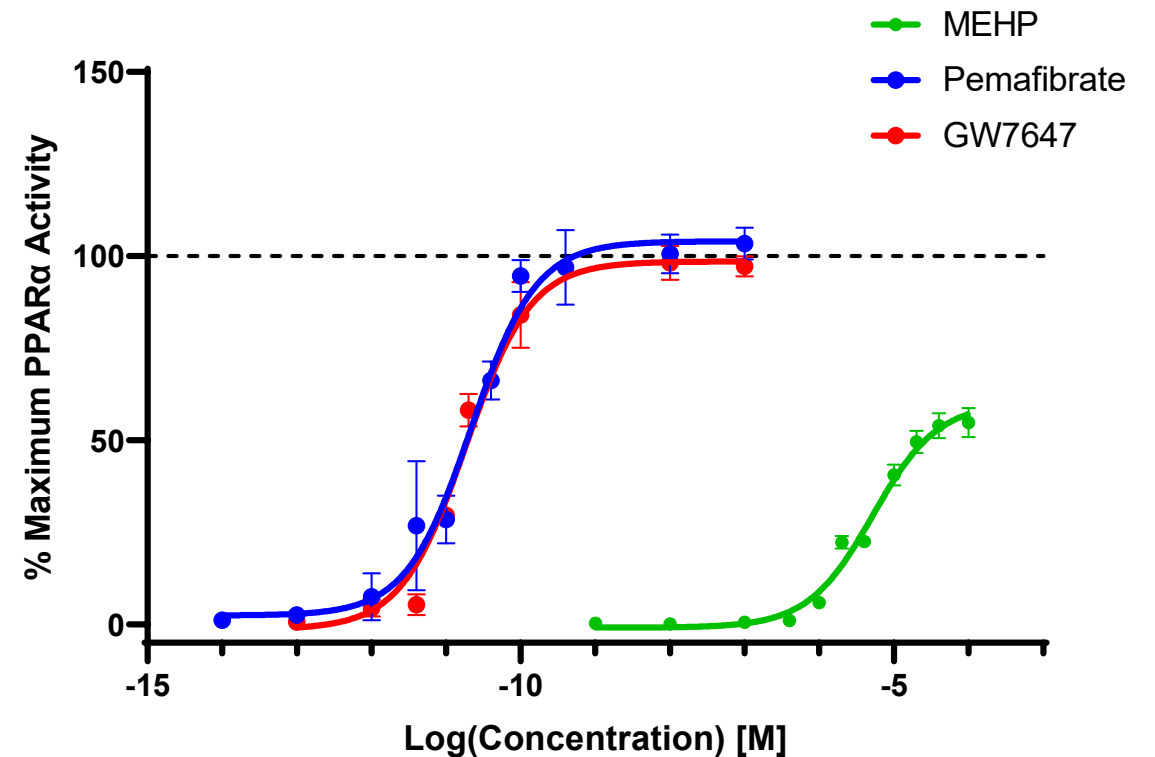
Data Analysis

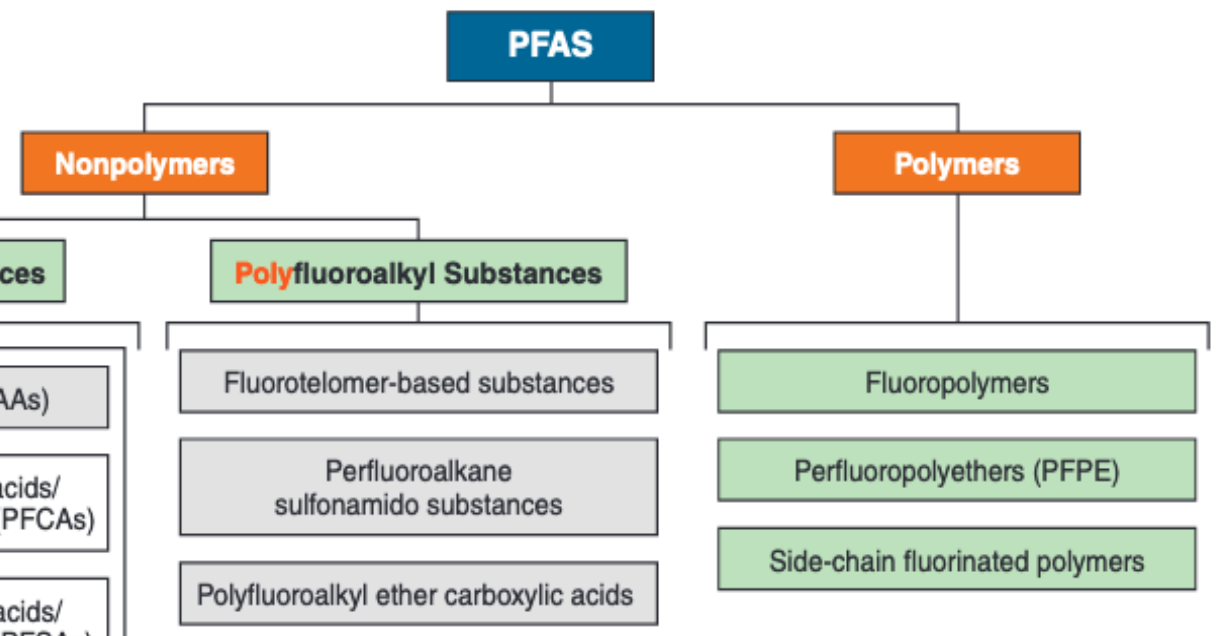
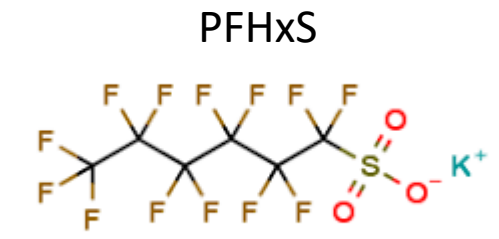
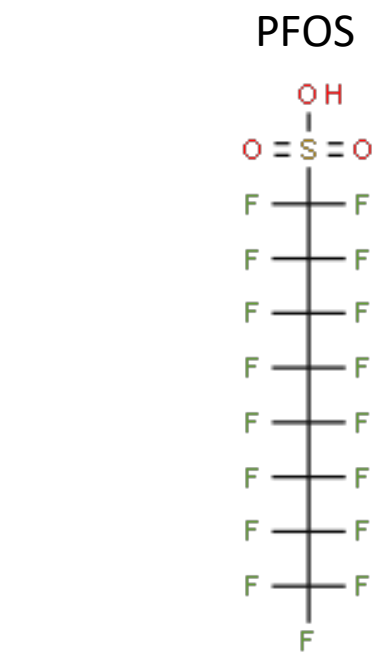
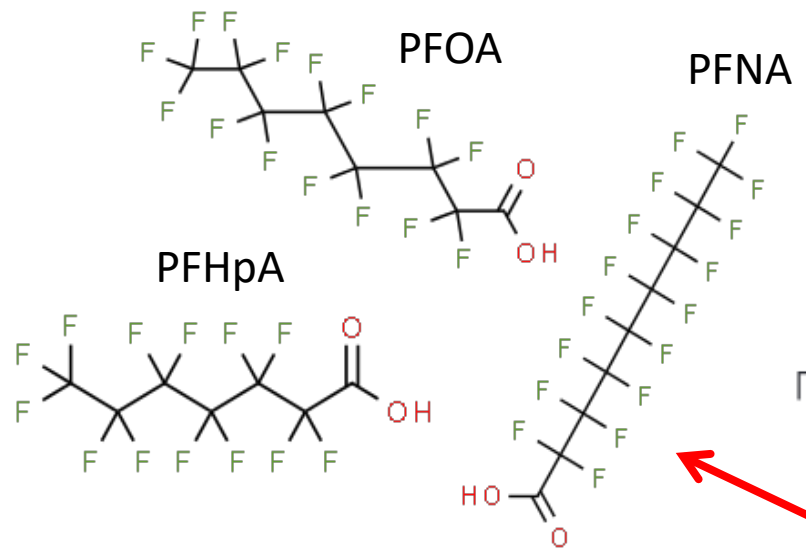
- I. Fit individual dose response curves normalized to PC (GW7647)
- II. Extract **potency** and **efficacy** for modeling
- III. Create and test binary and complex mixtures with known concentrations of each component
- IV. Employ individual dose-response data to predict mixture activity with different models of additivity
- V. Statistically compare predicted activity to experimental activity

