

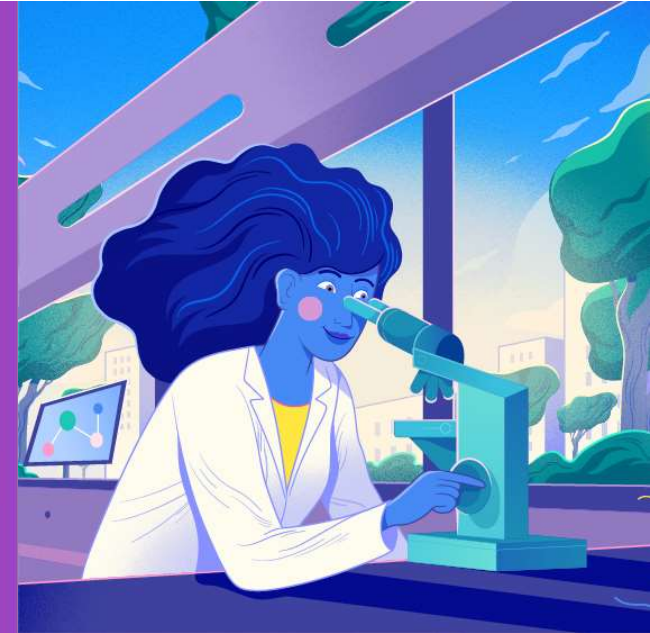
# Beyond AOPs: A Mechanistic Evaluation of NAMs in DART Testing

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Unilever Safety and Environmental Assurance Centre (SEAC)

ESTIV, 22/11/2022



Unilever

## Outline

- **Unilever's approach: science-based safety**
- **Overview of Unilever's NGRA Framework for DART**
- **Biological coverage of the NGRA Framework for DART**
- **Next steps, case studies / fit for purpose validation**

**We say use science.  
Not animals.**



# Unilever Policy & Approach

## Safe & Sustainable Products without Animal Testing

### What we believe

- **Every Unilever product must be safe for people and our environment**
- **Non-animal testing to assess ingredient & product safety** – there are a wide range of non-animal alternatives grounded in modern science and new technology

### How we do it



40+ years of developing non-animal safety science

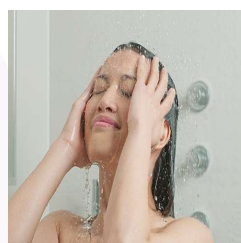


70+ collaborations



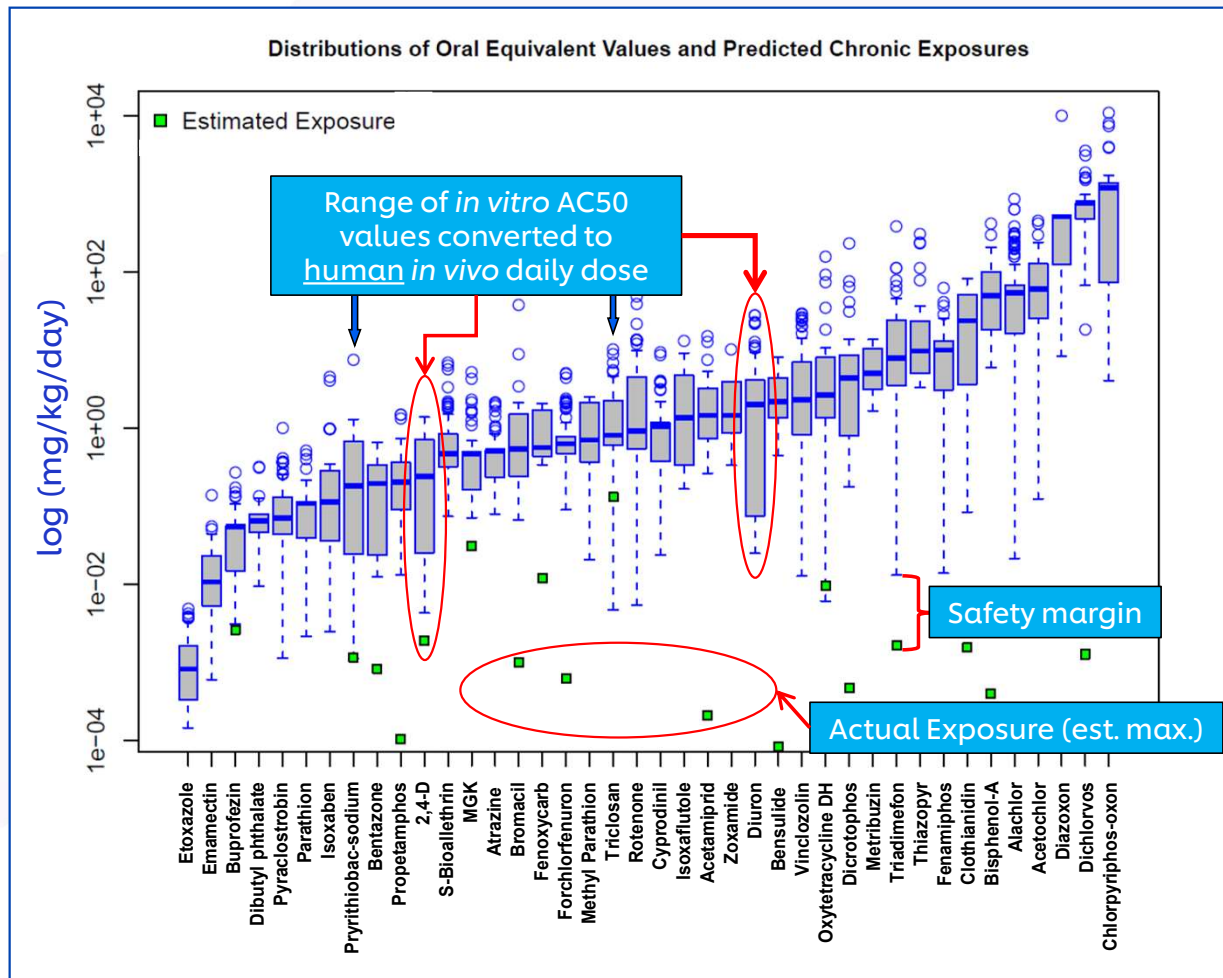
600+ publications

<https://tt21c.org>



Unilever

# Using 21<sup>st</sup> century science to assure safety – NGRA



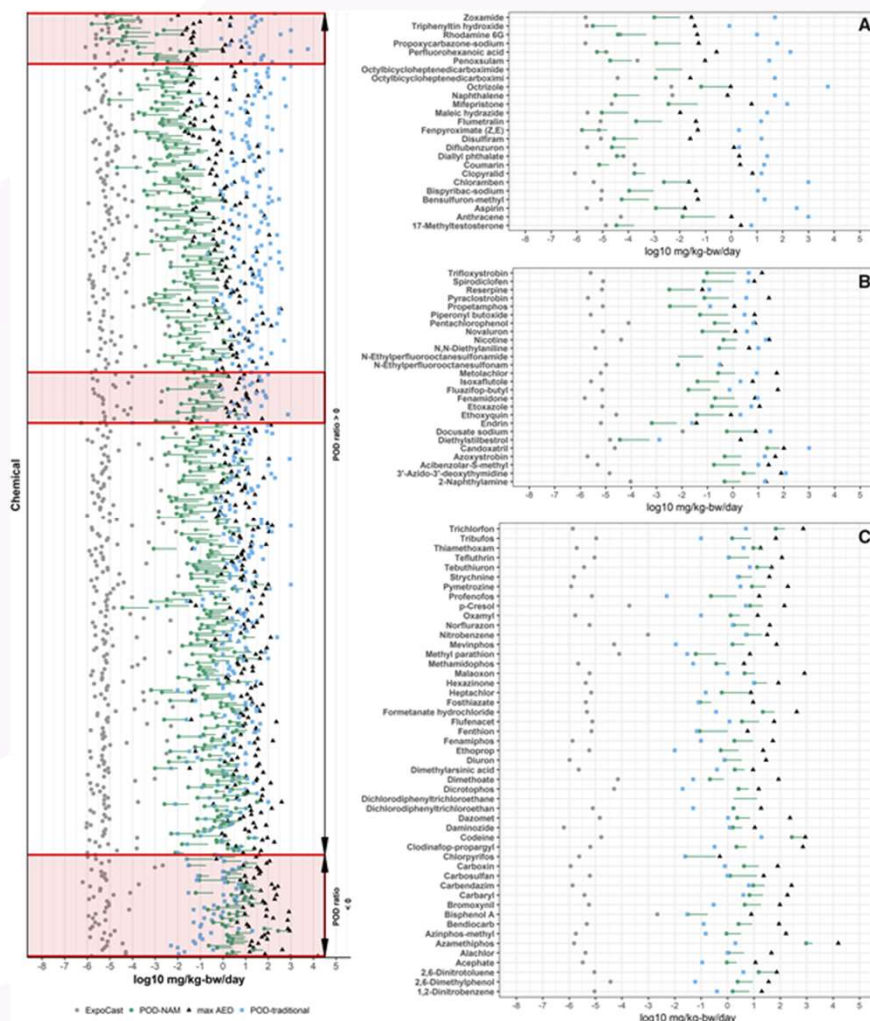
The hypothesis underpinning NGRA is that **if no bioactivity is observed at consumer-relevant concentrations, there can be no adverse health effects.**

At no point does NGRA attempt to predict the results of high dose toxicology studies in animals.

