

# Representation and Extraction of Causality Statements

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In collaboration with  
EBI – Reactome, PSI-MI  
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@DrugLogics



# The DrugLogics Initiative

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Towards the development of precision and personalised medicine

## Crossover Research

Structured Knowledge  
Commons resource  
DbTF curation  
Scicura

## DrugLogics

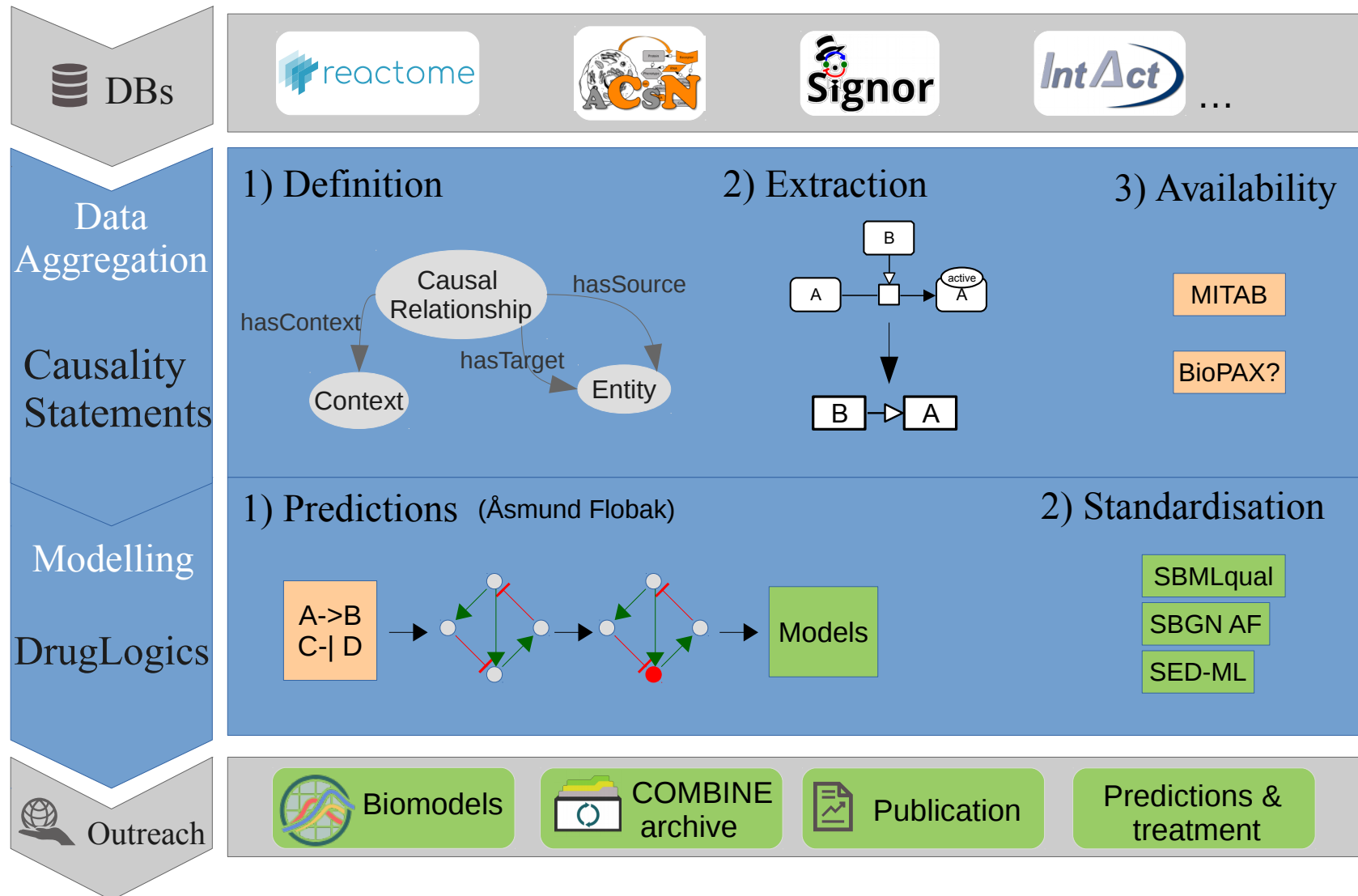
Drug development of  
anti-cancer combinations

