# High-throughput In Vitro Assays at NCATS

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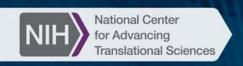




# Mission of National Center for Advancing Translational Sciences (NCATS)



To catalyze the generation of innovative methods and technologies that will enhance the development, testing and implementation of diagnostics and therapeutics across a wide range of human diseases and conditions.



# NIH Chemical Genomics Center (NCGC)

#### > Established in 2004

- •Part of NIH Roadmap Molecular Libraries Initiative
- •National Center for Advancing Translational Sciences (NCATS, established in Dec, 2011)
- •>100 staff: Biologists, Chemists, Informatics and Engineers

#### ➤ Mission and Robotic HTS facility

- •High throughput screening (HTS) to identify lead compounds for therapeutic development and to profile compound libraries including environmental chemicals for their biological and pathophysiological effects
- •New technologies/paradigms for assay development, screening, informatics, chemistry
- •Advanced screening robots (capacity: > 0.5 million samples/day) and Compound libraries (high quality with diverse structures)

#### **≻**Collaborations

•>200 investigators worldwide

(75% NIH extramural, 10% NIH intramural, 15% Foundations/Research Consortia/Pharma/Biotech)







# The Tox21 Community

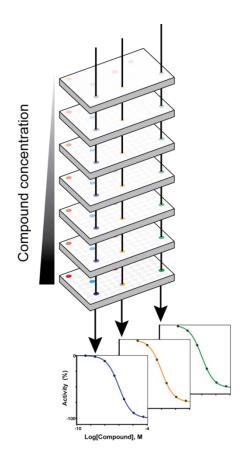
#### **Goals:**

- Identify mechanisms of compound action
- Prioritize chemicals for further in-depth toxicological evaluation
- Develop predictive models for biological response in humans

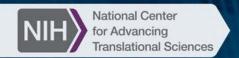




## Quantitative High-Throughput Screening (qHTS)



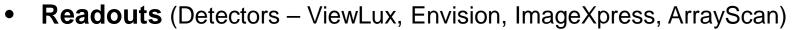
- Conventional screening done at one concentration
  - Not appropriate for toxicity testing "dose makes the poison"
- qHTS tests compounds assayed at multiple concentrations
  - For Tox21, 15 concentrations over 4 logs (high:~ 100 uM)
- Miniaturized assay volumes 2-8 uL in 1536-well plate
- Informatics pipeline for data processing, curve fitting & classification, extraction of SAR
- Generates toxicological actives rather than statistical "hits"
  - Dramatically increases reliability
  - Dramatically reduces false positives and false negatives



### Assay Selection and Design - Formats Utilized in HTS

#### Assays selection based on

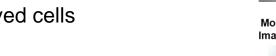
- Biological and toxicological relevance
- Adaptable to miniaturization and automated screening (a 384 or 1536 well plate format)



Fluorescence, luminescence, absorbance, no radioactivity

#### Cell types

- Mammalian cells
  - Primary cells
  - Embryonic stem cells and IPS derived cells
  - Established cell lines
  - Engineered cells
    - transiently/stably transfected
    - retroviral infected
- Chicken cells
- Bacterial cells and insect cells





#### **EnVision Multilabel Reader**



- Absorbance
- FluorescenceF.P.
- Luminescence
- TR-FRET
- AlphaScreen
- Top/Bottom reading



- Absorbance
- Fluorescence
- F.P.
- Luminescence
- TR-FRET
- Top reading

Molecular Devices ImageXpress Micro



- ·HCS
- Bottom reading
- Slow in speed (20 min - 1 hr/plate)



# Tox21 Phase I: Assays and Screens

#### Phenotypic readouts

Cytotoxicity assays

Cell viability assay (measures ATP)

Apoptosis assays

Caspase assays (measure activity of Caspase 3/7, 8, 9)

Membrane integrity assay

LDH and protease release

Mitochondrial Toxicity assay

Mitochondrial membrane potential

Gene tox assay

Differential cytotoxicity Differential cytotoxicity (DNA damage repair gene deficient lines, DT40 and mouse cell lines) ATAD5 (ELG1) Micronucleus assay

Phosphlipodosis assay

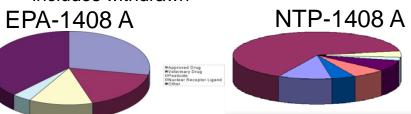
Genetic variation: 87 HapMap lines

- Phase I compound collection: 5632 chemicals
  - NTP-1408 A
  - EPA-1408 A
  - NCGC Pharmaceutical Collection (NPC-2816) Drugs approved in US, EU, Canada, Japan, includes withdrawn