NGRA uses **new exposure science and understanding of human biology.**



# How PODs from NAMs compare to PODs coming from animal studies -including chronic, developmental/reproductive studies



448 chemicals



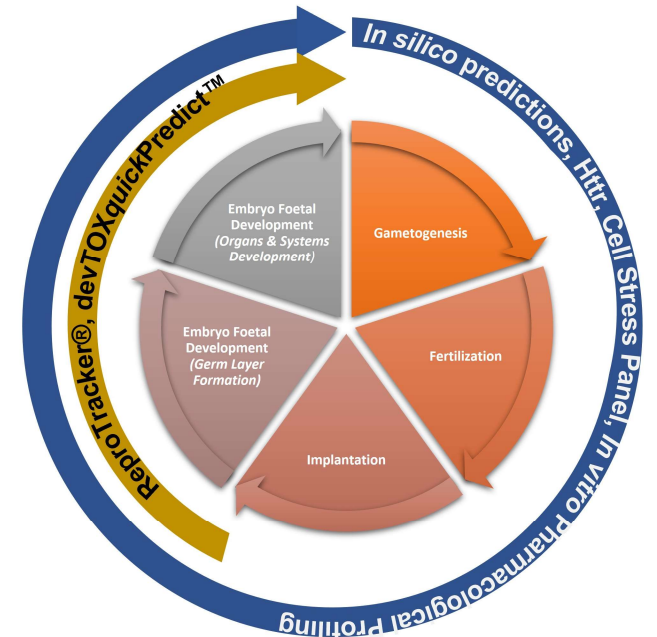
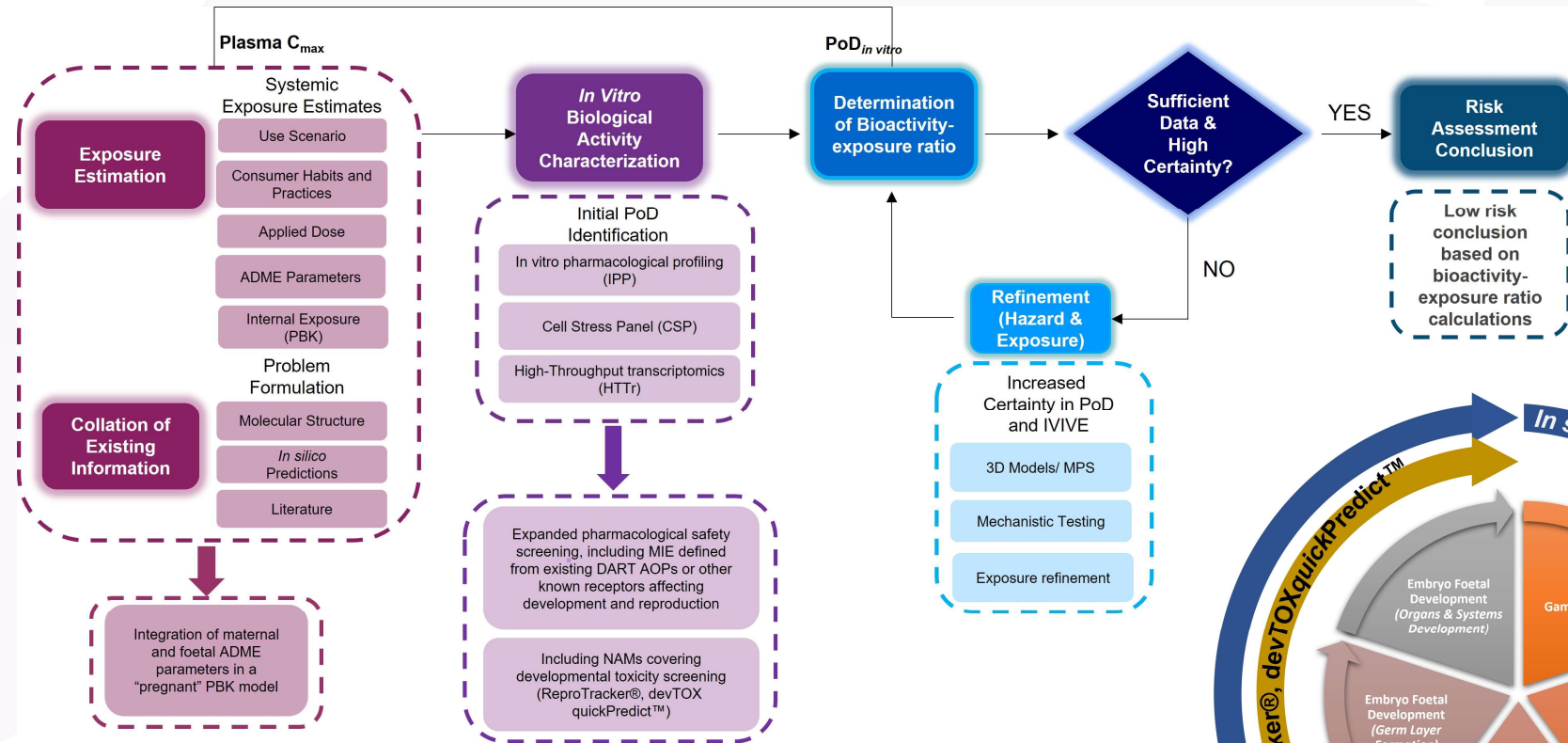
**APCRA**  
ACCELERATING THE PACE OF  
CHEMICAL RISK ASSESSMENT

**“The primary conclusion of our work is that for 89% of the chemicals in this case study, the HTS approach to derivation of a  $POD_{NAM, 95}$  for screening and prioritization purposes produced a value less than or equal to the  $POD_{traditional}$  from *in vivo* toxicology studies.”**

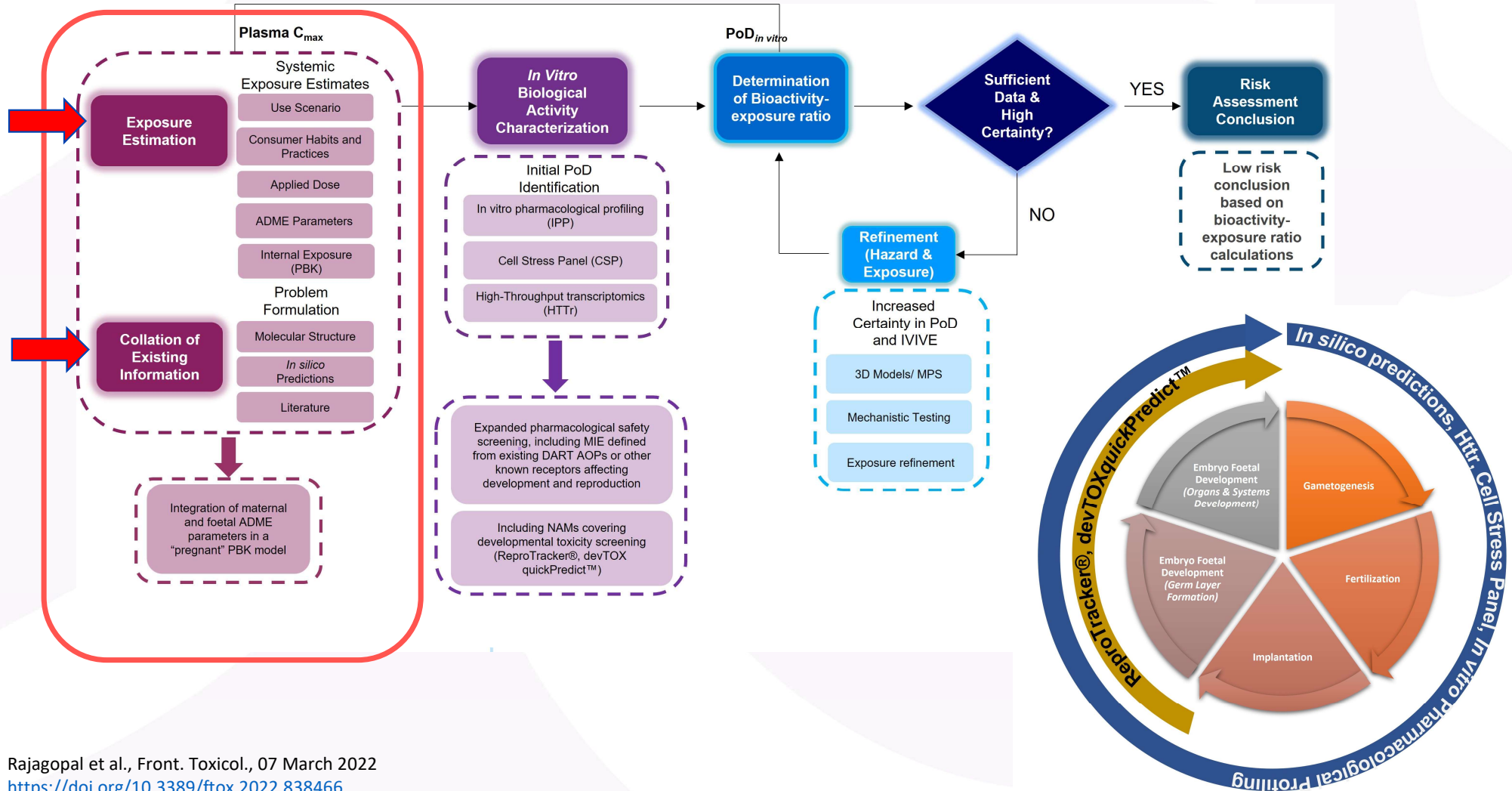
*Toxicol Sci*, Volume 173, Issue 1, January 2020, Pages 202–225,  
<https://doi.org/10.1093/toxsci/kfz201>