## COLOSYS

Drug resistance  
prediction in colon cancer  
via computer models

# Personal tasks within the DrugLogics

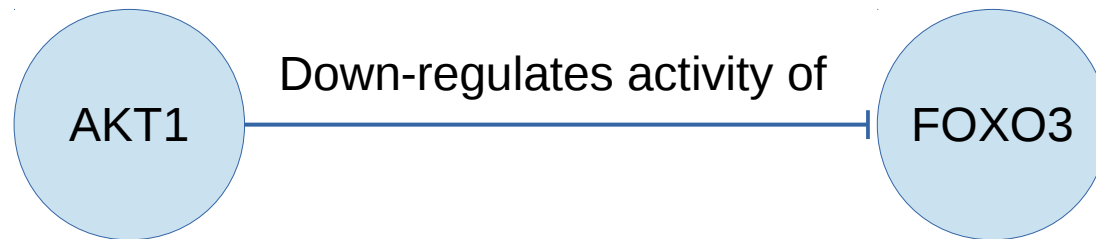
Facilitate the process of building biological models with causal statements



# Representation of causal statements

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Causal interaction between two biological entities (gene, RNA, protein, complexes, etc...)



# Representation of causal statements

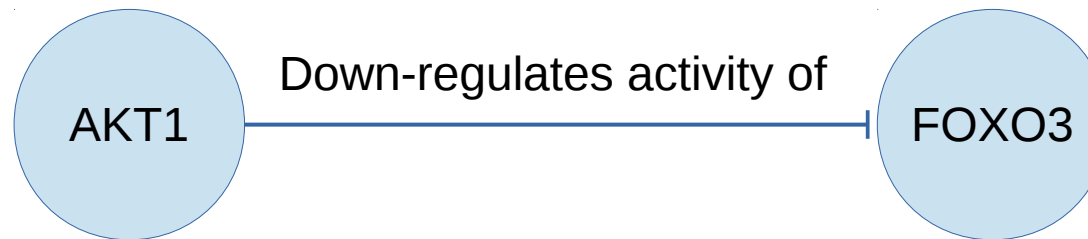
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How to represent meaningful causal interactions?

What is FOXO3's state?  
(active/inactive)

When and where does  
this interaction occurs?

Which molecular function  
is down-regulated?



What is the regulation type?  
(phosphorylation, acetylation,  
dephosphorylation)

Is it a direct or indirect  
Interaction?

# Minimum Information for Causality Statements

## Entity – Source & Target

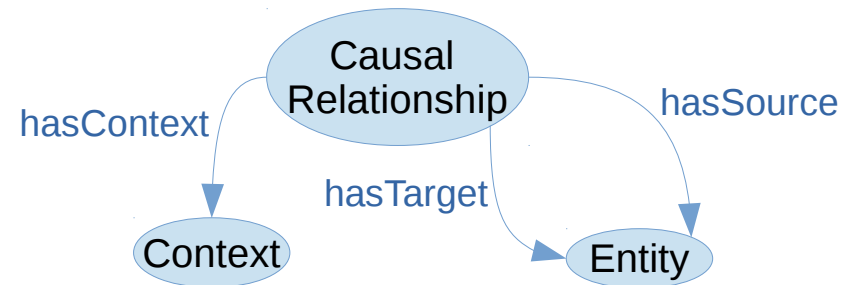
- ID – ex: causalDB:FOXO3
- Reference ID - HGNC; Uniprot; Entrez
  - *For Complex: ComplexPortal?*
- Name – ex: FOXO3
- Type - gene, RNA, protein, complex
- Molecular function – GO:MF
- Compartment – GO

## Causal Relationship

- Regulation type – down-regulates
- Mechanism - PSI MOD?
- Modified residue – Tyr@P202
- Provenance – ex: Reactome, PMID
- Evidence – ECO
- Confidence – intact-miscore
- *Interaction depth – 0 (direct); 1; 2; etc...*

## Context – case specific

- General biological context
  - Species – TaxID
  - Tissue type – Brenda Tissue Ontology (BTO), Uberon?
  - Cell type – BTO, Cell Line Ontology (CLO)?
- Text – Scicura sentence (<http://scicura.org/info.html>)
- Experimental conditions
  - Tissue / Cell state
- Source context
  - State of chromatin
  - Concentration – could be a number, a range