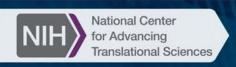
Industrial

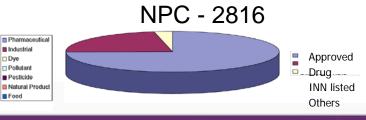
■ Pesticide

□ Dye □ Pollutant



- Pathway-specific toxicological mechanisms
  - Pathway assays (Reporters, e.g., luciferase, β-lactamase): Hypoxia, ER stress, NFkB, P53, ARE, HSE, CREB, AP-1, STAT, **NFAT**
- Target-specific toxicological mechanisms
  - Nuclear receptor assays: AR, AhR, ERα, FXR, GR, LXR, PPARδ, PPARγ, PXR, RXR, TRβ, VDR, RORα
  - hERG channel assay
  - Cytokine assays: IL-8, TNFα
  - Ca mobilization and influx assays





# Tox21 Phase II: qHTS Screening

#### Initial focus

- Nuclear receptor activation or inhibition (AR, AhR, ER, FXR, GR, LXR, PPAR, PXR, RXR, TR, VDR, ROR)
- Induction of stress response pathways (e.g., DNA damage, heat shock, hypoxia, inflammation, oxidative)
- Online validation
  - LOPAC + 88 Tox21 compounds
  - Screening 3 times
  - Assay reproducibility and general statistics
- Online screening
  - Three sets of 10k compound collection and each compound in different location of the plate
  - 15 concentrations for each compound, 459 plates per screen
- Compound stability test
  - Chemical QC



# Tox21 Phase II - Tox21 Compounds

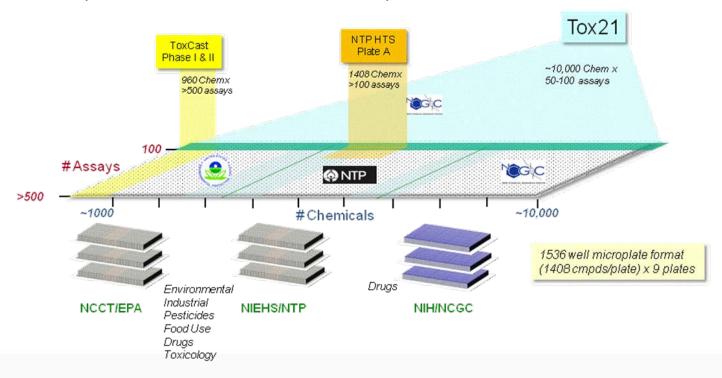
~10,000 compounds in total

Industrial chemicals, sunscreen additives, flame retardants, pesticide additives and their metabolites, plasticizers, solvents, food additives, natural product components, drinking water disinfection byproducts, preservatives, therapeutic agents, synthesis byproducts

88 duplicate compounds in each plate

Three sets of this compound collection

All the compounds in different location of the plate





# Tox21 Robot System





#### ViewLux Multilabel Reader



- Absorbance
- Fluorescence
- F.P.
- Luminescence
- · TR-FRET
- Top reading

#### EnVision Multilabel Reader



- Absorbance Fluorescence
- F.P. Luminescence
- · TR-FRET
- AlphaScreen
- Top/Bottom reading