# Unilever's Framework for NGRA DART

# Unilever's NGRA Framework for DART – tiered approach

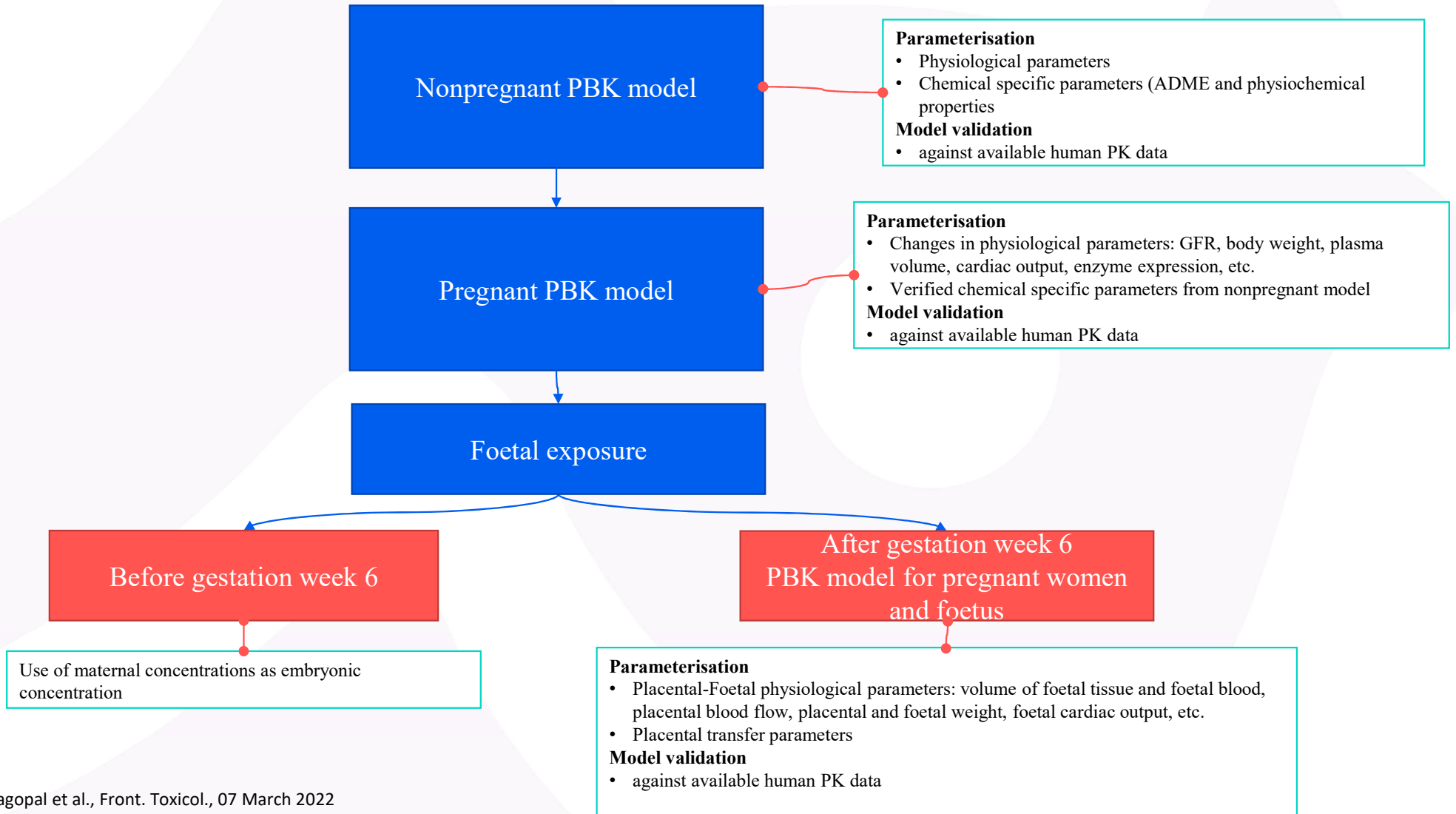


# Unilever's NGRA Framework for DART – exposure

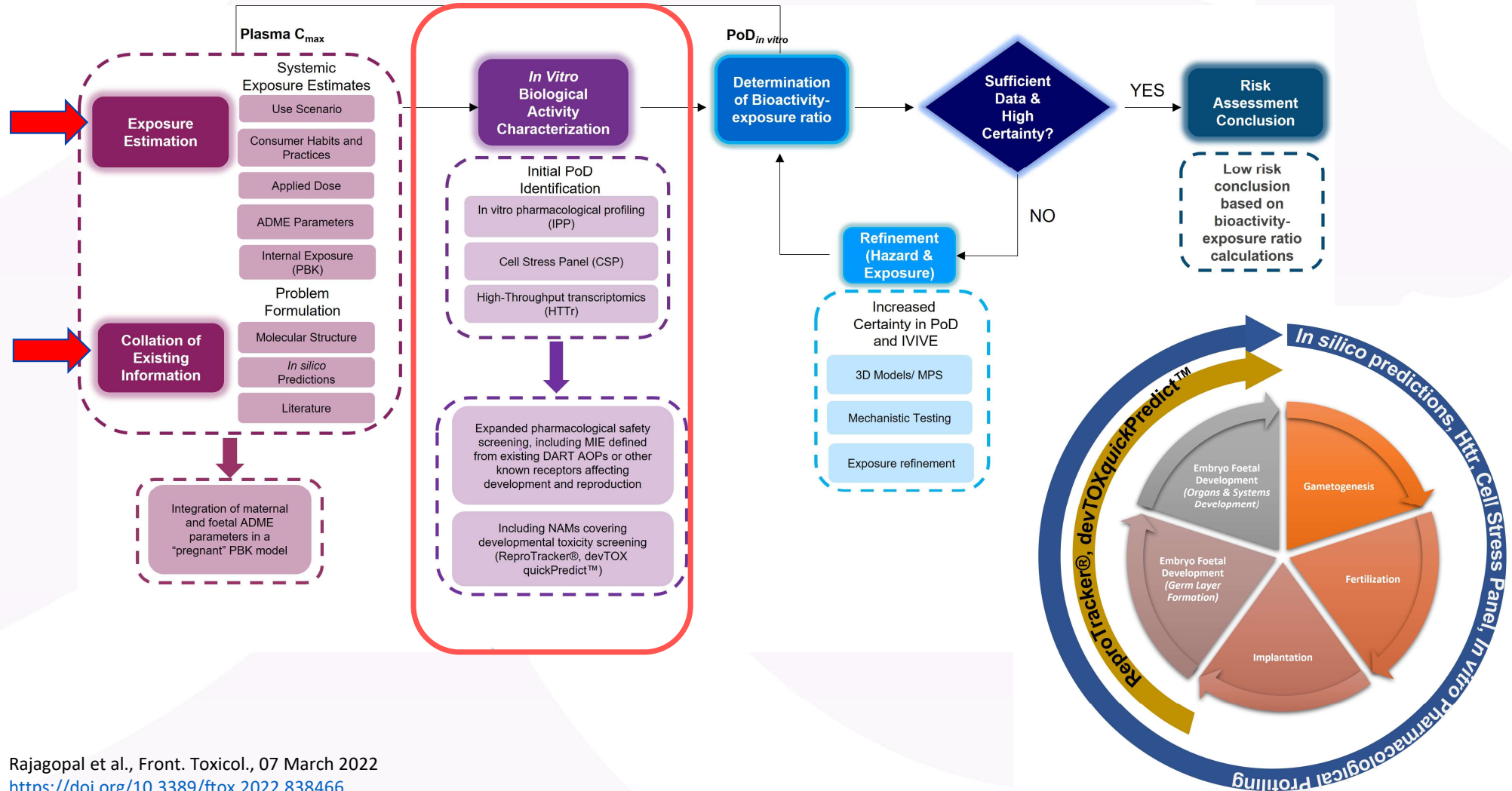




# Systemic exposure estimates- pregnant PBK modelling

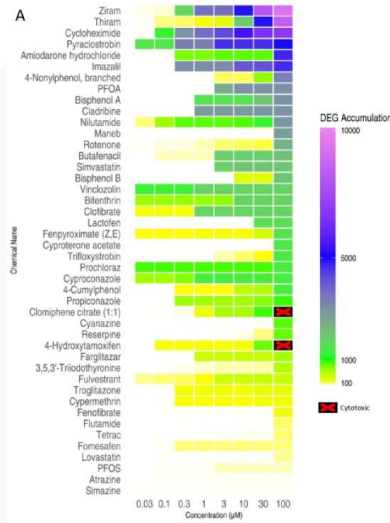


# Unilever's NGRA Framework for DART – exposure

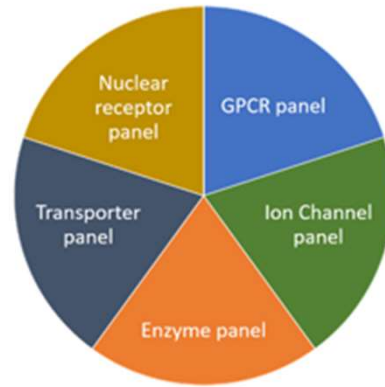


# Unilever's NGRA Framework for DART – biological activity

HTTr

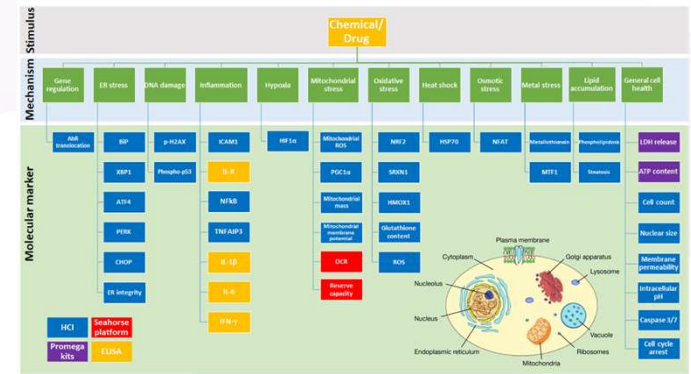


IPP+



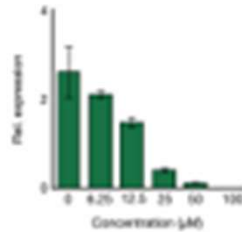
euofins | Cerep

CSP

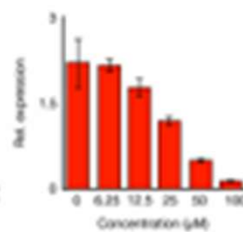


Repro Tracker

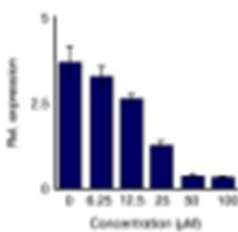
Hepatocytes (AFP)



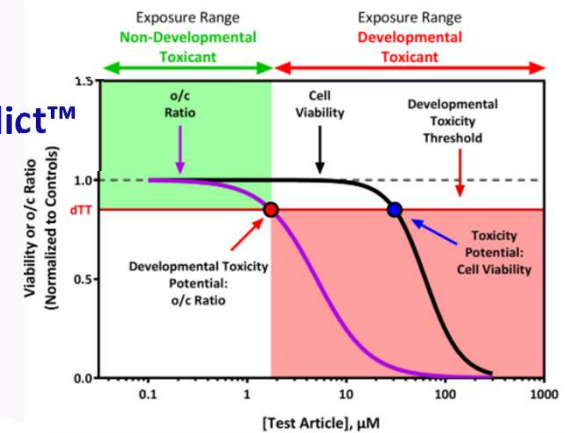
Cardiomyocytes (MYH6)



Neural rosettes (PAX6)



devTox quickPredict™

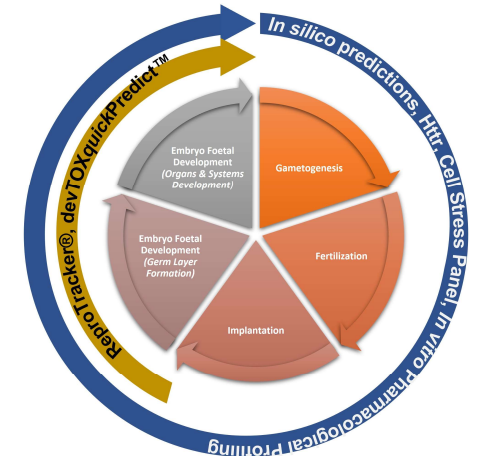
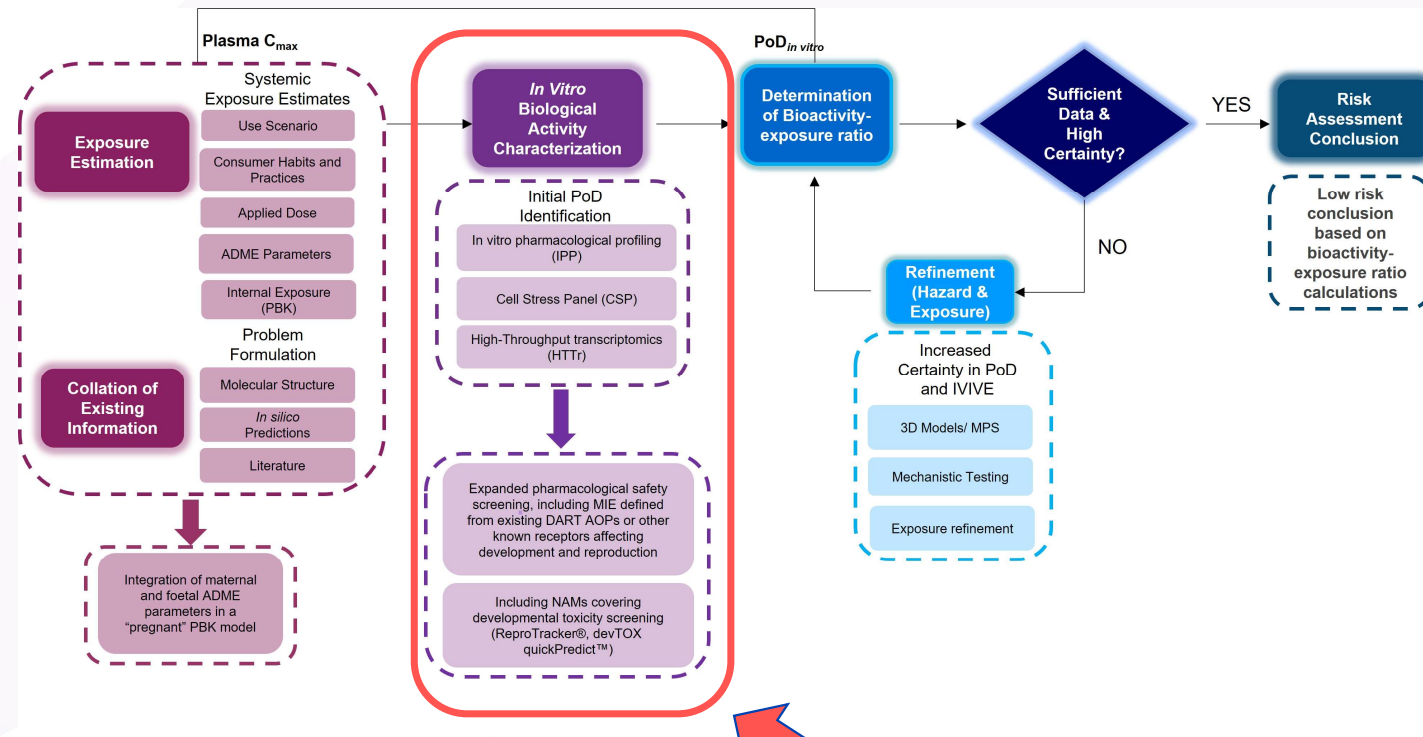


