Metabolic Perceptrons for Neural Computing in Cell Free Systems

Amir Pandi, Mathilde Koch, Peter Voyvodic, Paul Soudier, Jerome Bonnet, Manish Kushwaha, Jean-Loup Faulon

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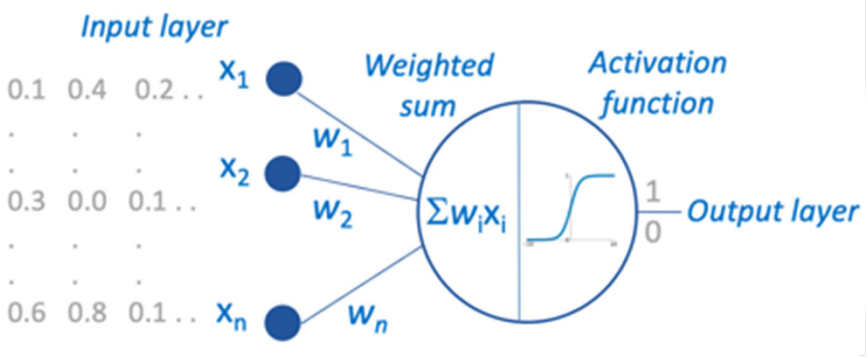
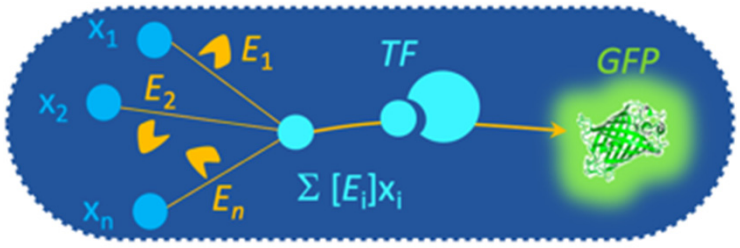
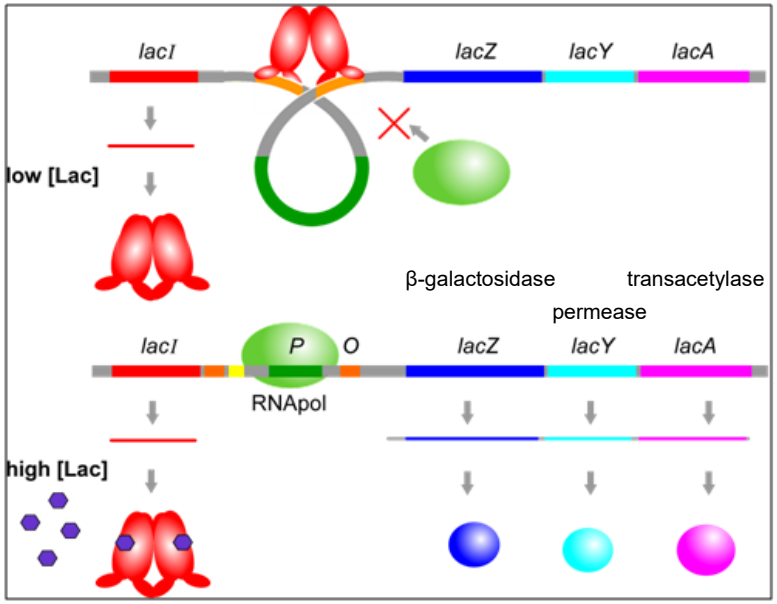




Cell Free Systems Conference
4 December 2019, Boston

Do biological systems compute?

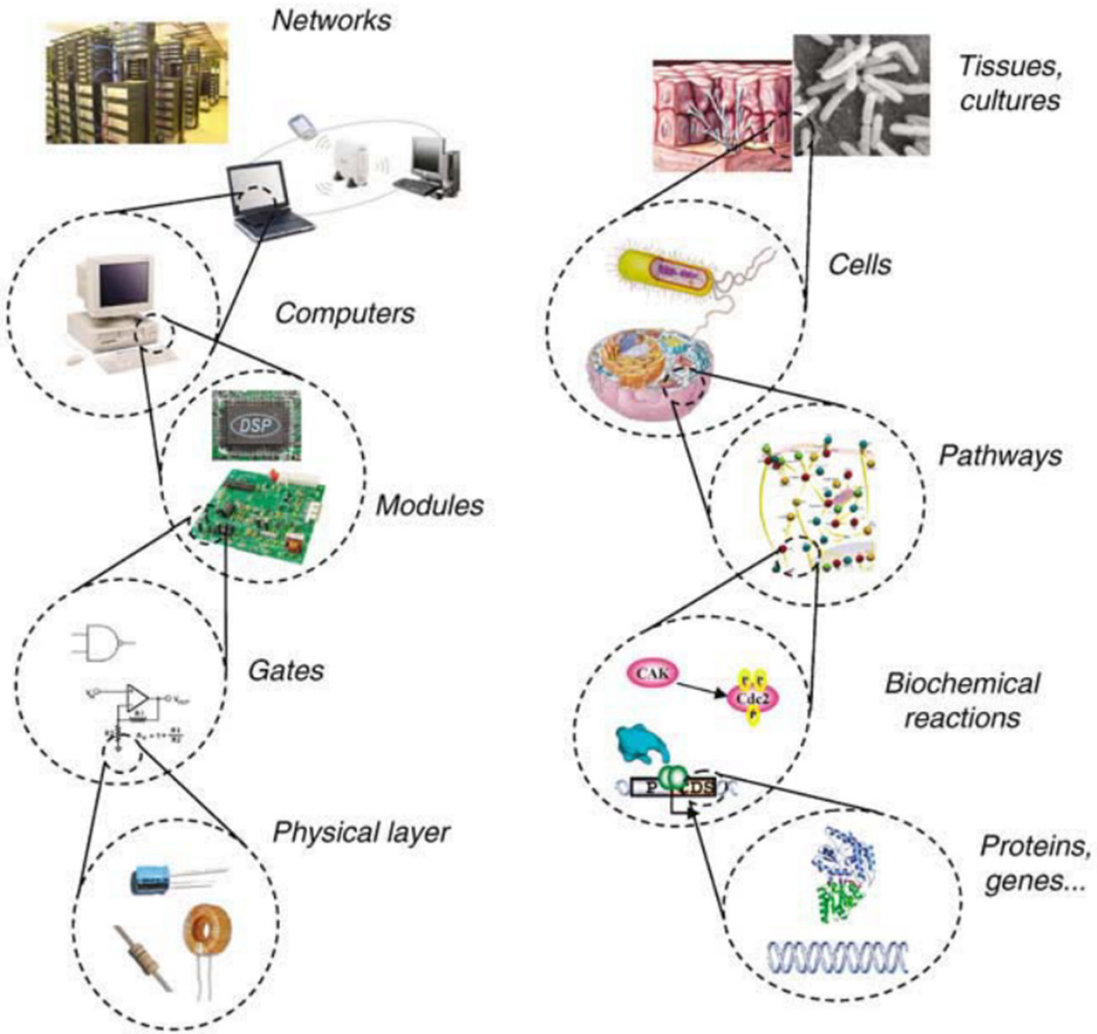


Deyholos-CC:AN

"... Thus the logic of this system is simple in the extreme: the repressor inactivates transcription; it is inactivated in its turn by the inducer. From this double negation results a positive effect, an "affirmation".... The logic of biological regulatory systems abides not by Hegelian laws but, like the workings of computers, by the propositional algebra of George Boole."