Ligand	Ligand Type	Potency (EC ₅₀) M	Efficacy (% Max. Activity)
GW7647	Full Agonist	1.8x10 ⁻¹¹	99
Pemafibrate	Full Agonist	2.2x10 ⁻¹¹	104
MEHP	Partial Agonist	5.2x10 ⁻⁶	60.1
GW6471	Antagonist	*7.3x10 ⁻⁹	0

Only Generalized Concentration Addition (GCA) predicts mixture effects for all different ligand types

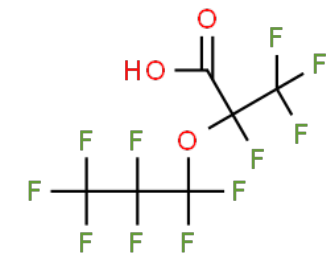
*equilibrium dissociation constant



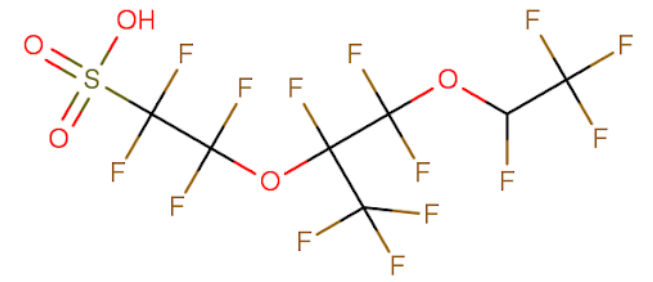


Perfluoroalkyl Ether Acids

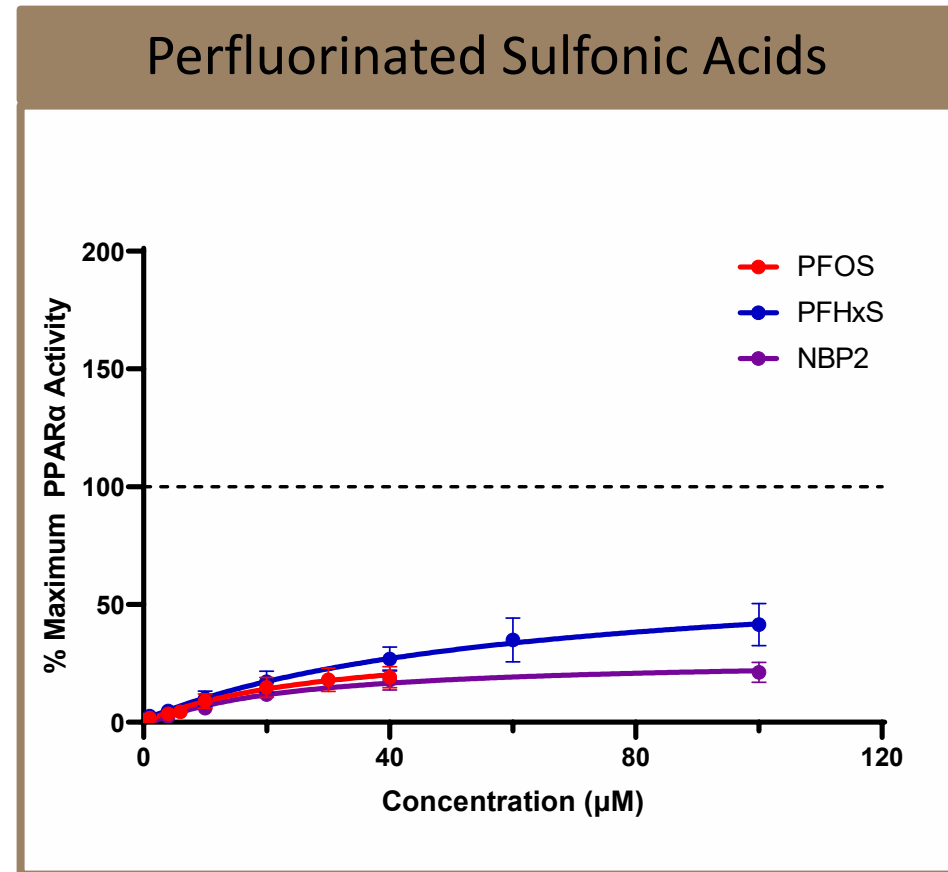
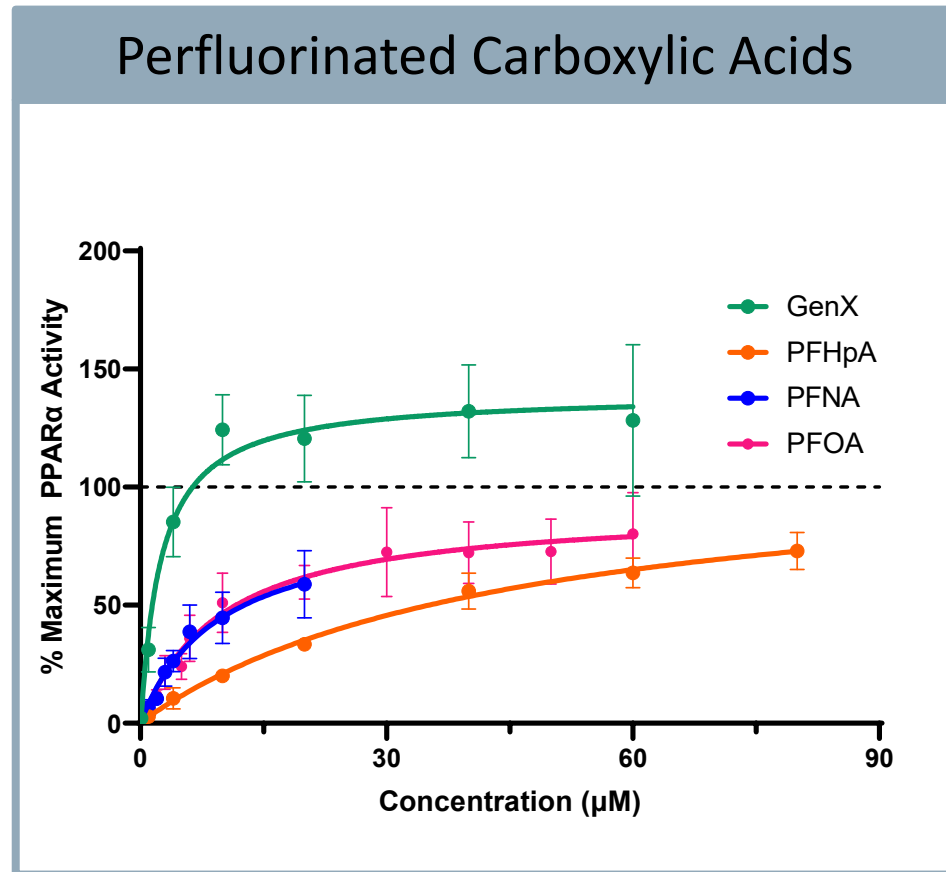
HFPO-DA (GenX)