## Scientific and Technical Challenges associated with NGRA

- **Metabolic capacity of the framework (cell models, MPS, alginate technology, etc.)**
- **Short duration exposures and extrapolation to chronic effects**
- **Complex data interpretation and uncertainty analysis**
- **Spatio-temporal complexity of developmental and reproductive processes**
- **Coverage of important cellular and intercellular processes**
- **Chemical domain of applicability / case studies – need for a flexible and fit for purpose validation**

# Biological coverage of the NGRA Framework for DART

# What is the biological coverage of the NGRA DART Framework?

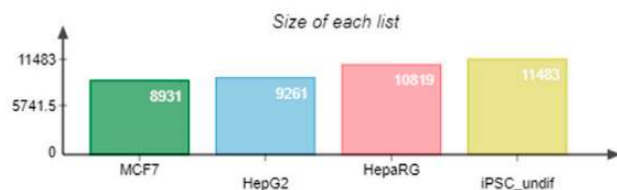
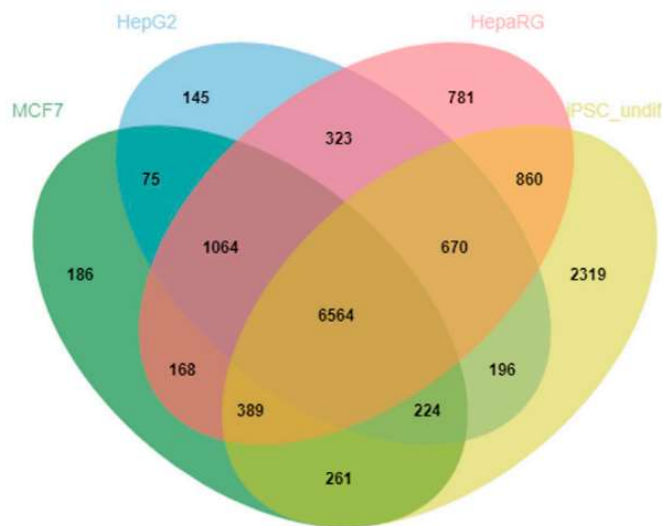


Does the **Bioactivity Characterisation** cover for important cellular and intercellular processes?



# Baseline expression of the cell lines within the NGRA DART

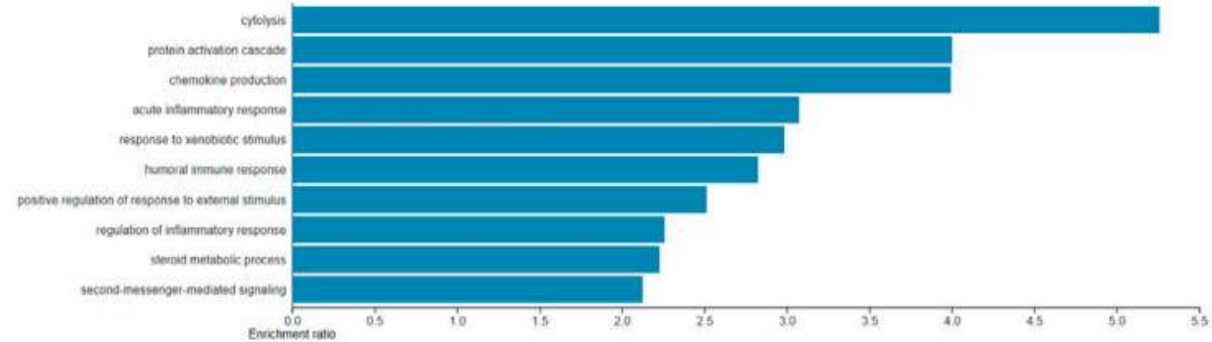
HepG2, MCF-7, HepaRG- Systemic Toolbox  
 hiPSCs- ReproTracker®, devTOXquickPredict™



**14,225 genes in total**

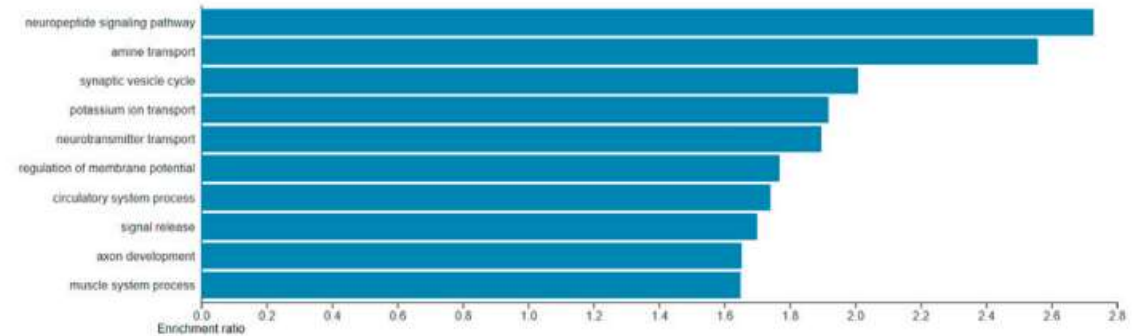
FDR ≤ 0.05 (dark blue)  
 FDR > 0.05 (light blue)

HepaRG GO Biological Processes (781 genes)



FDR ≤ 0.05 (dark blue)  
 FDR > 0.05 (light blue)

iPSC\_undif GO Biological Processes (2319 genes)



Differentiated hiPSCs not included in this study but in scope for future work



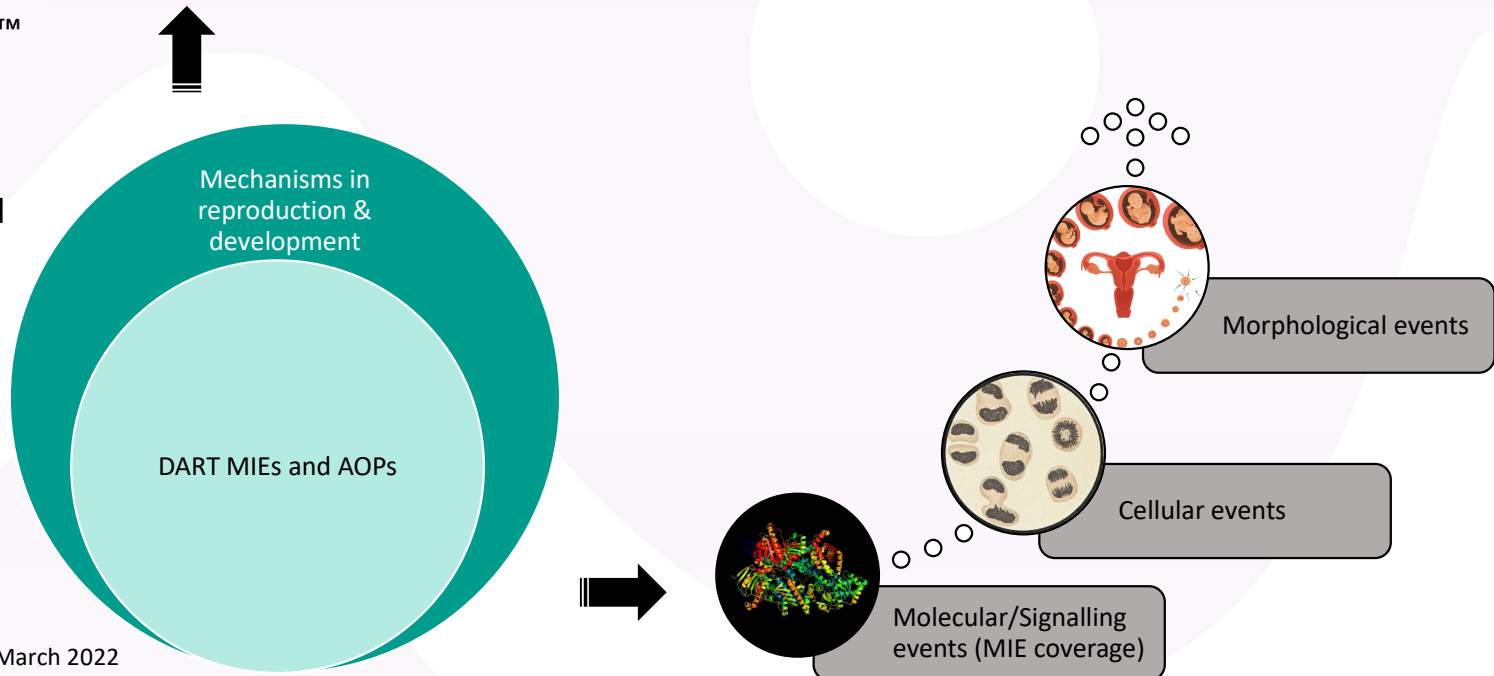
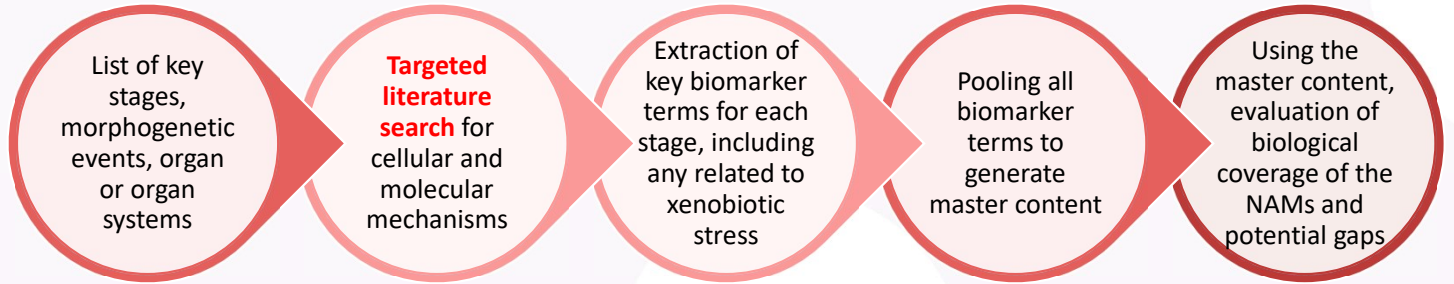
# Key Biomarkers for DART - Systematic literature search