Controlled Vocabulary and Ontologies – essential to make data sustainable, shareable and interoperable

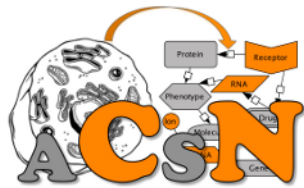
# Extraction from prior knowledge

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Aggregation of causal data from several existing resources



Pathways,  
reactions



Pathways of  
cancer related  
signaling  
networks



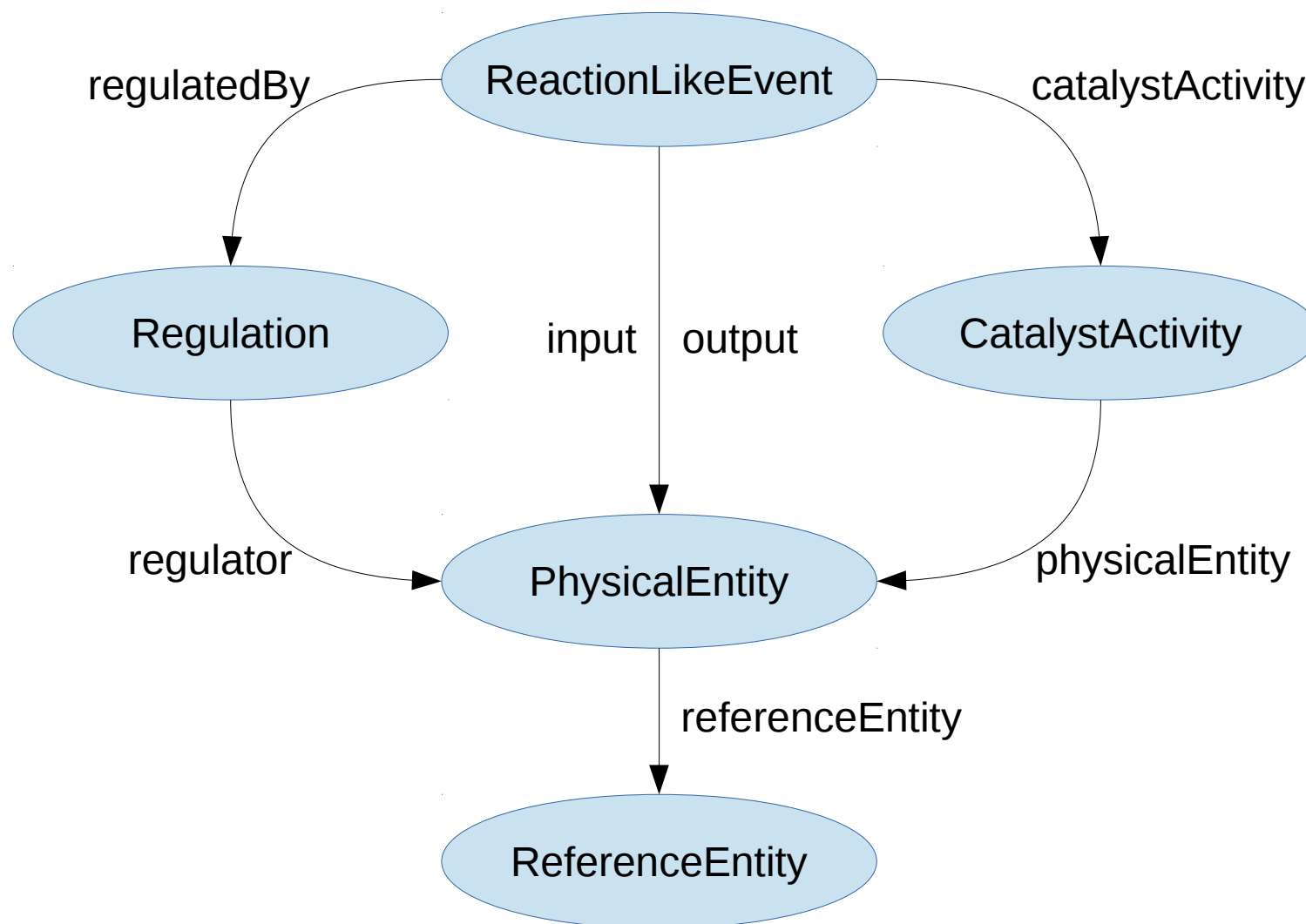
DB of causal  
interactions



DB of molecular  
interactions

# Case 1: extraction from Reactome

Reactome data model extraction using Neo4j and Cypher Query language