#### **BioRAPTR FRD Workstation**



- Transfer size: 0.2 10 ul 0.5 ml dead volume
- · 4 reagents

#### Multidrop Combi



- Transfer size: 2 10 ι 10 ml dead volume
  - 1 reagent

#### Pintool Station

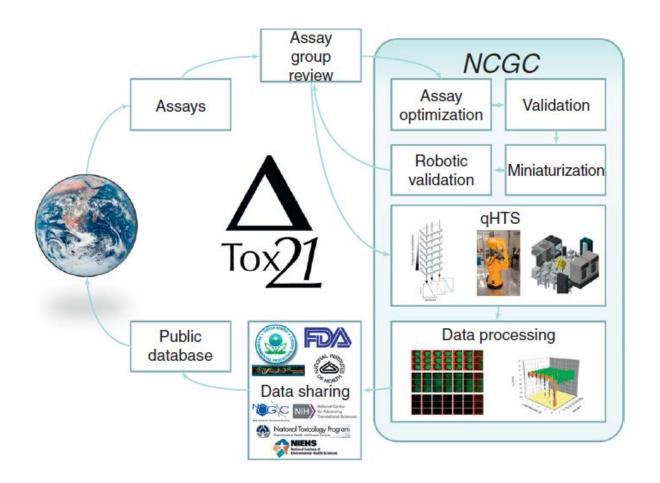


- Transfer size: 20 nl
- Pins washed in 3 solvents

- Four components
- (1) Cell incubators & compound storage
- (2) Liquid handling: Pintool station and acoustic dispenser for nanoliter compound transfer, and reagent dispensers (BioRPTR, Multidrop)
- (3) Plate detection: ViewLux and EnVision plate readers
- (4) Robot arms & software controlling system



# **Tox21 Screening Process**



#### Validation

- Positive controls
- Time course
- Signal to background

#### Miniaturization

- Cell density per well
- Positive controls
- Signal to background ≥ 3
- CV <10%
- Z factor > 0.5

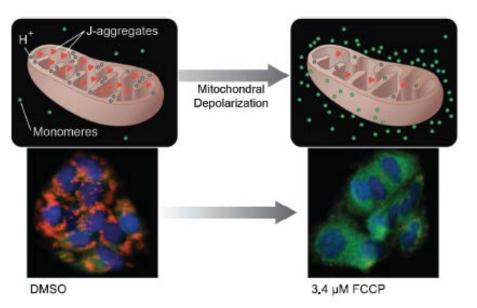
- CV (coefficient of variation) = standard deviation (SD) of compound area/median of compound area
- Z factor = 1-[3\*(SD of compound area + SD of basal)/(median of compound area median of basal)]

Attene-Ramos et al., 2013, Drug Discovery Today 18:716-723



# Case Study: Screening for Environmental Chemicals that Decrease MMP using qHTS

- To screen and identify chemical compounds that decrease mitochondrial membrane potential (MMP)
- Prioritization of actives for further in-depth evaluation in animal models
- Development of models to predict mitochondrial toxicity potential of untested chemicals



MMP – one of the most widely assessed parameters for mitochondrial toxicity

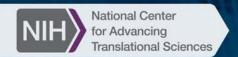
Mito-MPS (JC-10, m-MPI, modified JC-1) – a lipophilic, cationic dye accumulating into Mitochondrial membrane matrix space in inverse proportion to MMP

Healthy cells – Mito-MPS accumulates in the mitochondria as aggregates with red fluorescence

FCCP treated cells – Mito-MPS remains in cytoplasm as monomeric form showing green fluorescence

Sakamuru et al., 2012, Physiological Genomics 44:495-503

FCCP, mesoxalonitrile 4-trifluoromethoxyphenylhydrazone



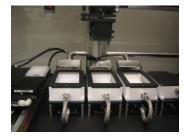
# **MMP Assay Protocol**

Add 2000 HepG2 Cells/well into 1536-well plate, 5 µl total

#### **Multidrop Combi**







Incubate assay plates overnight at 37°C, 5% CO2 incubator



Add 23 nl compounds (2.9 nM to 46 µM titration series) or positive controls (17.5 nM to 11.5 μM titrations, FCCP)



Incubate assay plates at 37°C, 5% CO2 incubator for 1 or 5 h



**BioRAPTR FRD** 



Add 5  $\mu l$  of Mito-MPS dye (Incubate 30 min at 37°C, 5% CO2 incubator)



Read fluorescence signal (Ex/Em=485/535 nm; Ex/Em=540/590 nm) on Envision plate reader

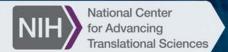




#### **EnVision Multilabel Reader**



- Absorbance
- Fluorescence
- F.P.
- Luminescence
- TR-FRET
- AlphaScreen
- Top/Bottom reading



### Online Validation - General Statistics and Reproducibility

1,368 compounds (LOPAC + 88 Tox21 compounds)

7 concentrations (3 nM to 46 uM), 3 times

Assay reproducibility and general statistics

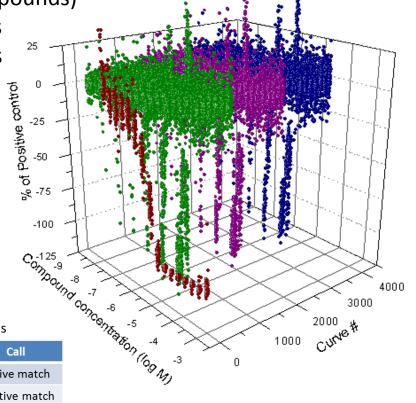
ММР	Mean ± SD		
CV (%)	7.925 ± 0.373		
Z factor	0.774 ± 0.008		
S/B	9.405 ± 0.161		