## Chemicals & assays based approach

- ReproTect (10 chemicals, 14 assays)
- ChemScreen (12 chemicals, 31 assays)
- ReproTracker®
- devTOXquickPredict™
- ToxCast

## AOPs based approach

- Eleven DART-related Adverse Outcome Pathways (AOPs) published in 2015
- Over 90 AOPs in AOPWiki related to DART
- Network AOPs





# Key Stages, Morphogenetic Events and Derivatives Organs & Systems in Human Reproduction and Development

**Sex determination**

**Gametogenesis**

**Fertilization**

**Zygote formation**

**Implantation**

**Blastulation**

**Gastrulation**

**Placenta formation**

**Neurulation**

**Ectoderm formation and its derivatives**

- Central nervous system
- Peripheral nervous system
- Autonomous nervous system
- Integumentary system

**Mesoderm formation and its derivatives**

- Somitogenesis
- Hematopoiesis
- Heart and circulatory system
- Immune system
- Spleen
- Urinary system and urethra
- Reproductive system – testis
- Reproductive system – ovary
- Skeletal system
- Limbs

**Endoderm formation and its derivatives**

- Digestive system
- Respiratory system
- Thymus
- Parathyroid
- Thyroid

**Structures developing from mesenchyme or multiple germ layers**

- Adrenal glands
- Eyes
- Ears
- Face and neck

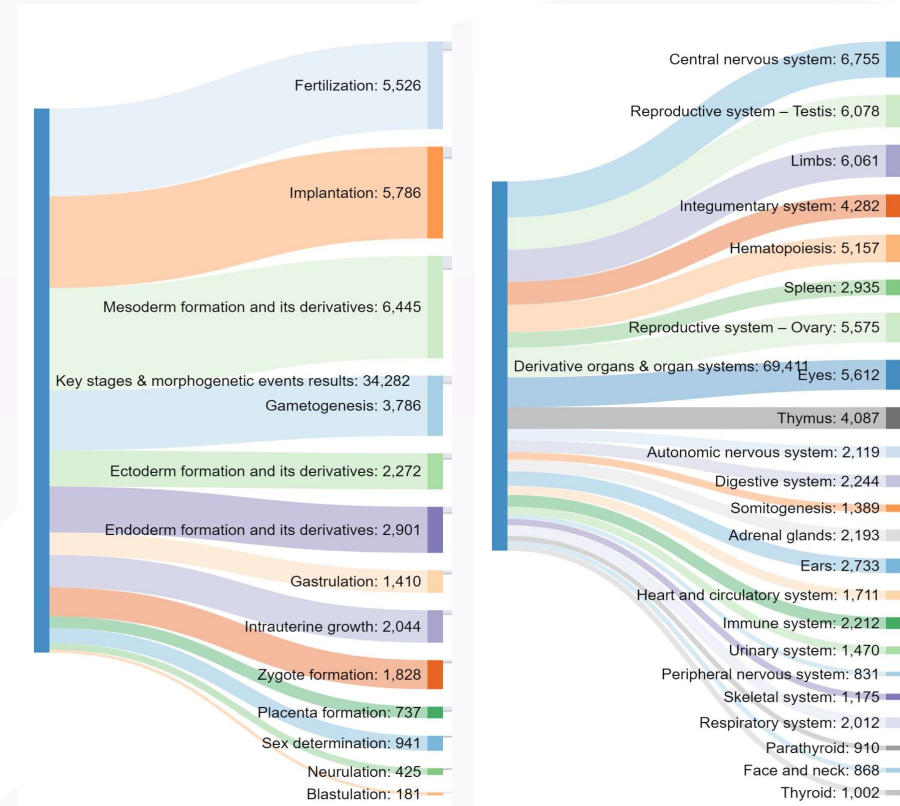
**Intrauterine growth**



# Overview of Literature Search and Extraction of Key Markers Information

Literature search  
MeSH Ontology  
37 million Articles

Validation and  
quality check of  
results; finalising  
the articles



34,308 articles on key stages and morphogenetic events

69,299 articles on organs and organ systems development

103,607 total articles

Query run: ("CNS") AND (embryonic development OR fetal development) AND (cell physiology OR nervous system physiology) OR (signalling OR pathway OR gene OR protein) AND (human OR mammalian) NOT (infections)

Pooling extractions,  
Thresholding of hit counts

Semantic enrichment  
using HGNC, miRNA and  
biological processes  
ontologies

Abstracts extracted and  
collated

## Summary

**PAXIP1** Potentiates the Combination of **WEE1** Inhibitor AZD1775 and Platinum Agents in **Lung Cancer**. The **DNA damage response** (DDR) involves a complex network of signaling events mediated by modular protein domains such as the **BRCA1** C-terminal (BRCT) domain. Thus, proteins that interact with BRCT domains and are a part of the DDR constitute potential targets for **sensitization** to DNA-damaging **chemotherapy** agents. We performed a pharmacologic screen to evaluate 17 **kinases** identified in a BRCT-mediated interaction network as targets to enhance **platinum-based chemotherapy** in **lung cancer**. Inhibition of mitotic **kinase WEE1** was found to have the most effective response in combination with **platinum compounds** in **lung cancer cell lines**. In the BRCT-mediated interaction network, **WEE1** was found in complex with **PAXIP1**, a protein containing six BRCT domains involved in **transcription** and in the cellular response to **DNA damage**. We show that **PAXIP1** BRCT domains regulate **WEE1**-mediated **phosphorylation of CDK1**. Furthermore, ectopic expression of **PAXIP1** promotes enhanced **caspase-3**-mediated **apoptosis** in cells treated with **WEE1** inhibitor AZD1775 (formerly, MK-1775) and cisplatin compared with cells treated with AZD1775 alone. **Cell lines** and patient-derived xenograft models expressing both **PAXIP1** and **WEE1** inhibited synergistic effects of AZD1775 and cisplatin. In summary, **PAXIP1** is involved in sensitizing **lung cancer** cells to the **WEE1** inhibitor AZD1775 in combination with platinum-based treatment. We propose that **WEE1** and **PAXIP1** levels may be used as mechanism-based **biomarkers** of response when **WEE1** inhibitor AZD1775 is combined with DNA-damaging agents.

# Overview of Literature Search and Extraction of Key Markers Information

PMID	Pub Yr	Title	Authors	Journal	Issue	Pages
34332650	2021	Brain organoid: a 3D technology for investigating cell...	Agboola OS, Hu X, Shan Z, Wu Y, Stem cell research & therapy			430
34325647	2021	Activation of microglial GILP-1b in the trigeminal nodding f...	Zou Q, Wang Y, Cai Z, Tan J, The Journal of headache and pain			86
34309883	2021	Exposure to cadmium induces neuroinflammation and h...	Yan Y, Guo Y, Li M, Guo L, Cao J, The Science of the total environ			149043
34235646	2021	Preclinical Evaluation of the Effects of Trasopiron (TA...	Whiting RL, Chopoo A, Luehr G, The Journal of pharmacology an			10.1111/j.1473-3113.2021.00811.x
34249938	2021	The Altered Anatomical Distribution of ACE2 in the Br...	Cui H, Su S, Cao Y, Ma C, Qiu W, Frontiers in cell and developme			10.3389/fcell.2021.684874
34162300	2021	Regenerative medicine for neurological diseases vi...	Burns TC, Guineo-Roldano A, BMJ (Clinical research ed)			10.1136/bmj.n1955
34130715	2021	Programmed suppression of oxidative phosphorylati...	Chang RC, Thomas KN, Mehta N, Epigenetics & chromatin			10.1186/s12929-021-00707-7
34071978	2021	Brain-Derived Neurotrophic Factor Signaling in the P...	Humakawa T, Otake H, International journal of molecu			10.3390/ijms12122727
34054129	2021	Biologic and morphologic variants in ROR1A1 are impl...	Dvorochak GC, Punetha J, JAMA Genetics in medicine: official jo			10.1093/gim/14136-021-0111-1
34040657	2021	Gene Environment Interactions in the Etiology of Neu...	Finnell RH, Cawfle CD, Kim SE, Li Frontiers in genetics			10.3389/fgene.2021.681218
34019717	2021	Neurotrophic factor levels in the serum and cerebrosp...	Wang S, Zou F, Wu S, Wu Y, Yue Y, Microbiology and immunology			10.1111/1348-0421.12918
33986667	2021	Therapeutic Effects of Hippocampal-Derived GDNF and Neuron...	Bukharov T, Chen J, International journal of molecu			10.3390/ijms12122727
33917816	2021	Potential Roles of the WNT Signaling Pathway in Amyl...	Jiang Y, Guan Y, Zhao Z, Meng F, Cells			10.3390/cells12122727
33804711	2021	Investigating Primary Cilia during Peripheral Nervous...	Vustrov J, Dumoulin A, Stoeckli E, International journal of molecu			10.3390/ijms12122727
33803024	2021	Microglia Development and Maturation and its Impac...	Wurm J, Kortmann H, Andresen, International journal of molecu			10.3390/ijms12122727
33801198	2021	Involvement of Bcl-2 in Neuronal Function and Devel...	Bass J, Nguyen T, Gillet G, International journal of molecu			10.3390/ijms12122727
33766226	2021	[Insulin-like growth factor 1 (IGF-1) promotes phago...	Zhai L, Chen X, Lu S, Yang D, Li WX, bao yu fen zi mian yi xue za zhi			37: 3: 199-204
33765252	2021	Neurospores: a potential in vitro model for the study...	de Silva Siqueira L, Majojo F, de A, Molecular biology reports			10.1007/s12276-021-00707-7
33744615	2021	Brain imaging features of children with moyamoya: a...	Chang MJ, Cao Y, Wu HY, Li H, Brain and behavior			10.1002/brb.1411
33727946	2021	The Neuroprotective Effect of Bv2 on Mar 25 in LPS-i...	Liu L, Zhang Y, Tang L, Zhong H, Evidence-based complementary			10.1155/2021/8879214
33727288	2021	Berberine-loaded M2 macrophage-derived exosomes: G...	Guo ZS, Zhang CJ, Xia N, Tian H, Acta biomaterialia			10.1016/j.actbio.2021.121223
33707794	2021	Adult astrocytes from reptiles are resistant to promp...	Ni N, Li H, Sun C, He B, Tang S, The Journal of biological chemis			10.1074/jbc.2021.240027
33679748	2020	Different Functions of Recombinantly Expressed Domi...	Blastic O, Abdal N, Paré M, J Biol Frontiers in immunology			10.3389/fimm.2020.564632
33677027	2021	Early life stress exposure worsens adult remote micro...	Catala C, Bischoia E, Carola V, Vi Brain, behavior, and immunity			10.1016/j.bbi.2021.08.003
33670841	2021	Linear Skin Defects with Multiple Congenital Anomal...	Indriani A, Franco B, Genes			10.3390/genes12122727