# Case 1: extraction from Reactome

## Reactome data model extraction using Neo4j and Cypher Query language



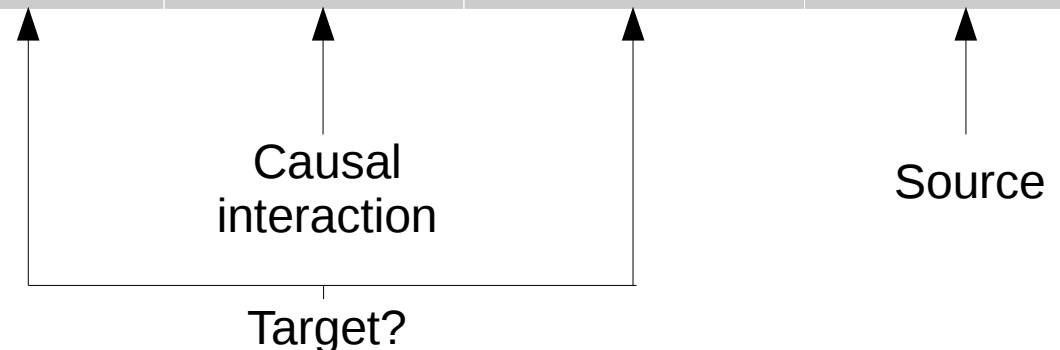
Example: Get all reactions regulated by a physical entity or catalysed by a catalyst activity

```
MATCH (rle:ReactionLikeEvent)-[:regulatedBy|catalystActivity]->(o)-[:regulator|physicalEntity]->(source:PhysicalEntity)
OPTIONAL MATCH (input:PhysicalEntity)<-[:input]-(rle)-[:output]->(output:PhysicalEntity)
RETURN  rle.stId AS ReactionID,
        rle.displayName AS Reaction,
        COLLECT(input.displayName) AS Inputs,
        COLLECT(output.displayName) AS Outputs,
        o.simpleLabel AS Regulation,
        source.displayName AS Regulator
```