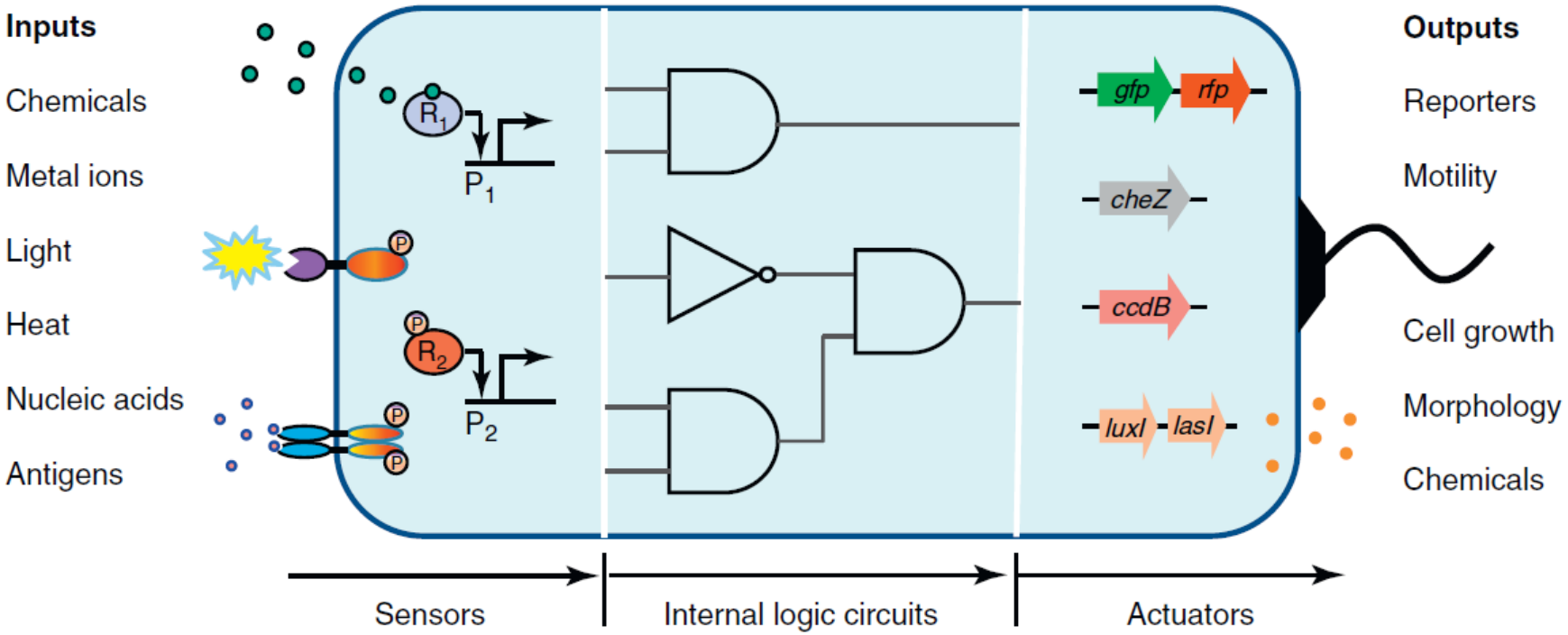
-Jacques Monod. *Chance and Necessity: An Essay on the Nature of Philosophy of Modern Biology*. Collins, London, 1972.

Parallels with the computational “parts” hierarchy



Andrianantoandro et al. (2006). Molecular systems biology.

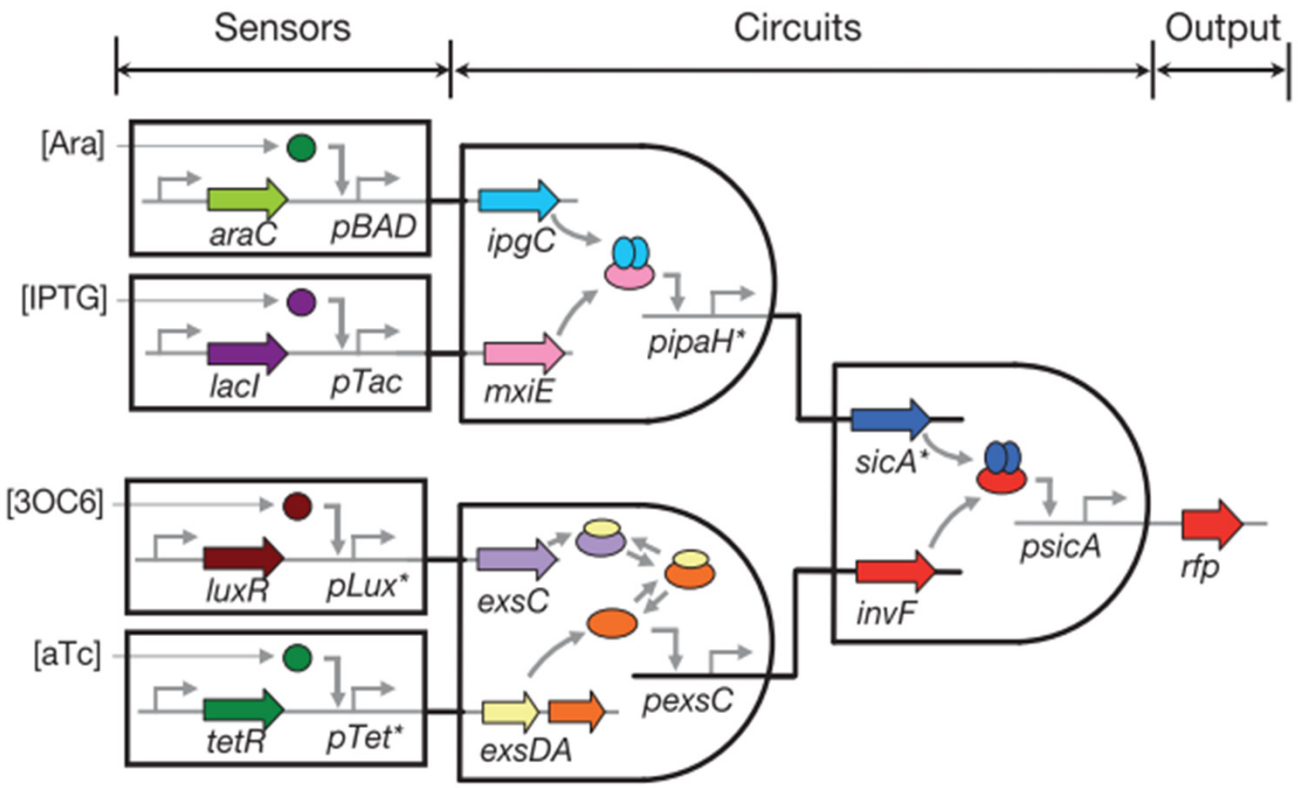
Cells process a diverse range of information

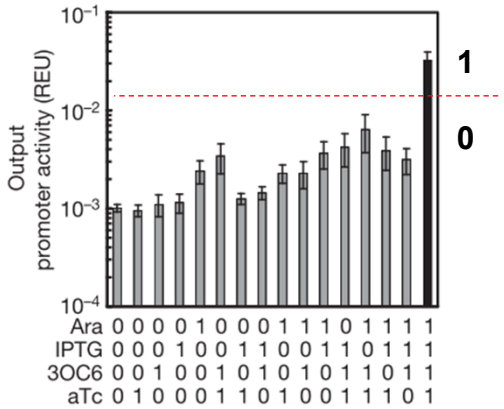


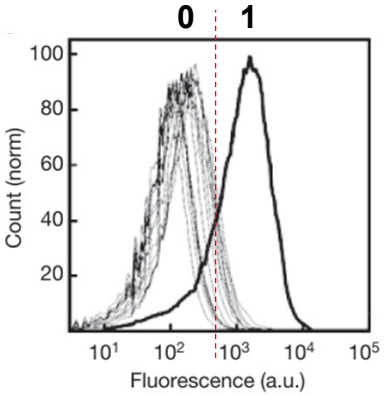
- Cells process a wide variety of extracellular and intracellular information.

(Wang & Buck, 2012. Trends in Microbiology)

Gene expression regulation for digital logic



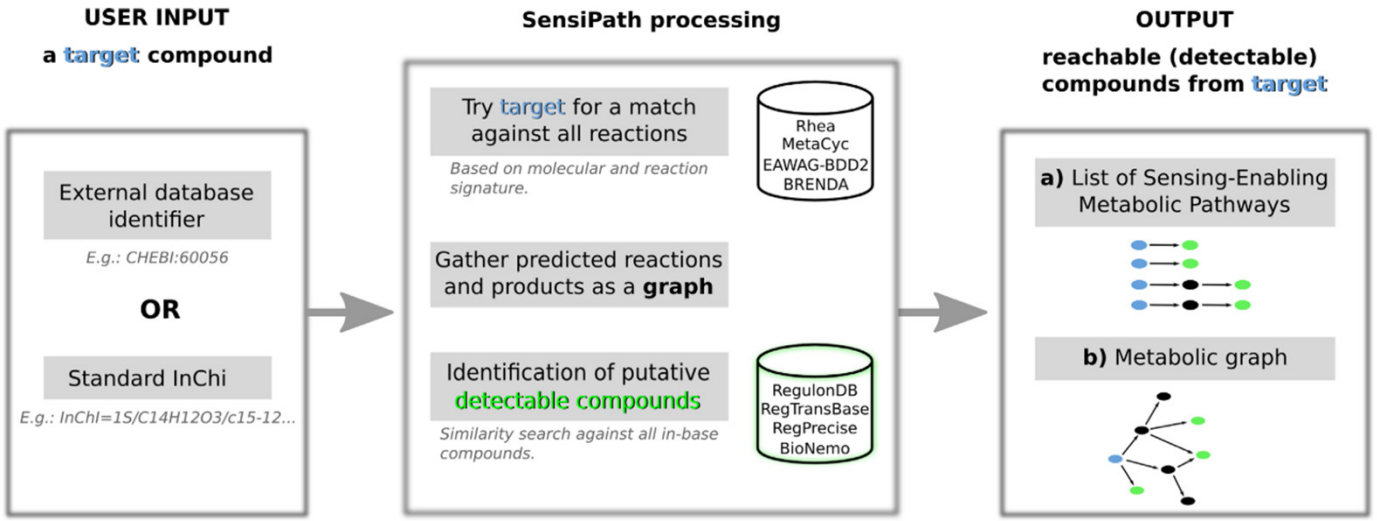




- Layered transcriptional regulation can be used for multi-input computational logic
- Continuous signals must be “discretized” in order to treat them as digital ‘0’ or ‘1’

(Moon *et al.*, 2012. Nature.)