- CV (coefficient of variation) = standard deviation (SD) of compound area/median of compound area
- Z factor = 1-[3\*(SD of compound area + SD of basal)/(median of compound area median of basal)]

Reproducibility			
Active match	9.84%		
Inactive match	69%		
Mismatch	0.34%		
Inconclusive	20.81%		
AC50 fold change	1.19		

Reproducibility Calls

Run #1	Run #2	Call		
Active	Active	Active match		
Inactive	Inactive	Inactive match		
Active	Inactive	Mismatch		
Inactive	Active	Mismatch		
Activation	Inhibition	Mismatch Mismatch		
Inhibition	Activation			
Other	Other	Inconclusive		



## **Tyrphostin Compounds**

- 20 tyrphostin analogs were identified
- Potency depends on # of hydroxyl groups and the tertiary butyl groups



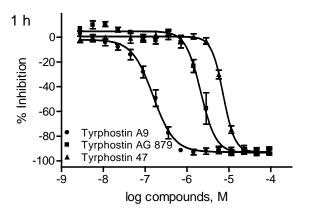
• Tyrphostin A9  $IC_{50} = 0.15 \mu M$ , 1h  $IC_{50} = 0.18 \mu M$ , 5h

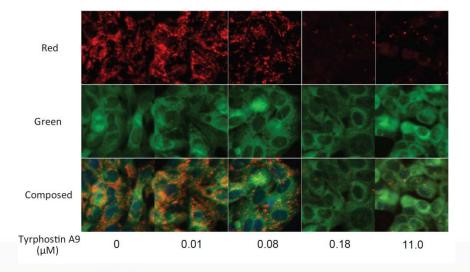


■ Tyrphostin AG 879  $IC_{50}$  = 2.13 µM, 1h  $IC_{50}$  = 3.71 µM, 5h



▲ Tyrphostin 47 IC<sub>50</sub> = 7.29 μM, 1h IC<sub>50</sub> = 20.2 μM, 5h





#### Molecular Devices ImageXpress Micro



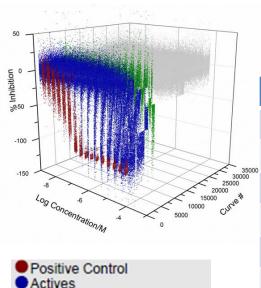
- · HCS
- · Bottom reading
- Slow in speed (20 min - 1 hr/plate)

Images acquired in ImageXpress Micro using a 20x objective. While red fluorescent aggregates are localized in the mitochondria, green fluorescent monomers are mainly in cytosol. The composed images were the merger of red and green fluorescence.

Sakamuru et al., 2012, Physiological Genomics 44:495-503



# Reproducibility of Tox21 10K Compound Screen



Weak actives; Inconclusive

Negatives

#### **Reproducibility Calls**

Run #1	Run #2	Call	
Active	Active	Active match	
Inactive	Inactive	Inactive match	
Active	Inactive Mismatch		
Inactive	Active	Mismatch	
Activation	Inhibition	Mismatch	
Inhibition	Activation	Mismatch	
Other	Other	Inconclusive	

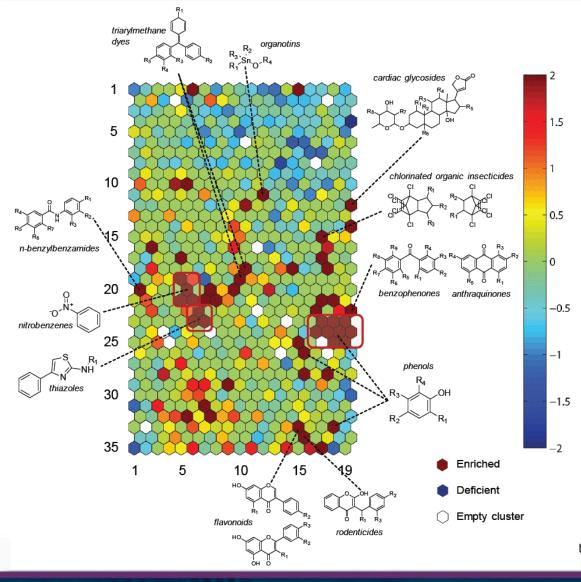
#### **Activity Definitions**

- Active
  - Class 1.1, 1.2, 2.1
  - Class 2.2 (efficacy>50%)
- Inactive
  - Class 4
- Inconclusive
  - All other cases
- Triplicate run outcome
  - Active
    - Active in ≥2 runs
    - 3<sup>rd</sup> run Curve class
      - Non-class 4
      - Agonist mode: >0
      - Antagonist mode: <0</li>
  - Inactive
    - Inactive in ≥2 runs
    - 3<sup>rd</sup> run not active
  - Inconclusive
    - All other cases

