# Concentration-Response Evaluation of ToxCast Compounds for Multivariate **Activity Patterns of Neural Network Function**

### Marissa B. Kosnik<sup>1</sup>\*, Jenna D. Strickland<sup>2†</sup>, Skylar W. Marvel<sup>1</sup>, Dylan J. Wallis<sup>1</sup>, Kathleen Wallace<sup>3</sup>, Ann M. Richard<sup>4</sup>, David M. Reif<sup>1</sup>, and Timothy J. Shafer<sup>3</sup>

<sup>1</sup>Department of Biological Sciences, North Carolina State University, Raleigh, NC, USA, <sup>2</sup>Axion Biosystems, Atlanta, GA, USA, <sup>3</sup>Integrated Systems Toxicology Division, NHEERL, U.S. Environmental Protection Agency, Research Triangle Park, NC, USA, <sup>4</sup>National Toxicology, U.S. Environmental Protection Agency, Research Triangle Park, NC, USA

\*Current affiliation: Science for Life Laboratory, Department of Environmental Science and Analytical Chemistry, Stockholm University, Stockholm, Sweden <sup>†</sup>Current affiliation: Department of Pharmacology and Toxicology, Michigan State University, E. Lansing, MI, USA

#### Summary

Microelectrode arrays (MEAs) have been used to assess neuroactivity of ToxCast compounds. •Screened 384 compounds in concentration response across 43 network activity parameters using MEAs.

•Identified 15 parameters crucial in characterizing neuroactivity of 237 compounds.

•For known neurotoxic compounds, these chemical-parameter potencies were more sensitive than for most ToxCast assays.

#### **MEA** parameters distinguish three clusters of compounds with distinct bioactivity patterns

Results



•Identified three clusters of chemical-parameter activity with varied bioactivity patterns and chemical structural features.

## Introduction

•ToxCast evaluates activity of chemicals using high-throughput screening (HTS).<sup>1</sup>

- -Over 1,000 assays.
- -Cannot assess breadth of neurotoxicity targets.
- •Microelectrode Arrays (MEAs) can record activity in plated neural networks.
- •Previous analysis: 1056 ToxCast chemicals





each

for

**Figure 4.** Bioactivity patterns of three MEA clusters determined through k-means clustering of compound-parameter potencies. Darker colors = more potent.

#### MEA clusters of compounds are enriched for different chemical structural features



**Figure 2.** Methods to characterize active compound-parameter associations (heatmap). Darker colors = more potent.

## Results

For known neuroactive compounds, MEA parameter potencies are more sensitive than ToxCast assays for most compounds



**Figure 5.** Chemical features (identified as chemotypes<sup>5</sup>) enriched within each cluster using hypergeometric test. Inset images depict example structures within respective chemotype.

## Conclusions

•We developed a robust assessment for neuroactivity across 15 network parameters (Figure 2). •For known neuroactive compounds, MEA parameters were more sensitive overall than other ToxCast assays (Figure 3).

•MEA chemical-parameter potencies can be used to group compounds based on bioactivity



(Figure 4).

activity groups were consistent with the underlying structure of the compounds •Biological (Figure 5).

•Multivariate MEA activity patterns can efficiently screen for diverse chemical neuroactivities. •MEA activity patterns may have predictive value related to chemical structural features.



This work was supported by EPA CRADA 644-11, National Institutes of Health [ES025128, ES030007] and the US Environmental Protection Agency [STAR R835802] This poster does not reflect EPA policy.

1. Dix, D.J. et al. (2007) The toxcast program for prioritizing toxicity testing of environmental chemicals. Toxicol. Sci.,

2. Strickland, J.D. et al. (2018) Screening the ToxCast phase II libraries for alterations in network function using cortical neurons grown on multi-well microelectrode array (mwMEA) plates. Arch. Toxicol.

3. Filer, D.L. et al. (2017) Tcpl: The ToxCast pipeline for high-throughput screening data. Bioinformatics

4. Frank, E. et al. (2016) The WEKA Workbench. Online Appendix for "Data Mining: Practical Machine Learning Tools and Techniques" 5. Chemotyper application (https://chemotyper.org/), ToxPrint feature set (https://toxprint.org/)