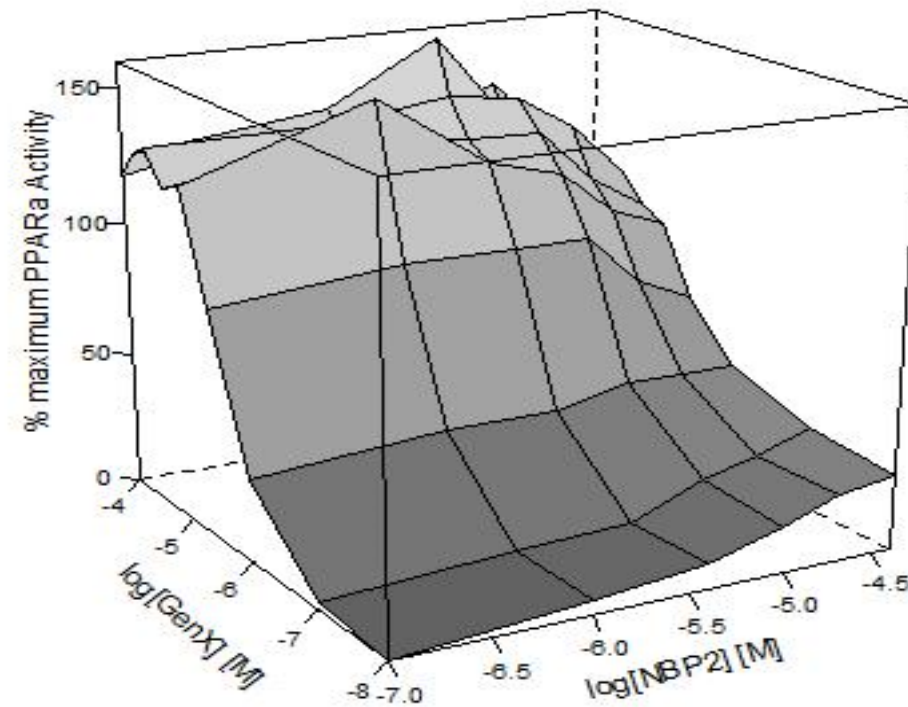
Nafion Byproduct 2



PFCAs more efficaciously activate PPAR α

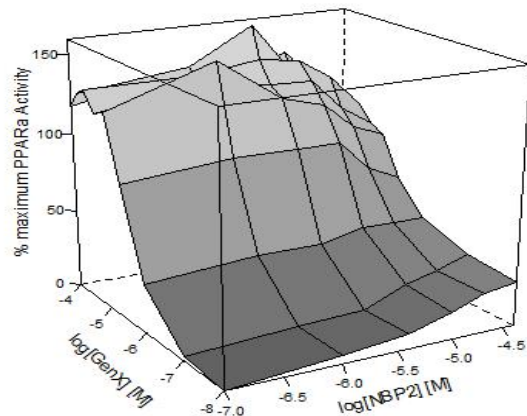


GCA predicts the effects of binary PFAS mixtures: GenX and NBP2

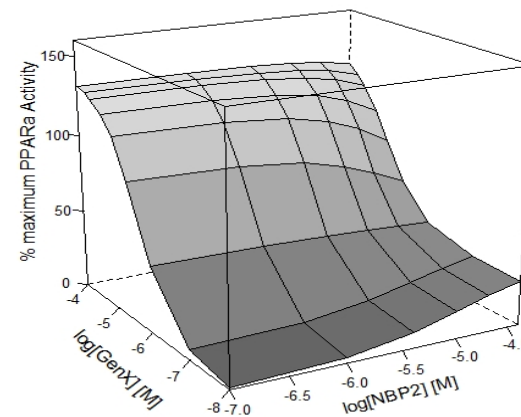


Empirical

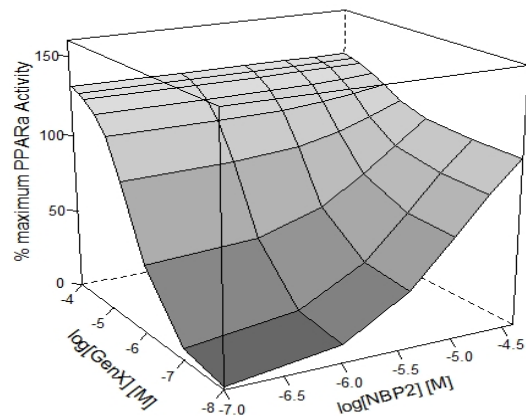
GCA predicts PPAR α activation by binary PFAS mixtures: GenX and NBP2