*“Cypher is your friend” - A. Fabregat*

# Case 1: resulting outputs

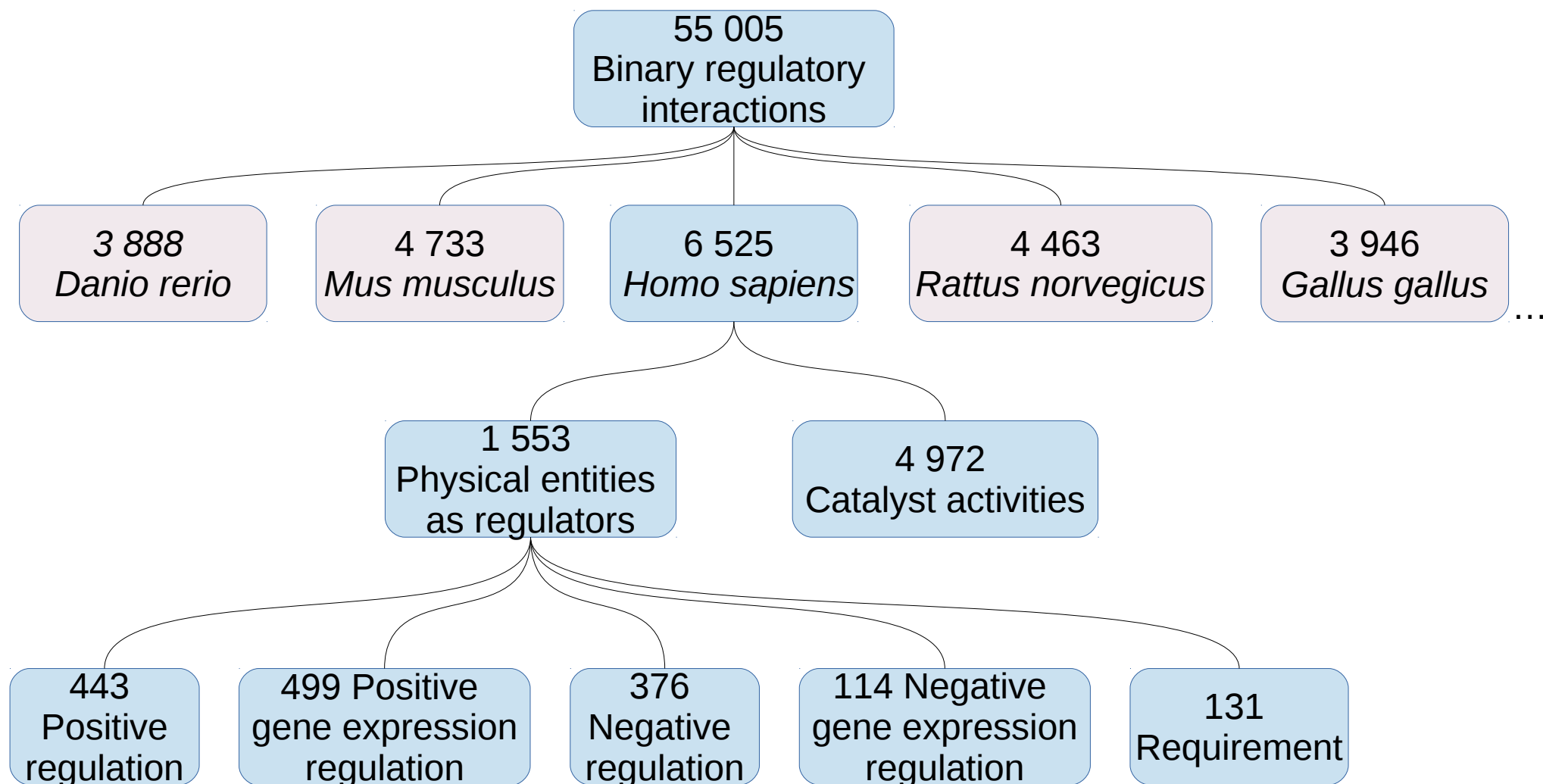
ReactionId	Reaction	Compartment	Inputs	Effect	Outputs	Regulator
R-HSA-452338	Expression of TDGF1 (CRIPTO)	cytosol	["TDGF1 gene [nucleoplasm]"]	NegativeGeneExpressionRegulation	["N-aspartyl-glycosylphosphatidylinositol ethanolamine-TDGF1(31-188) [plasma membrane]"]	NR6A1(GCNF):TDGF1 gene [nucleoplasm]
R-HSA-8936628	GP1BA gene transcription is stimulated by the complex containing RUNX1, PRMT1 and GATA1 and inhibited by the complex of RUNX1, SIN3A and PRMT6	plasma membrane	["GP1BA gene [nucleoplasm]"]	NegativeGeneExpressionRegulation	["GP1BA [plasma membrane]"]	RUNX1:CBFB:SIN3A, (SIN3B):PRMT6:HDA C1:GP1BA gene:H3K4me2,H3R2me2a-Nucleosome [nucleoplasm]
R-HSA-8944497	PTEN mRNA translation is negatively regulated by microRNAs	cytosol	["PTEN mRNA [cytosol]"]	NegativeGeneExpressionRegulation	["PTEN [cytosol]"]	miR-20 RISC:PTEN mRNA [cytosol]



# Case 1: Some numbers – Version 61

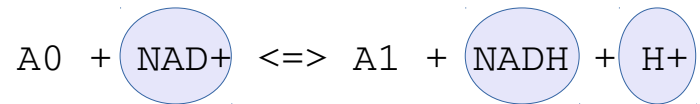
Number of pathways: 22 723

Number of reactions: 84 759



# Case 1: questions / challenges raised

- Exclude trivial molecules



- Missing IDs for the modified mechanism type (event categories)