Assay Reproducibility	Active Match	Inactive Match	Inconclusive	Mismatch	IC50 fold change
MMP	17.57%	67.52%	14.33%	0.55%	1.53

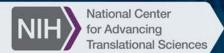


### Heatmap of Structure Clusters

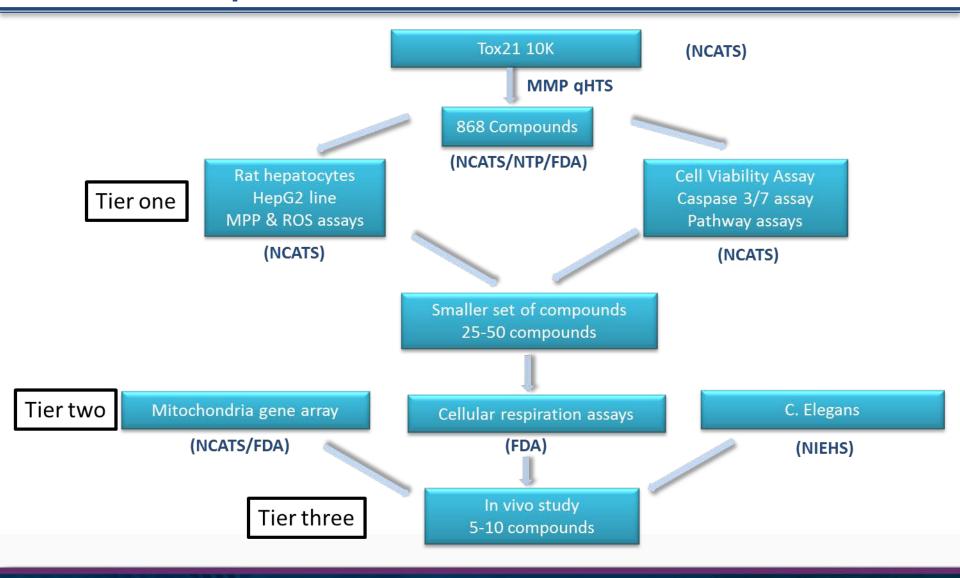


- ~ 650 clusters from Tox21 10k library using SOM (self-organizing map algorithm)
- 76 clusters (~11%) decreased MMP (p<0.05)</li>

ttene-Ramos et al., 2015, Environ Health Perspect 123:49-56



## **Compound Prioritization Workflow**





# Challenges from Tox21 qHTS

- Lack of xenobiotic metabolic capability
- Limited pathway coverage
- Reliance on engineered transformed and immortal cell lines
- > Focus on single compounds
- > Limited to acute exposure scenarios
- Limited availability of "BIG" data analysis tools



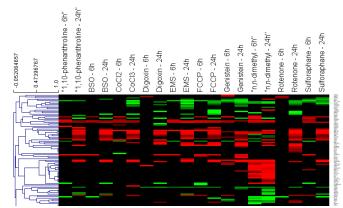


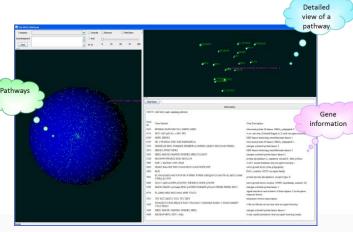
### Tox21 Phase III Focus

Incorporate xenobiotic metabolic capability into the cell systems

 Use more physiologically relevant cells (e.g. differentiated cells, primary cells and stem/IPS-derived cells)

- Increase pathway coverage
  - Gene expression platform (>1000 genes)
     RASL-seq technology
  - Identify key pathway perturbations
     BioPlanet web tool
- Explore compound mixtures and fruit/ vegetable extracts (NIEHS and EPA nominated)
- Build predictive models using Tox21 datasets
  - Tox21 Challenge crowdsourcing program







# Acknowledgement

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