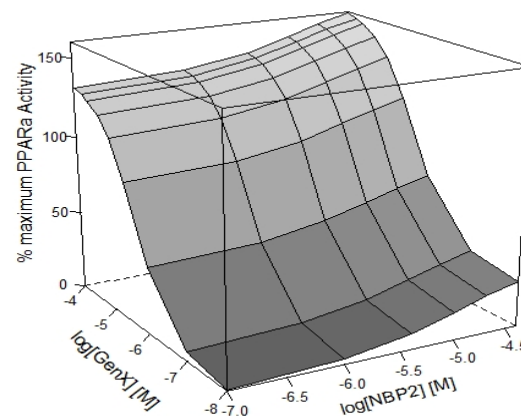
Empirical



GCA (RMSE = 10.9)

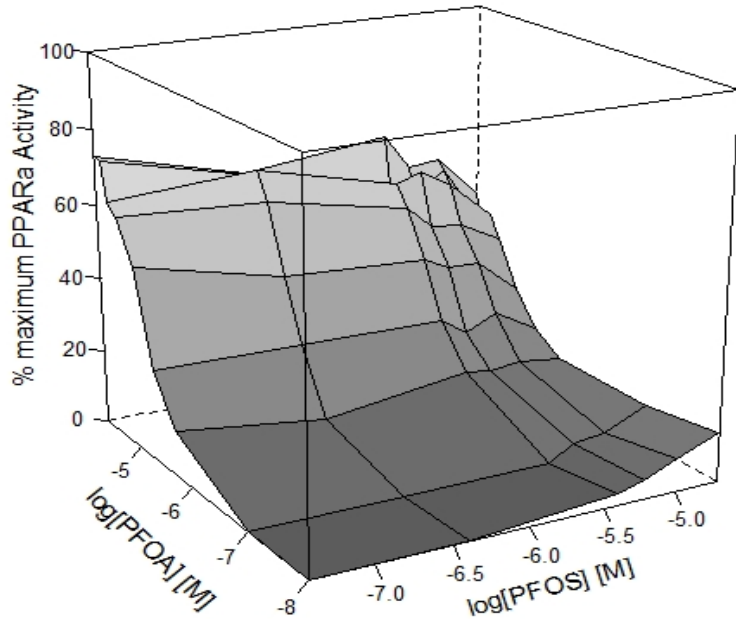


RPF (RMSE = 30.0)

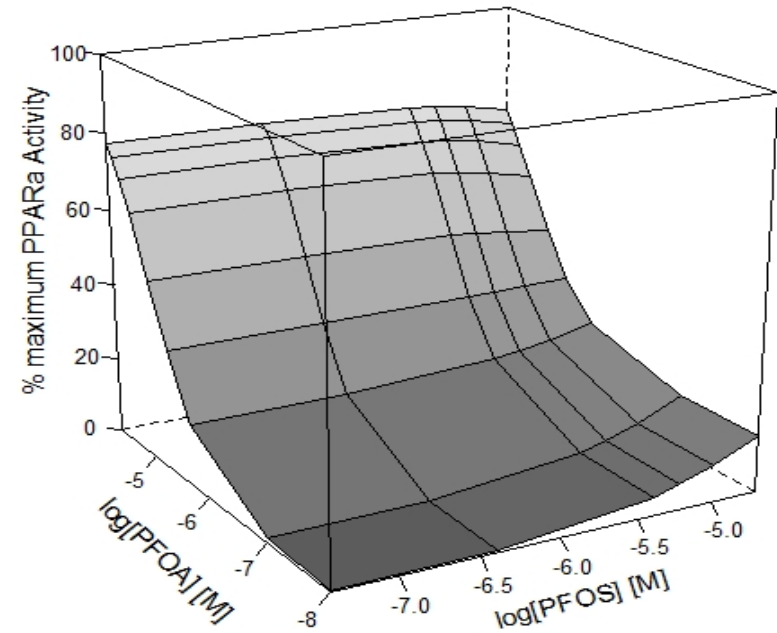


ES (RMSE = 25.7)