CNS - 6757 Abstracts

Extract Genes

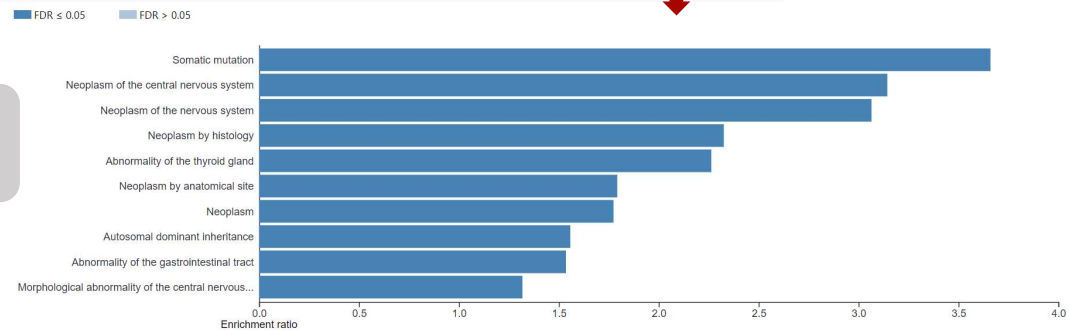
Vocabulary based on Hugo Gene Nomenclature Committee standard list of genes

Extract Cellular & Molecular Mechanisms

Extract miRNA

Gene symbol	Name	HitCount
GFAP	glial fibrillary acidic protein	554
SHH	sonic hedgehog	505
WNT1	Wnt family member 1	441
BDNF	brain derived neurotrophic factor	379
AQP1	aquaporin 1 (Colton blood group)	360
NES	nestin	346
FGF2	fibroblast growth factor 2	345
IGF1	insulin like growth factor 1	341
GNRH1	gonadotropin releasing hormone 1	334
TH	tyrosine hydroxylase	329
NGF	nerve growth factor	327
CSPG4	chondroitin sulfate proteoglycan 4	295
MBP	myelin basic protein	294
PAX6	paired box 6	288
TGFB1	transforming growth factor beta 1	267
EGF	epidermal growth factor	232
TP53	tumor protein p53	193
INS	insulin	189
INSR	insulin receptor	186
NCAM1	neural cell adhesion molecule 1	182
TNF	tumor necrosis factor	180
CDKN2A	cyclin dependent kinase inhibitor 2A	176
APP	amyloid beta precursor protein	173
TNC	tenascin C	166
OLIG2	oligodendrocyte transcription factor 2	163
SOX2	SRY-box 2	163
CTNNB1	catenin beta 1	158
IL6	interleukin 6	154
RTN4	reticulon 4	142
VIP	vasoactive intestinal peptide	142

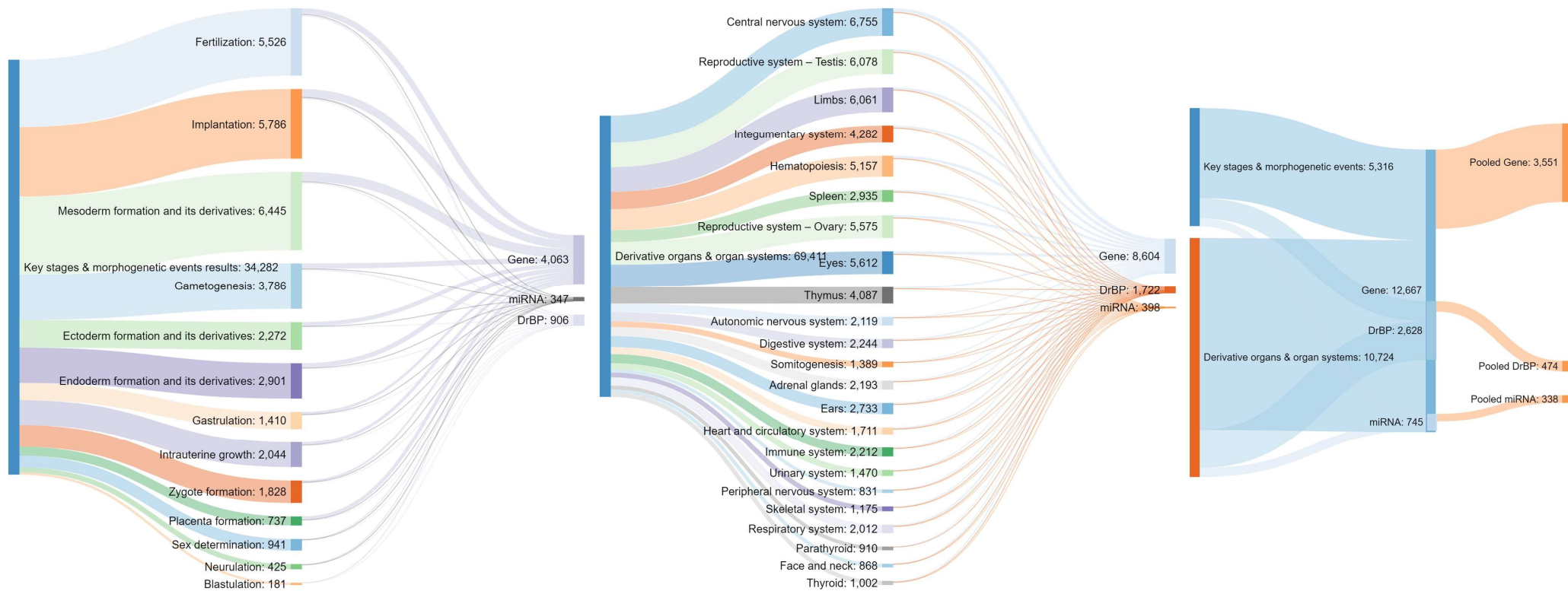
902 genes



Human Phenotype Ontology



# Pooled List of DARS biomarkers



# Pooled List of DARS biomarkers

## 3551 DARS Genes

	A	B	C
1	Gene symbol	Name	HitCount
2	CGA	glycoprotein hormones, alpha polypeptide	11924
3	SHH	sonic hedgehog	6622
4	WNT1	Wnt family member 1	6428
5	TGFB1	transforming growth factor beta 1	6056
6	IGF1	insulin like growth factor 1	4556
7	INS	insulin	4395
8	GNRH1	gonadotropin releasing hormone 1	3943
9	CTNNB1	catenin beta 1	3912
10	VEGFA	vascular endothelial growth factor A	3777
11	SRY	sex determining region Y	3479
12	POMC	proopiomelanocortin	3454
13	EGF	epidermal growth factor	3396
14	KIT	KIT proto-oncogene receptor tyrosine kinase	3380
15	POU5F1	POU class 5 homeobox 1	3307
16	CD4	CD4 molecule	3152
17	PAX6	paired box 6	3124
18	LIF	LIF, interleukin 6 family cytokine	3070
19	BMP4	bone morphogenetic protein 4	3027
20	CD34	CD34 molecule	3027
21	ESR1	estrogen receptor 1	2946
22	SOX9	SRY-box 9	2649
23	TNF	tumor necrosis factor	2620
24	TP53	tumor protein p53	2520
25	PTH1H	parathyroid hormone like hormone	2436
26	AMH	anti-Mullerian hormone	2431
27	NR5A1	nuclear receptor subfamily 5 group A member 1	2341
28	IGF2	insulin like growth factor 2	2290
29	LEP	leptin	2058
30	AKT1	AKT serine/threonine kinase 1	1977
31	FGF2	fibroblast growth factor 2	1912

## 474 DARS Biological Processes

	A	B	C
1	HitID	Name	HitCount
2	GO_0023052	signaling	21733
3	GO_0007049	cell cycle	3228
4	GO_0008219	cell death	2514
5	GO_0006306	DNA methylation	2440
6	GO_0001837	epithelial to mesenchymal transition	2422
7	GO_0016310	phosphorylation	2372
8	GO_0030154	cell differentiation	2262
9	GO_0048468	cell development	2248
10	GO_0001556	oocyte maturation	1973
11	GO_0022008	neurogenesis	1567
12	GO_0006412	translation	1541
13	NCIT_C17741	Oxidative Stress	1449
14	GO_0048477	oogenesis	1243
15	GO_0001171	reverse transcription	1235
16	GO_0016477	cell migration	1209
17	GO_0007165	signal transduction	1146
18	GO_0030218	erythrocyte differentiation	1134
19	GO_0016049	cell growth	1041
20	GO_0006914	autophagy	1021

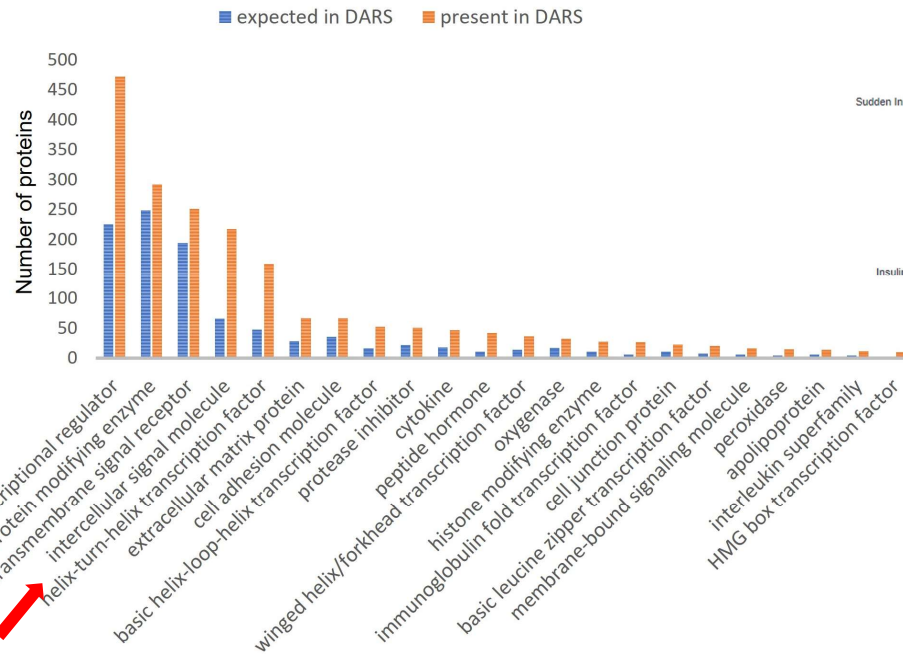
## 338 DARS miRNA

	A	B
1	HitID	HitCount
2	LET7	155
3	MIR-21	127
4	MIR-145	85
5	MIR-125B	73
6	MIR-17	73
7	MIR-17-92	65
8	MIR-1	64
9	MIR-302	62
10	MIR-124	56
11	MIR-29B	55
12	MIR-34C	52
13	MIR-34A	51
14	MIR-130B	51
15	MIR-375	49
16	MIR-200C	46
17	MIR-24	45
18	MIR-29A	44
19	MIR-429	41
20	MIR-223	41