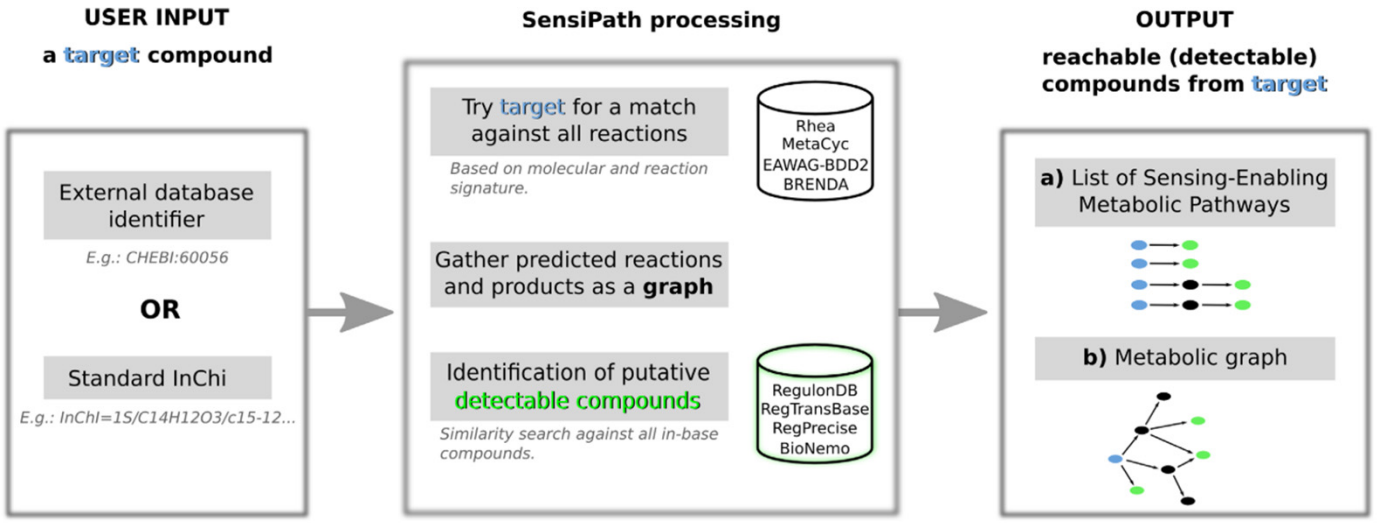
Sensing-enabling metabolic pathways (SEMP)

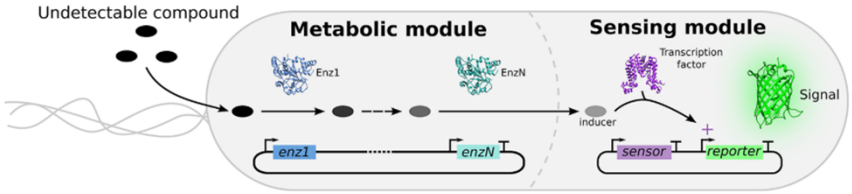


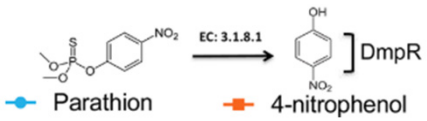
- Sensing-enabling metabolic pathways enable indirect sensing of molecules for which direct transcriptional regulators are unknown

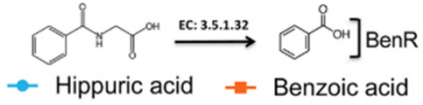
(Delepine *et al.*, 2016. NAR.

Sensing-enabling metabolic pathways (SEMP)





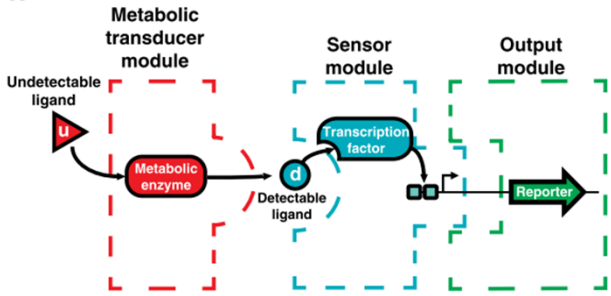


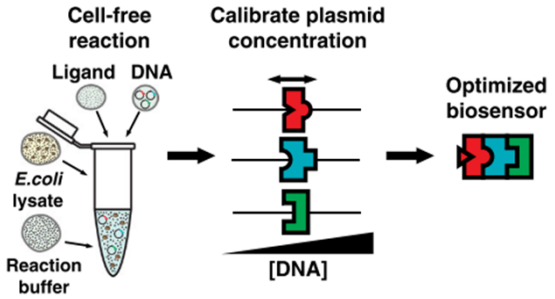


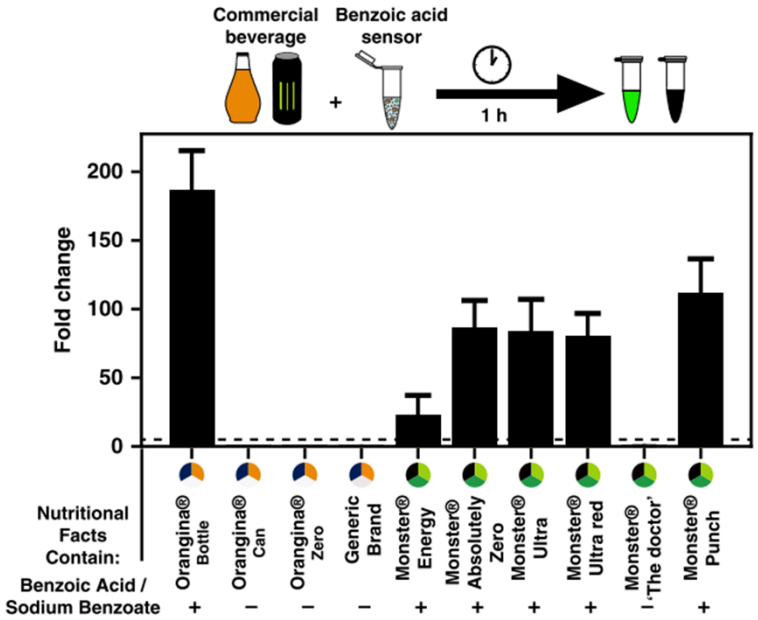
- Sensing-enabling metabolic pathways enable indirect sensing of molecules for which direct transcriptional regulators are unknown

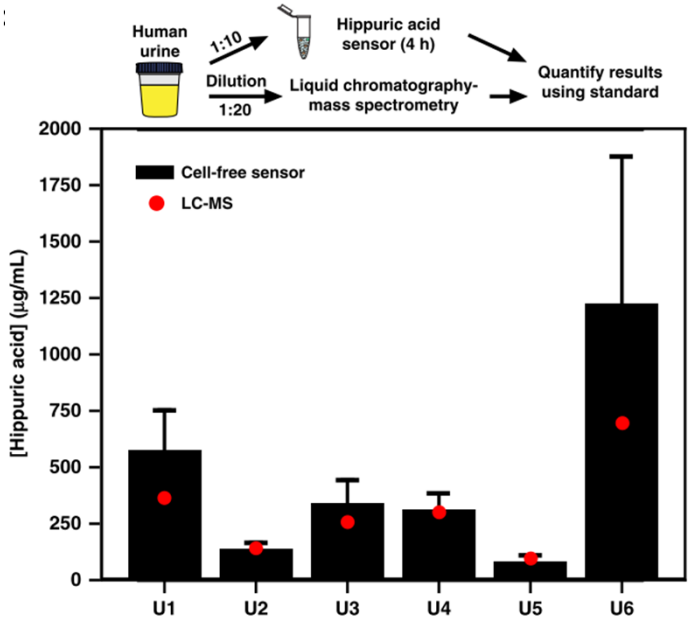
(Delepine *et al.*, 2016. NAR.
Libis *et al.*, 2016. ACS Synth. Biol.)