GCA predicts PPAR α activation by binary PFAS mixtures: PFOA and PFOS



Empirical



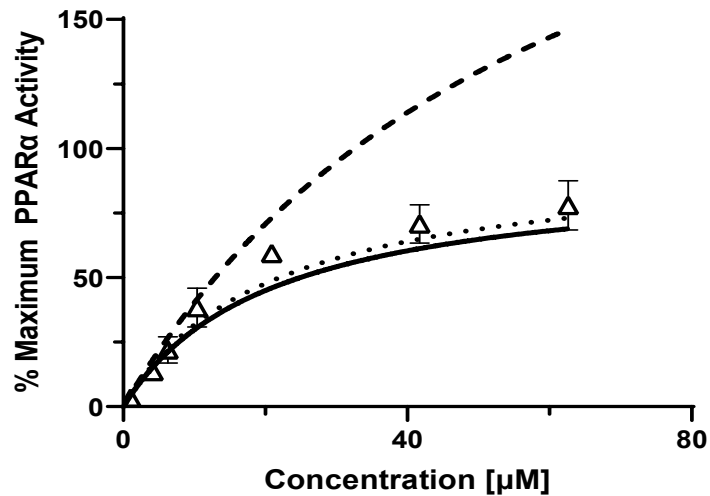
GCA (RMSE = 11.9)

RPF RMSE = 19.1, ES RMSE = 19.8

RPF and GCA Predict PPAR α Activation by Mixtures of PFCAs

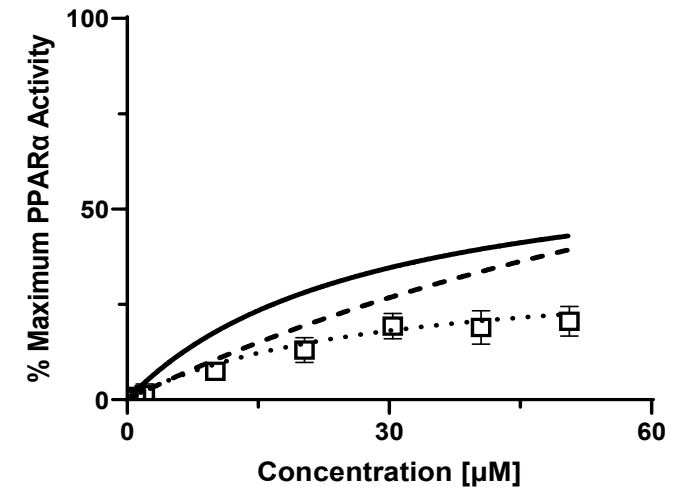
GCA Predicts PPAR α Activation by Mixtures of PFSA

PFOA*, PFHpA, PFNA
(equipotent mixture)