# Protein classes and signalling pathways over-represented in DARS biomarkers

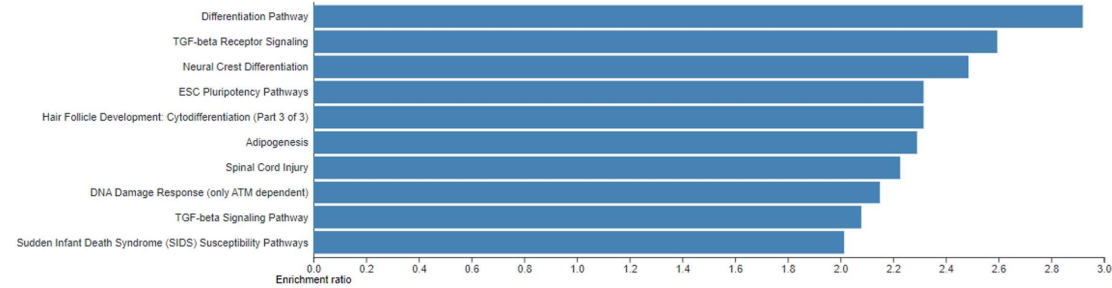
PANTHER PROTEIN CLASS



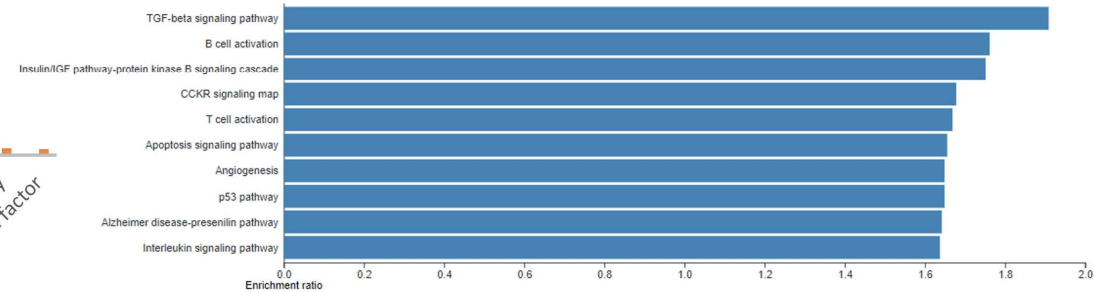
**DARS BP:** Signalling, cell cycle, cell death, DNA methylation, epithelial to mesenchymal transition, phosphorylation, cell differentiation, cell development, oocyte maturation and neurogenesis

**DARS miRNA:** LET-7, MIR-21 and MIR-145

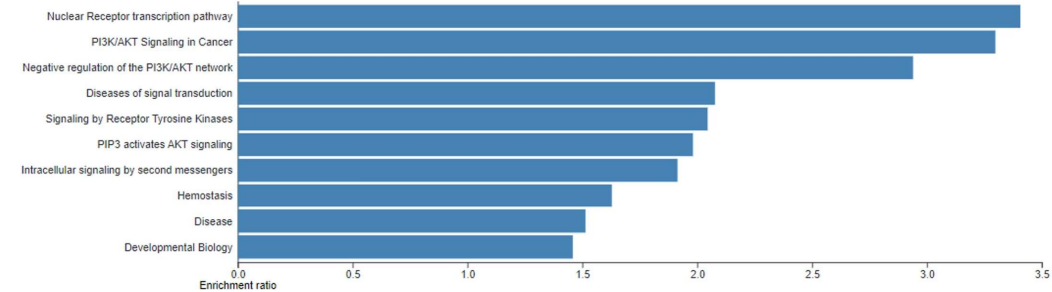
WikiPathway



Panther



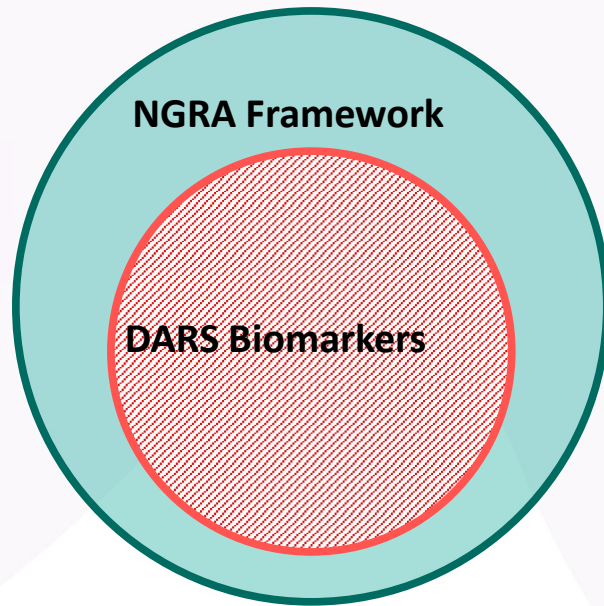
Reactome



Rajagopal et al., Front. Toxicol., 2022

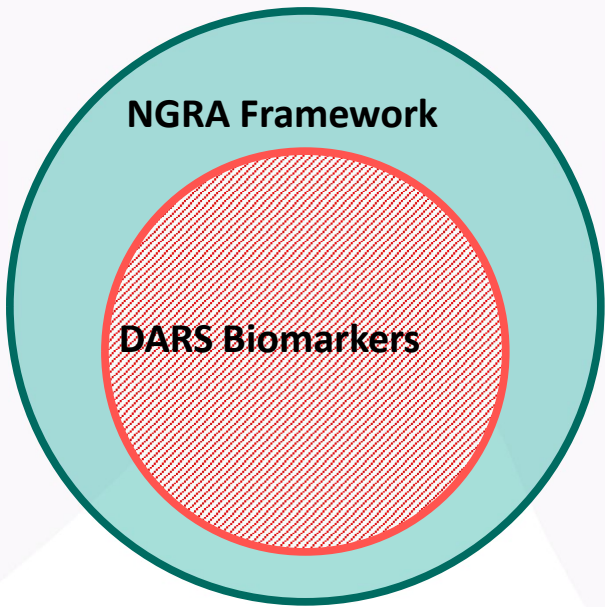


# Biological coverage of the DARS biomarkers by the DART NGRA



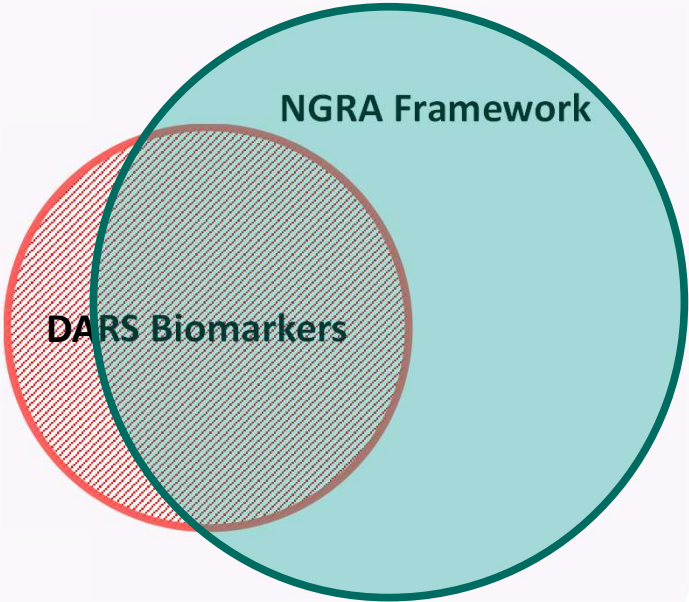
Expectation

# Biological coverage of the DARS biomarkers by the DART NGRA



Expectation

*versus*

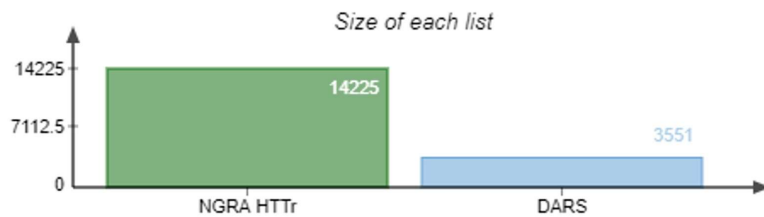
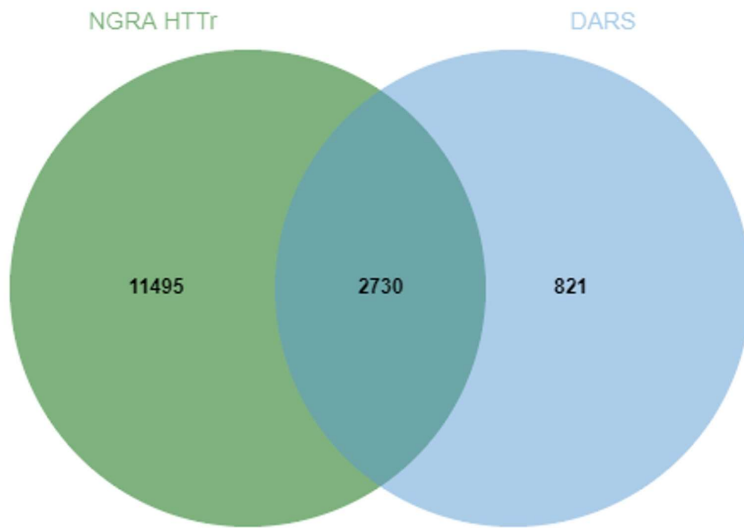


Reality



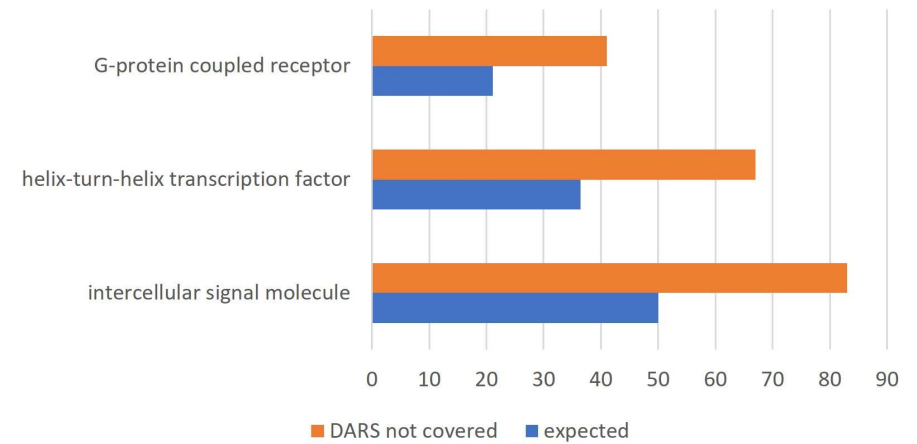
# Biological coverage of the DARS biomarkers by the DART NGRA