Sensing-enabling metabolic pathways in Cell Free Systems





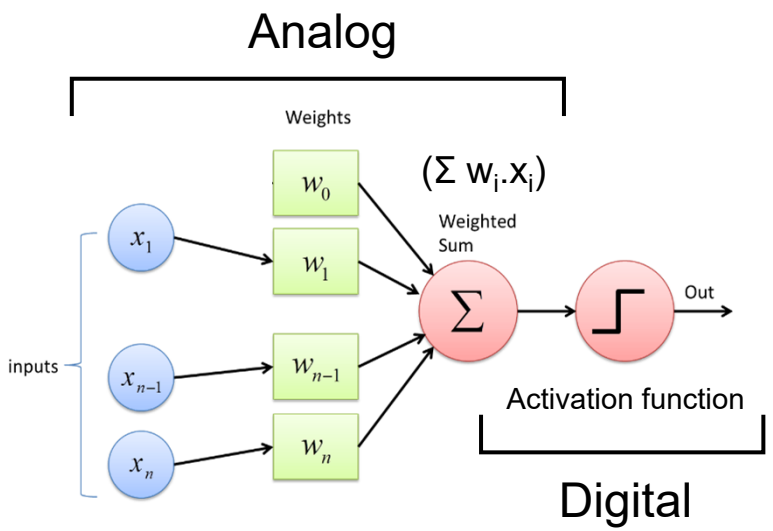


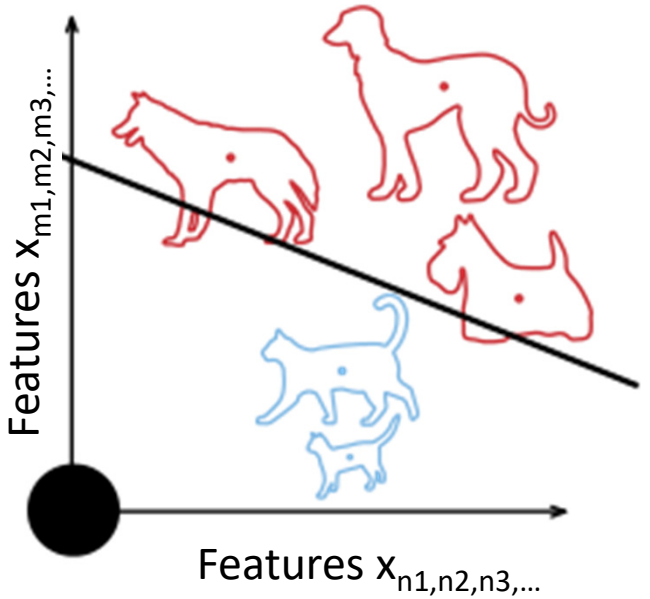


- Metabolic “transducers” convert undetectable molecules into a detectable ones, which in turn can be sensed by the “sensors”
- Cell Free Systems allow easier optimization of the biosensing system

(Voyvodic *et al.*, 2019. Nat. Commun.)

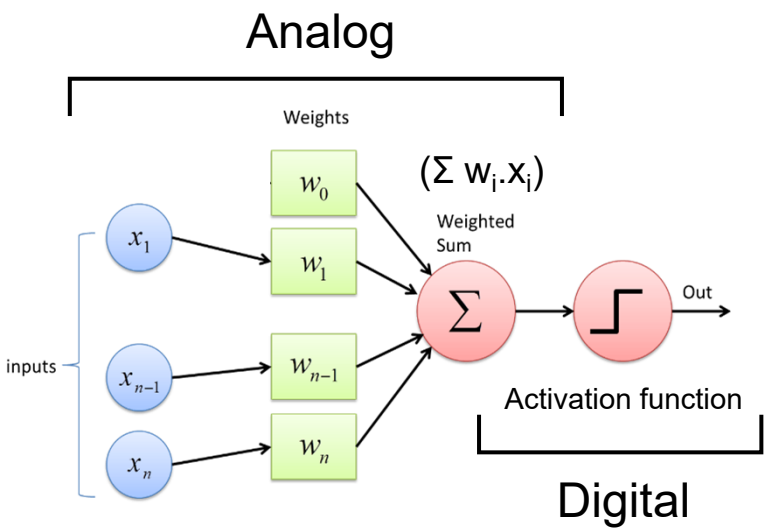
A Perceptron for multi-input sensing

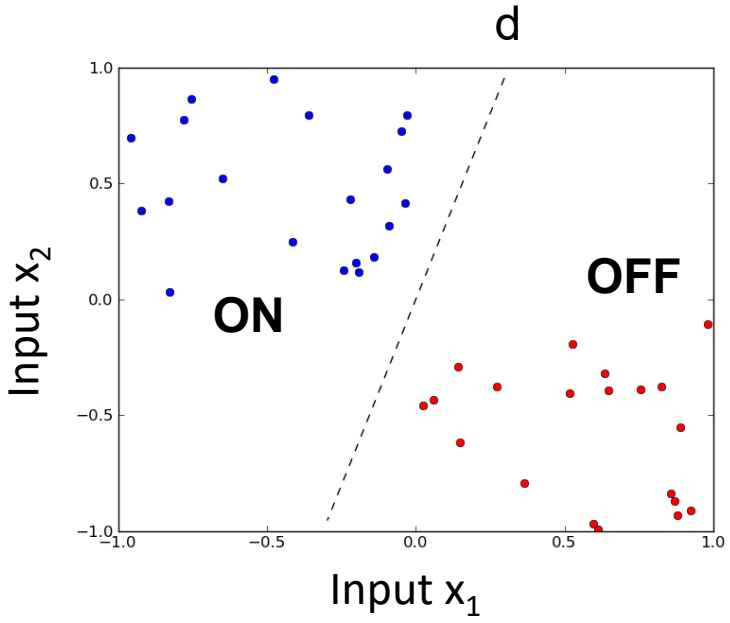




- The perceptron mimics the neuron's ability to process information
- It is a basic block of artificial neural networks