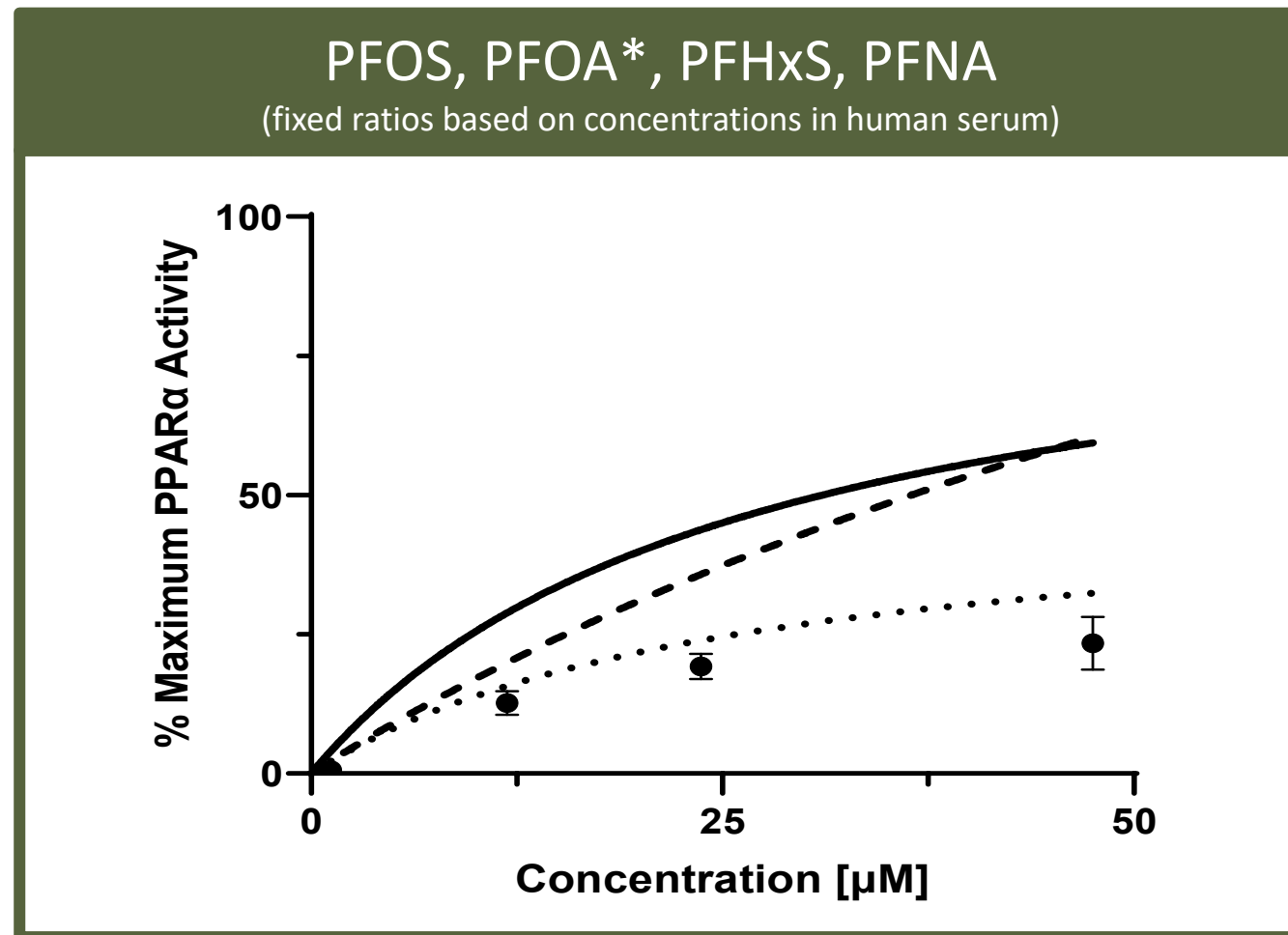
- - ES Prediction
- RPF Prediction
- GCA Prediction
- \triangle Empirical PFCAs Data
- \square Empirical PFSA Data

PFHxS, PFOS*, NBP2
(equipotent mixture)



* Reference compound for RPF modeling

GCA Predicts PPAR α Activation by Human-Relevant Mixtures



- - ES Prediction
- RPF Prediction
- GCA Prediction
- Empirical Data

* Reference compound for RPF modeling

Conclusions

- I. **Human relevant biological systems** provide insight into the interaction between environmental chemicals and key molecular initiating events
- II. PFAS are human PPAR α agonists that vary in potency and efficacy
- III. Modeling approaches that incorporate both potency and efficacy provide the most accurate predictions of PPAR α activity by diverse ligands
- IV. Generalized Concentration Addition accurately predicts the effects of PFAS mixtures on human PPAR α activity *in vitro*



1. We can model the effects of multiple PFAS on single molecular initiating event.
2. Can we use these modeling approaches to support regulatory efforts to group PFAS?

More about this project:



Follow up with any questions
Greylin Nielsen
nielseng@bu.edu

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Dr. Wendy Heiger-Bernays



Dr. Jennifer Schlezinger



Dr. Tom Webster