## Coverage



## Gaps

### Gaps - Panther Protein Classes



- 41 GPCRs (6 present in IPP)
- 60 HTH transcription factors (mainly homeobox transcription factors)
- Intercellular signal molecules (chemokines, cytokines, growth factors, neurotropic factors, peptide hormones)



# Biological coverage of the DARS biomarkers by the DART NGRA



## Coverage

General cellular & functional processes- cell survival, cytotoxicity

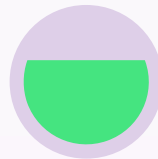
Receptor or enzyme activity- IPP covers about 13%

Signalling pathways- DARS genes

Specific differentiation- ReproTracker®

Specific cellular processes- devTOXQuickPredict™

Cellular stress- Cell stress panel assays

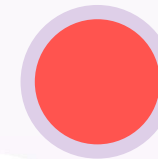


## Gaps

Specific cellular processes- E.g. cytokine secretion or myelination or androgen biosynthesis

Specific functional processes- E.g. sperm motility or axon guidance or lymphocyte migration

Receptor or enzyme activity- E.g. receptor tyrosine kinases or receptor serine/threonine kinases or GPCRs



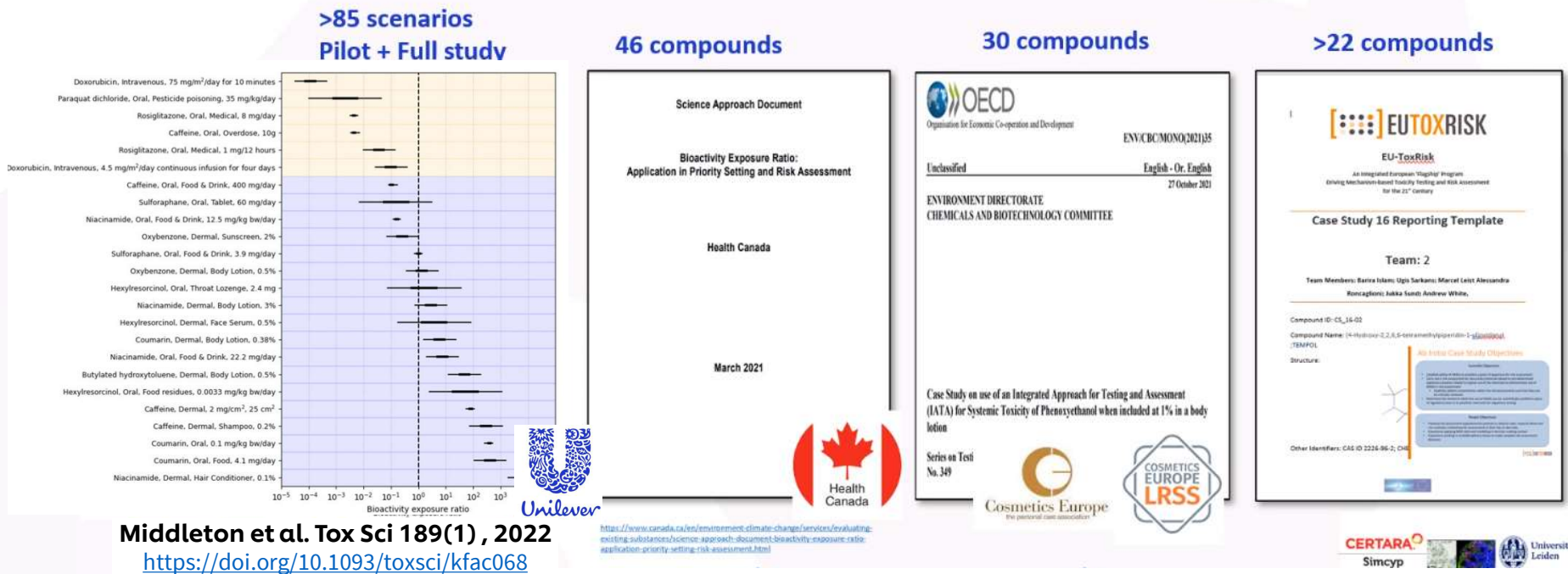
## Weight of evidence

Integrating data from different NAMs

MIE -> KEs -> Adverse effects  
E.g. ADORA 2A binding, inhibition of PI3Kinase-AKT signalling, T cell development

**Case studies - flexible and fit for purpose validation of  
NGRA DART**

# How PODs from NAMs compare to PODs coming from animal studies

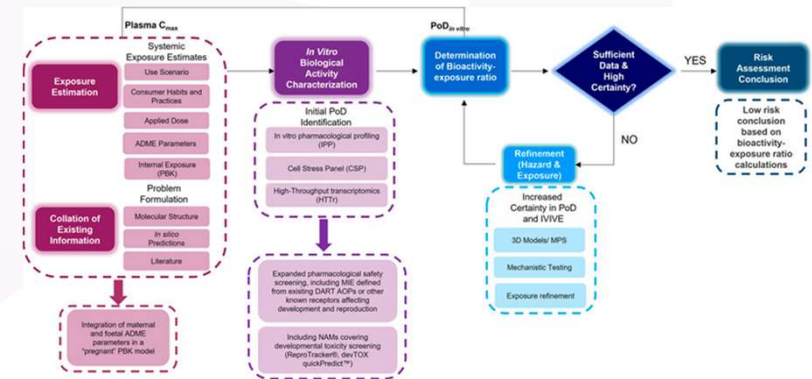


**Health Canada: “The purpose of this SciAD is to demonstrate that PODBioactivity can provide a lower bound estimate for in vivo based effect levels derived from oral repeat-dose, developmental, and reproductive studies considered under the Chemicals Management Plan (CMP). The PODBioactivity was lower than the lowest PODTraditional cited in the risk assessment for 43 of the 46 of the chemicals examined. These findings are consistent with other published case studies using similar methodology. This was done to demonstrate confidence in using in vitro bioactivity as a surrogate lower bound estimate of in vivo adverse effect levels.”** From Health Canada



## Next Steps

- Evaluation of DART NGRA across many chemistries
- **ReproTracker assay**
  - Development and evaluation of an osteoblast differentiation protocol

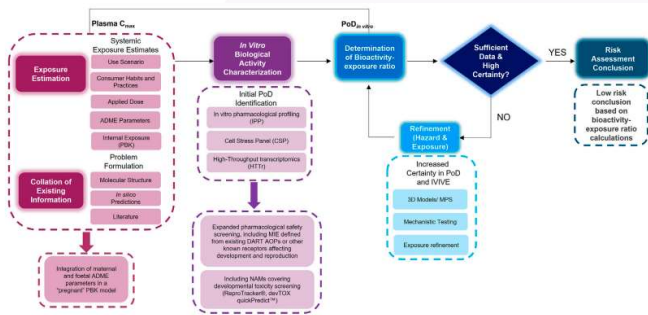


Rajagopal et al., Front. Toxicol., 2022

- Identification and filling of existing gaps (PBK modelling e.g placenta transfer measurements, DNT, DIT, endocrine disruptors, multigenerational effects, studying epigenetics in germline development, advanced cell models for refinement)
- CLP/GHS hazard classification
- Use for regulatory purposes (REACH submission)

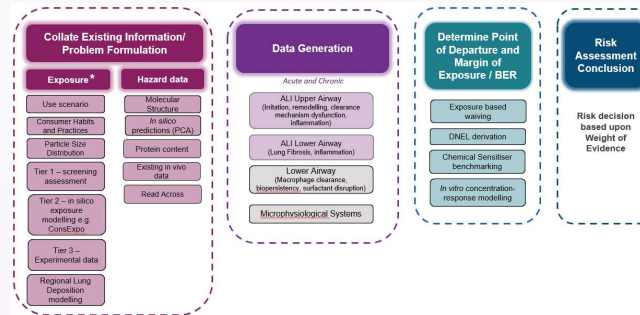
# Unilever NGRA frameworks for Consumer Safety decisions

## Developmental & Reproductive



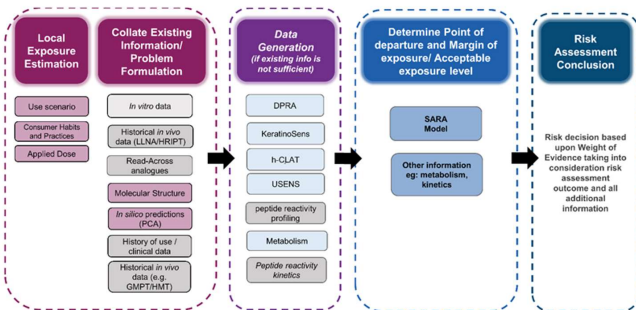
Rajagopal et al (2022) *Frontiers in Toxicology*, doi: 10.3389/ftox.2022.838466

## Inhalation



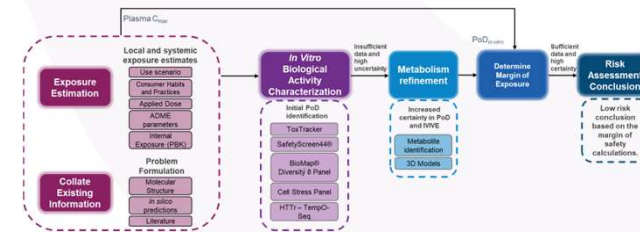
## Ongoing Evaluations

## Skin Sensitisation



Reynolds et al (2021) *Reg Tox Pharmacol*, **127**, 105075

## Systemic



Baltazar et al (2020) *Toxicol Sci*, **176**, 236-252



# Acknowledgments

Maria Baltazar, Elin Barrett, Danilo Basili, Paul Carmichael, Mathew Dent, Julia Head, Jade Houghton, Hequn Li, Alistair Middleton, Iris Müller, Gopal Pawar, Katarzyna Przybylak, Ramya Rajagopal, Joe Reynolds, Kritika Sadh, Wendy Simpson, Sandrine Spriggs, Andrew White, Katy Wilson, Kathryn Wolton



## TT21c.org:



Home > Resources

### Resources

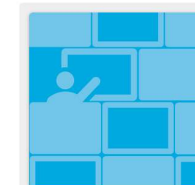
Access publications, presentations and posters on our 21<sup>st</sup> century safety sciences produced by SEAC scientists, and also in collaboration with our scientific partners.



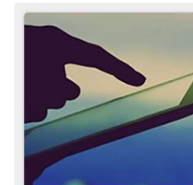
Publications



Presentations



Posters



Learning Materials



Unilever