A Perceptron for multi-input sensing

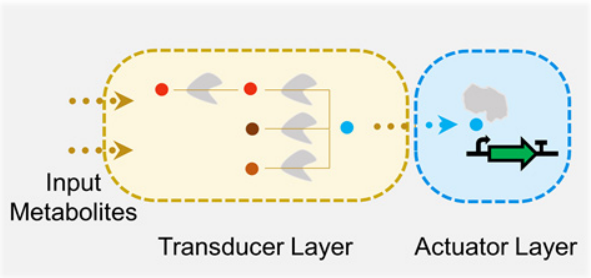


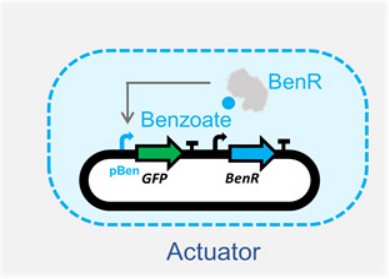


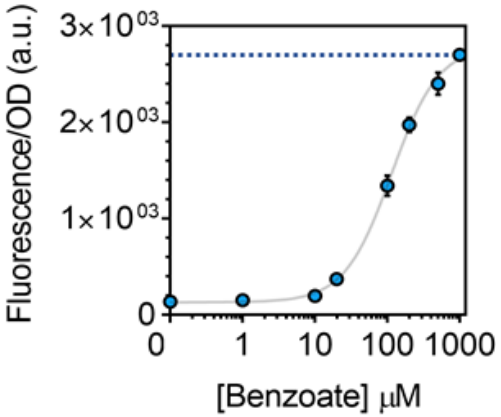
If $(\Sigma\ w_i.x_i) > d$, ON

If $(\Sigma\ w_i.x_i) <= d$, OFF

Characterizing and modeling the benzoate actuator

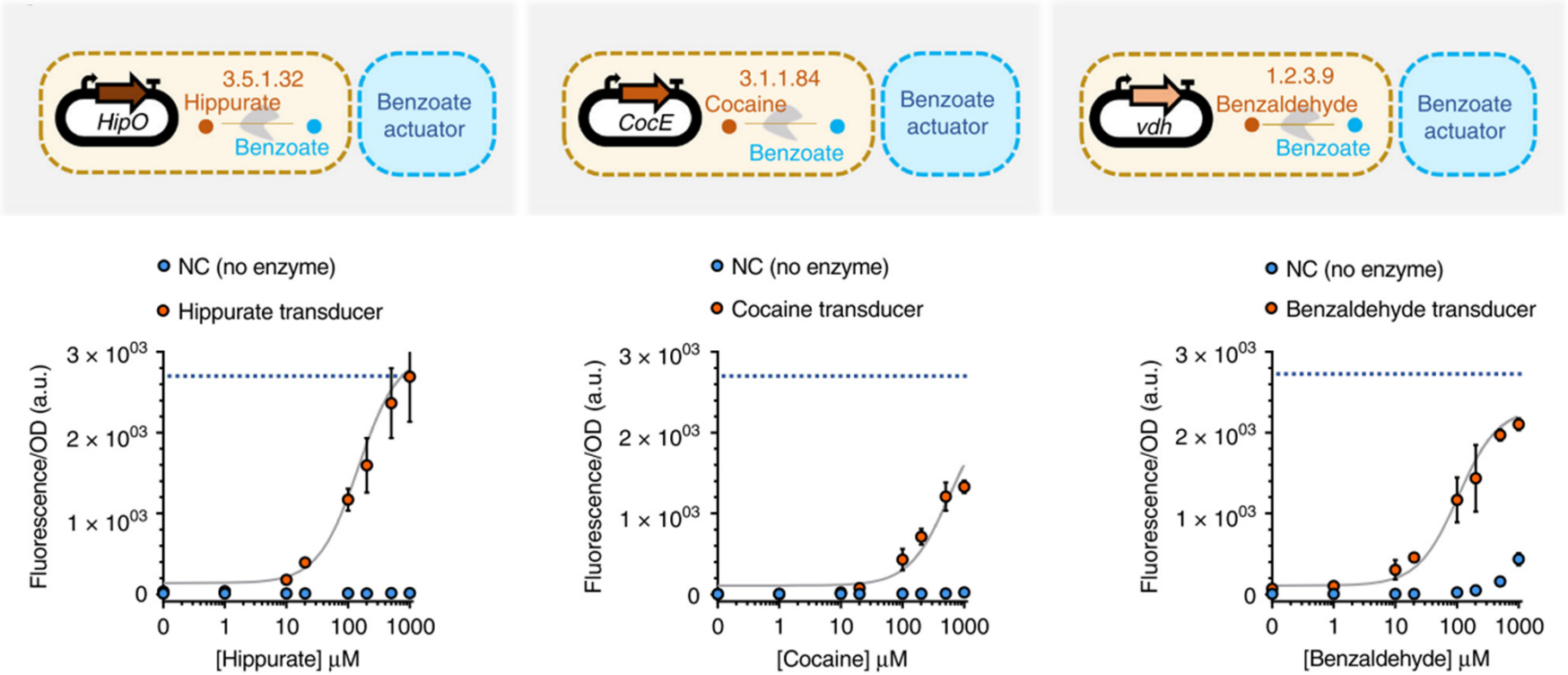






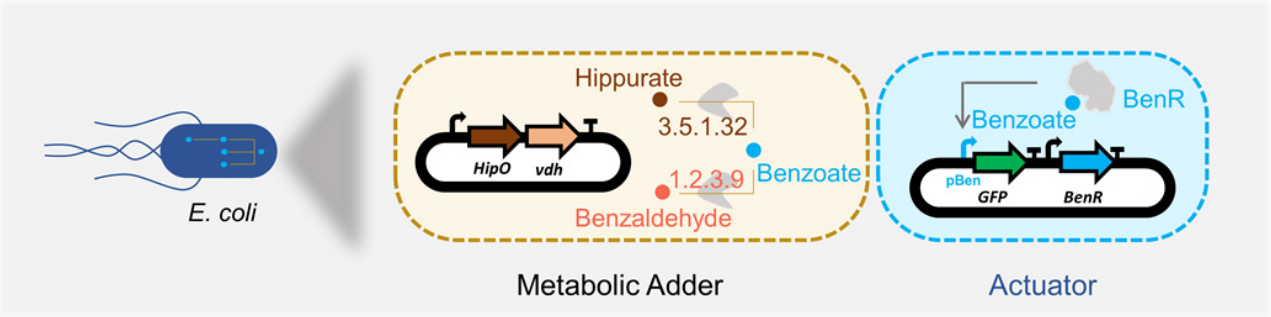
- The benzoate actuator device in *E. coli*

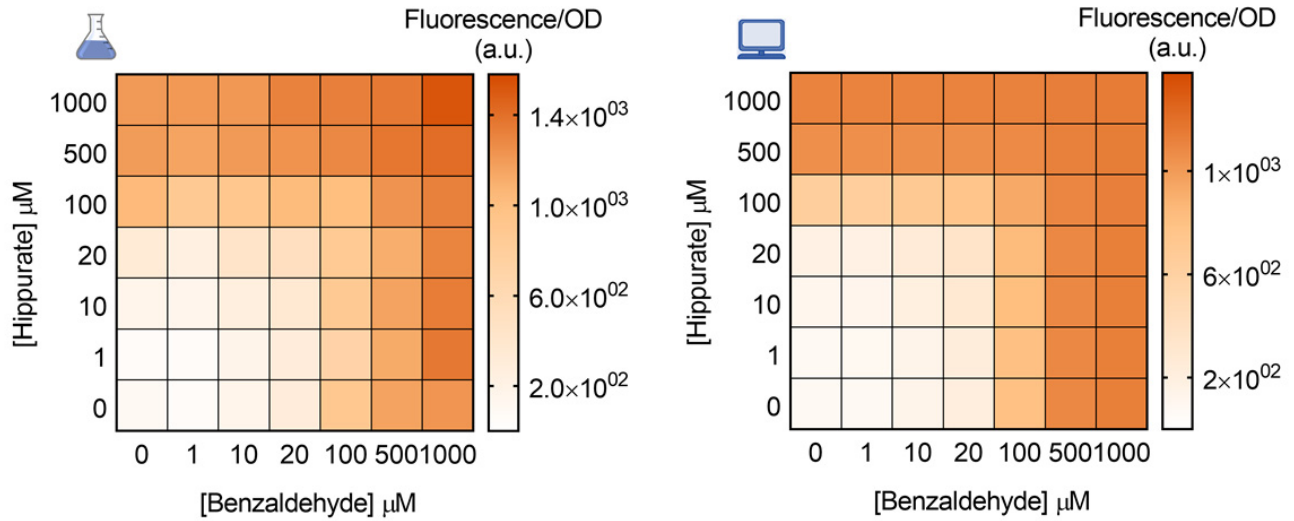
Characterizing and modeling the metabolic transducers



- Three metabolic transducers in *E. coli*

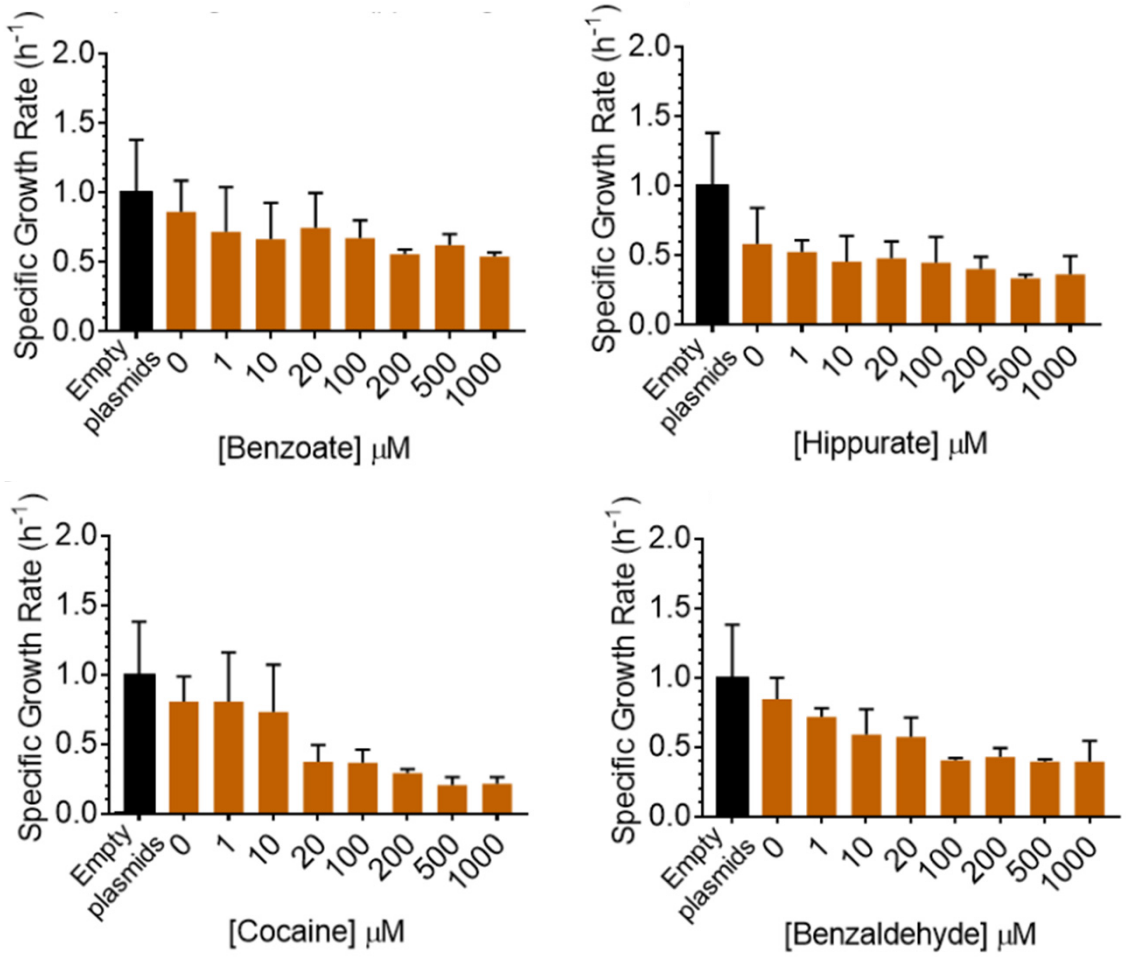
Characterizing and modeling the metabolic adders





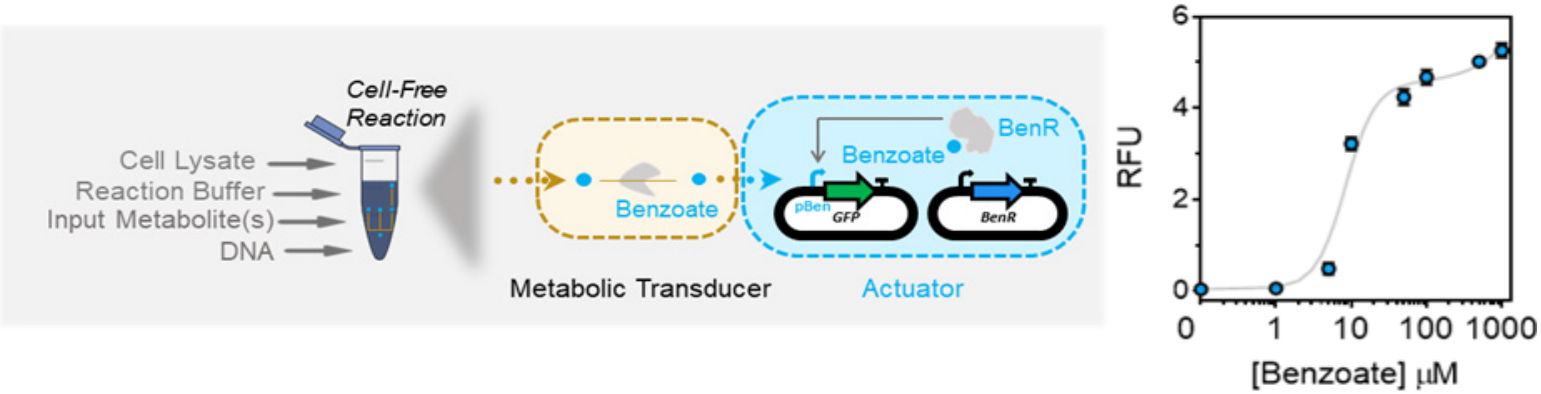
- Metabolic concentration adders in *E. coli*

Effect of input concentrations on *E. coli* growth



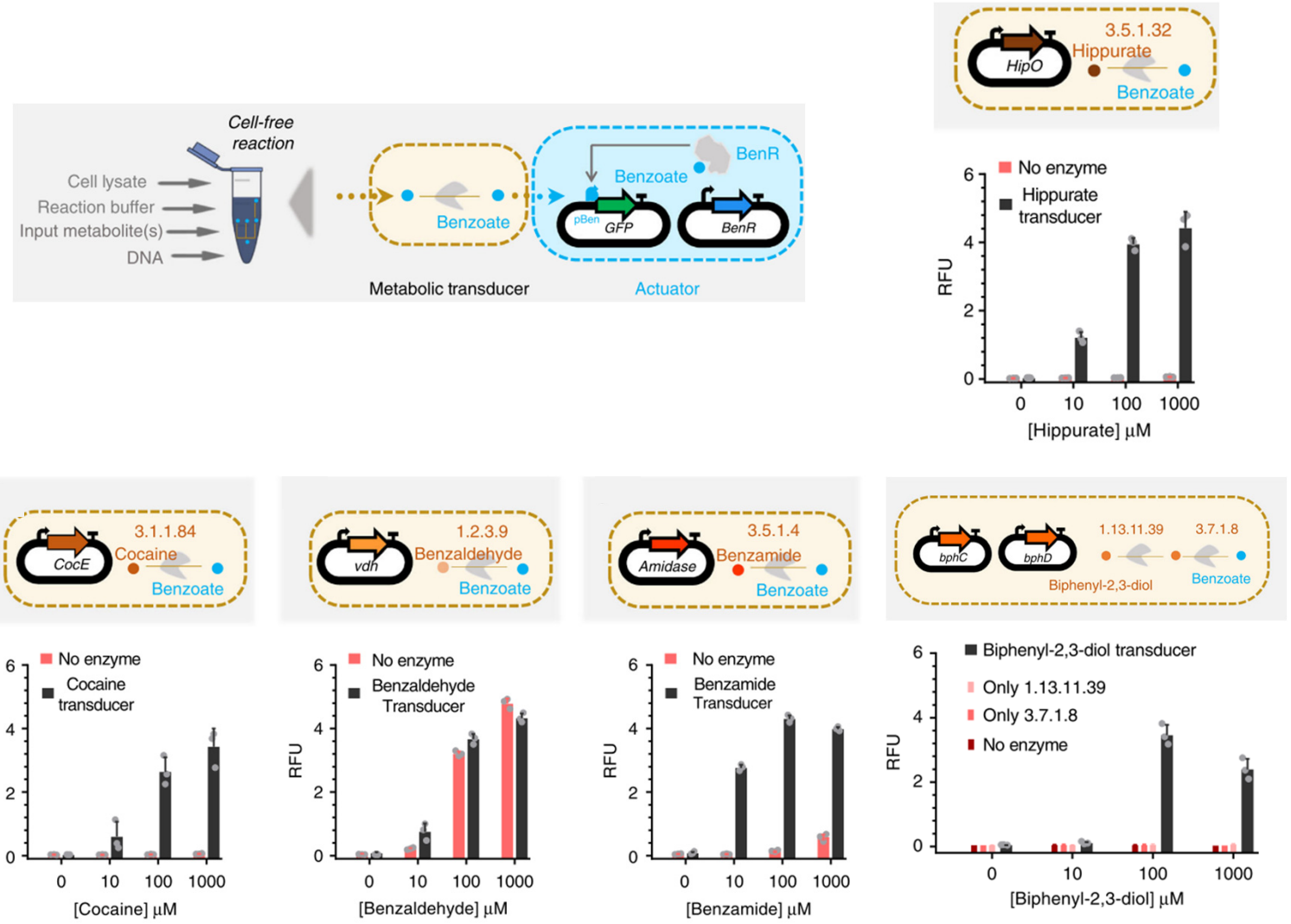
- Higher concentrations of input and intermediate molecules reduce growth in *E. coli*

Characterizing and modeling the benzoate actuator



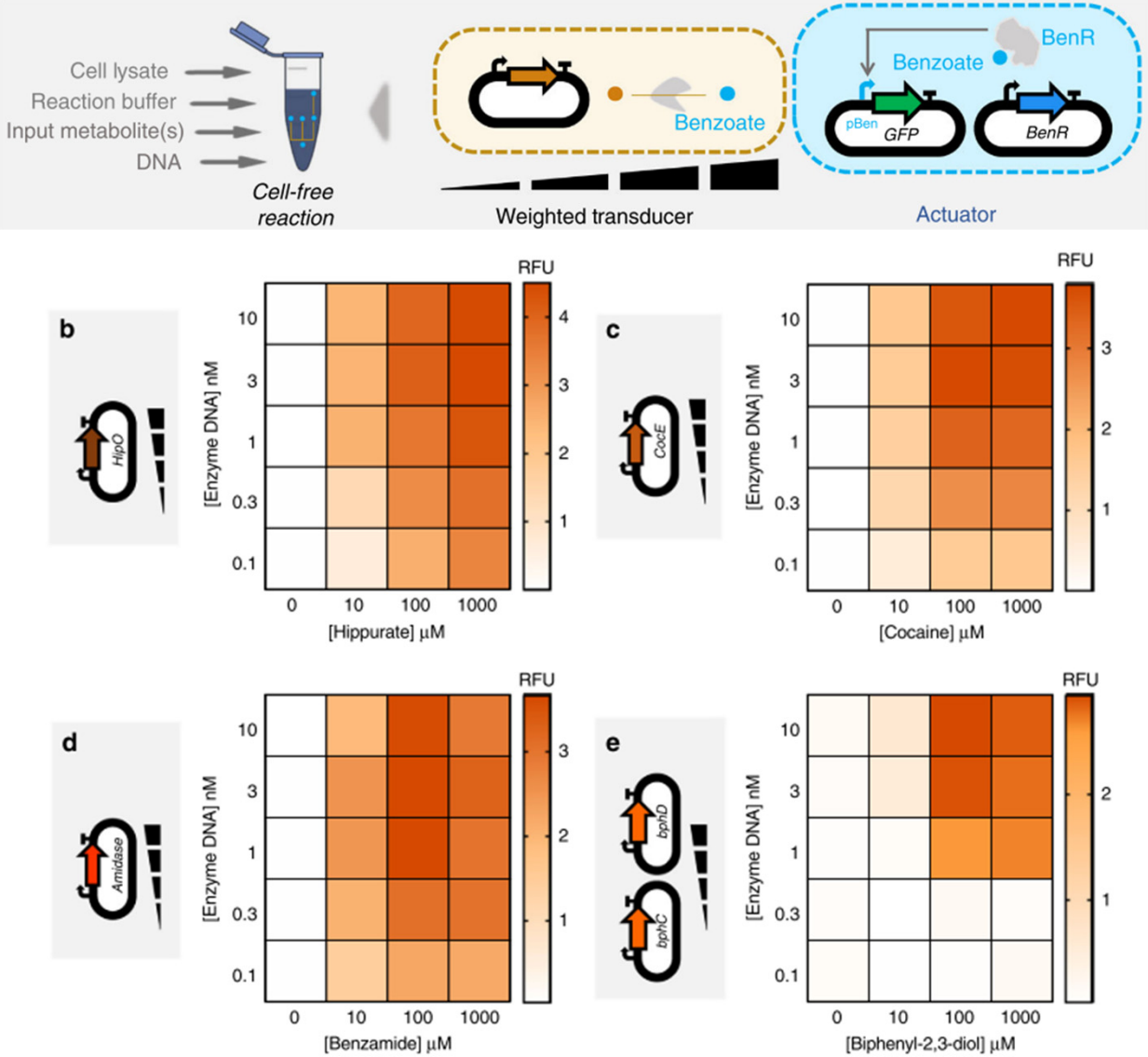
- The benzoate actuator device in Cell Free System

Characterizing and modeling the metabolic transducers



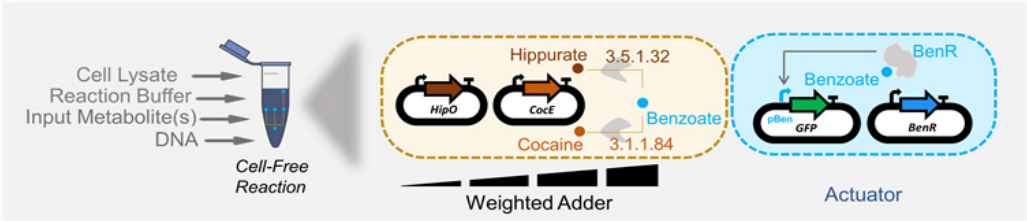
- Five metabolic transducers in Cell Free System

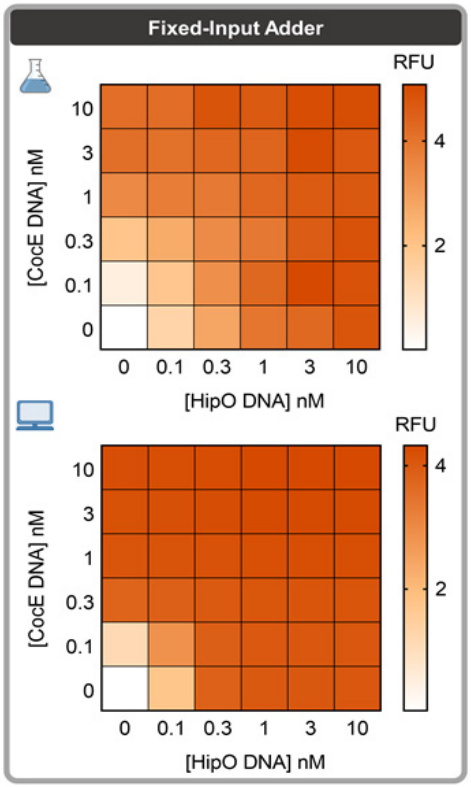
Building the Cell Free weighted transducers



- The weight of a traducer can be tuned by changing the amount of transducer DNA added

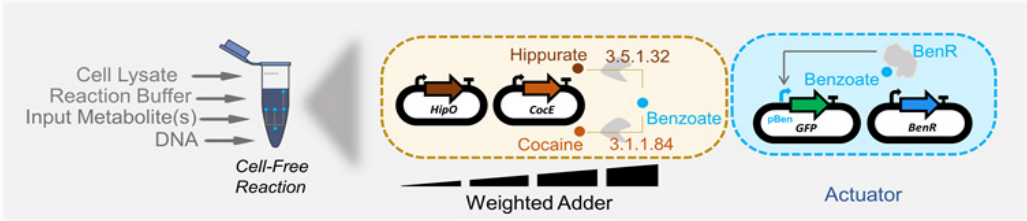
Characterizing and modeling the metabolic adders

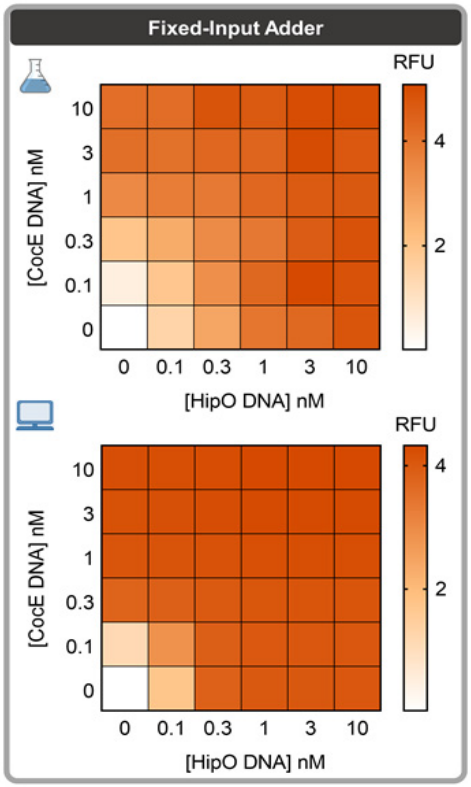


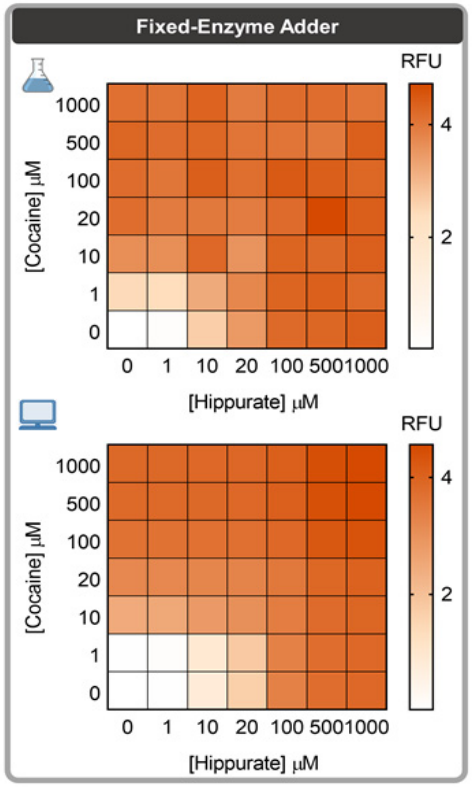


- Metabolic concentration weighted adders in Cell Free System

Characterizing and modeling the metabolic adders

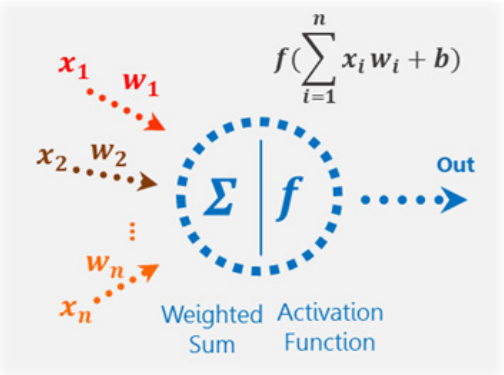


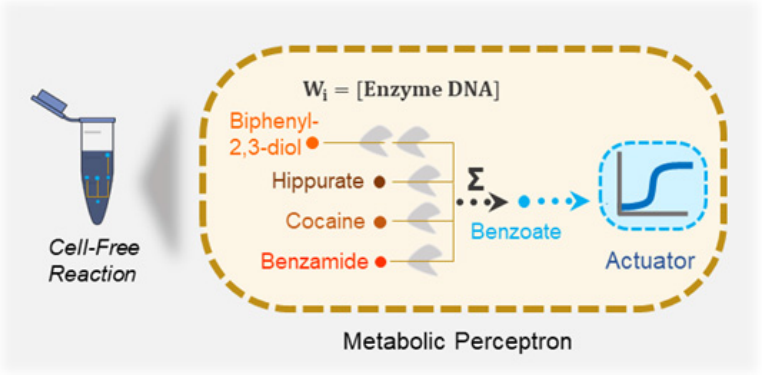


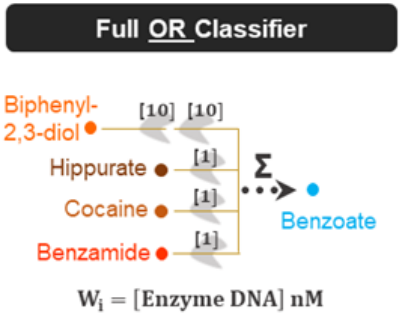


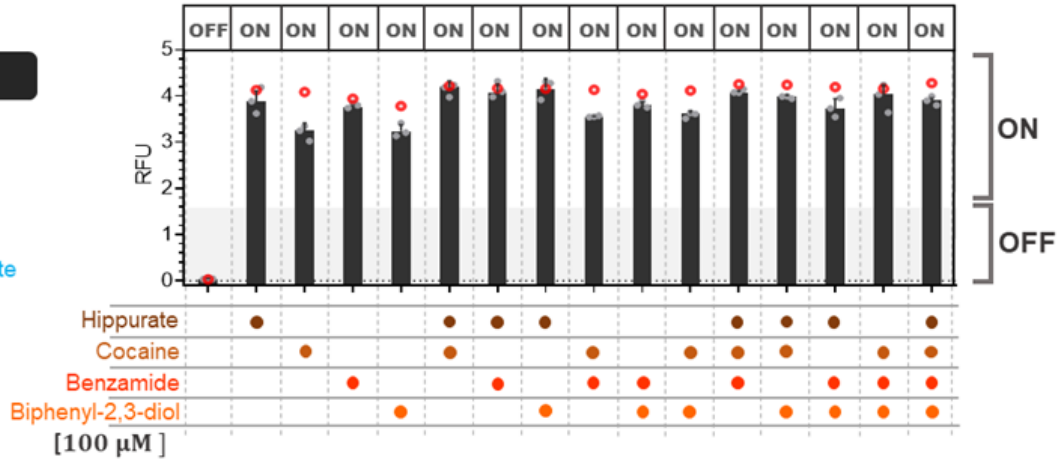
- Metabolic concentration weighted adders in Cell Free System

The Metabolic Perceptron: Classifier 1



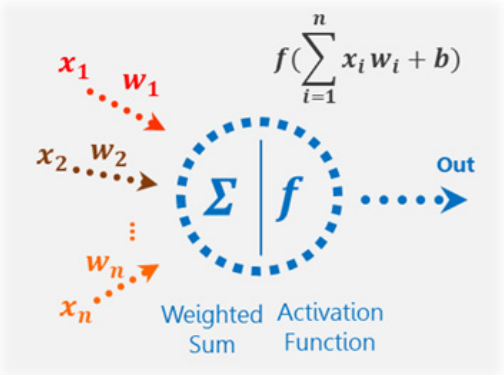


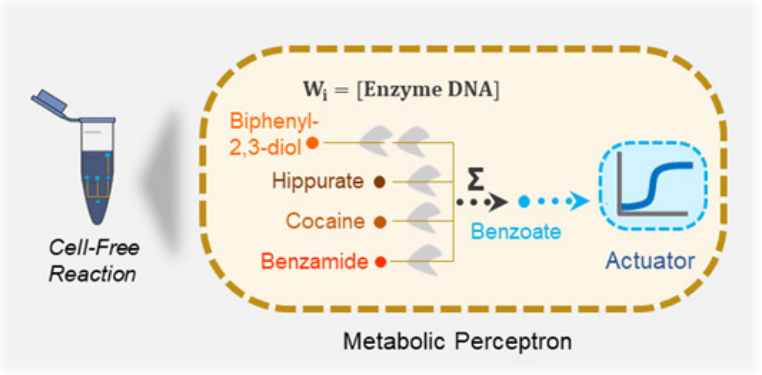


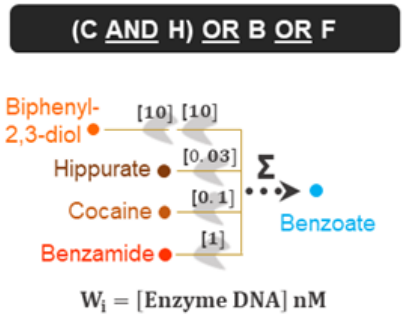


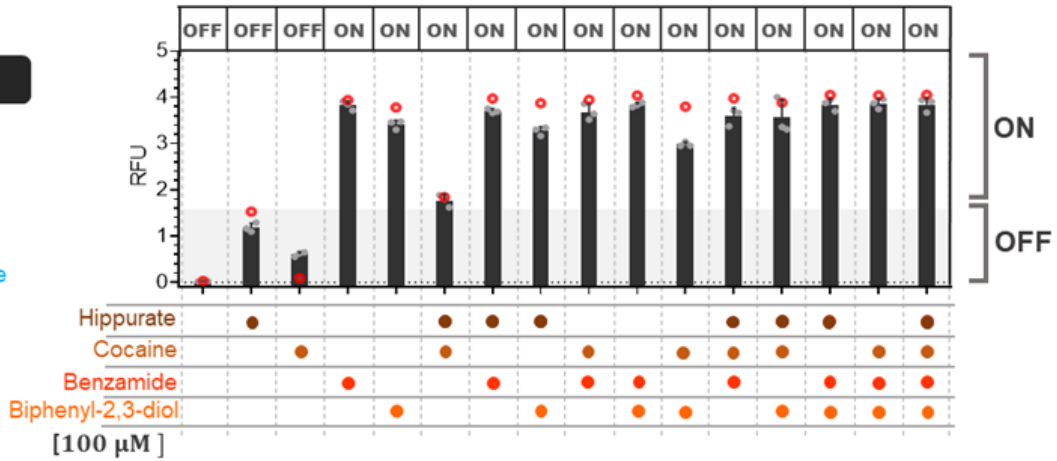
- Model based construction and validation of a binary classifiers
- The same metabolic circuit has different behaviors when used with different weights

The Metabolic Perceptron: Classifier 2









- Model based construction and validation of a binary classifiers
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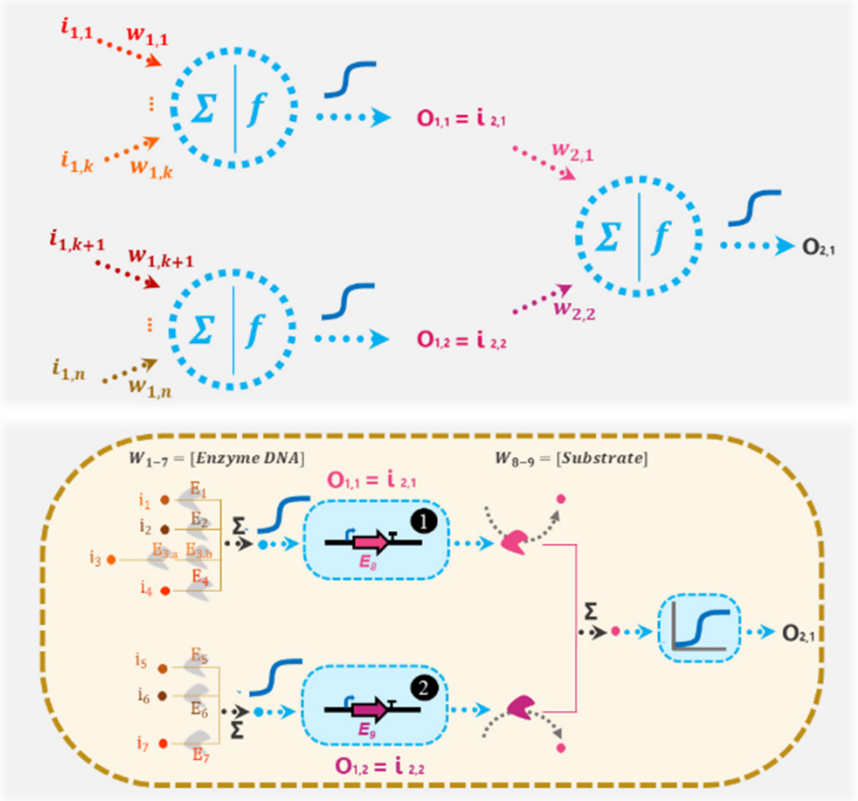
Future Perspectives

Metabolites

Nucleic acids (DNA, RNA)

Proteins

Multiple classes of input molecules



- By combining different types of inputs, diagnostic approaches can be dramatically improved
- Multi-layer metabolic perceptrons can classify complex patterns of metabolite concentrations in analytical samples

Acknowledgments

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Thank You

Questions Welcome