*Transfers*

*Translocates from ... to*

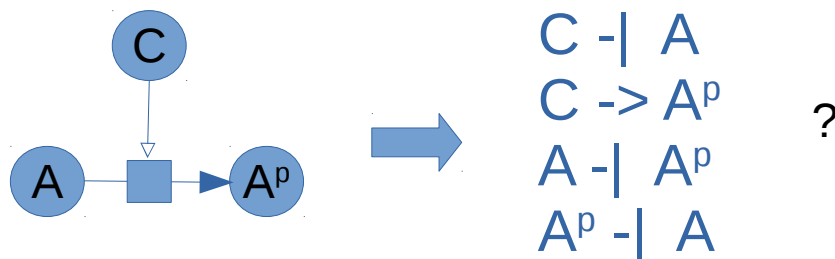
*Transports*

*Exchanges ... for ...*

*Cotransports*

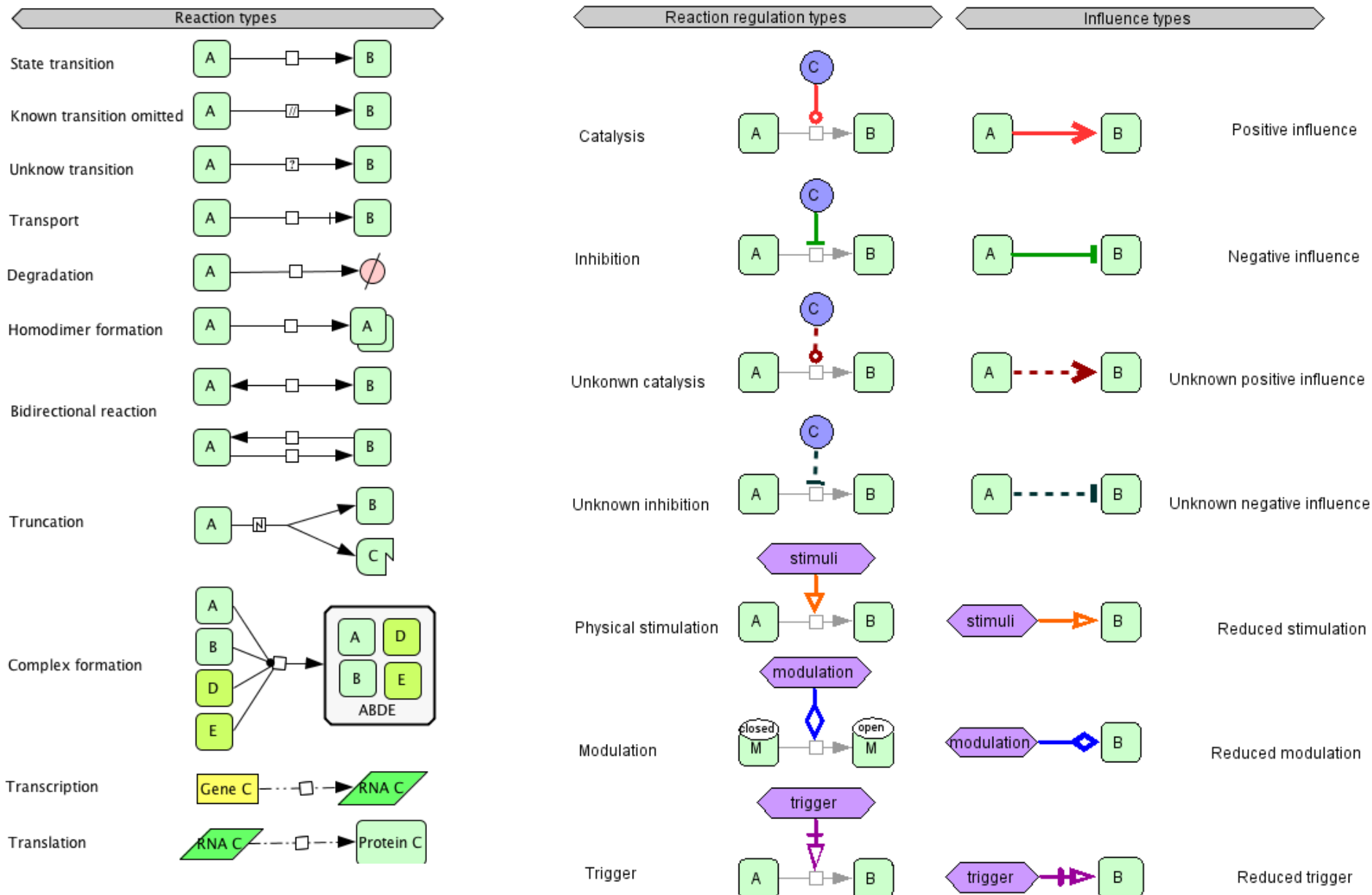
*Regulates*

- Inference of causal interactions from reaction networks



# Case 2: extraction from ACSN

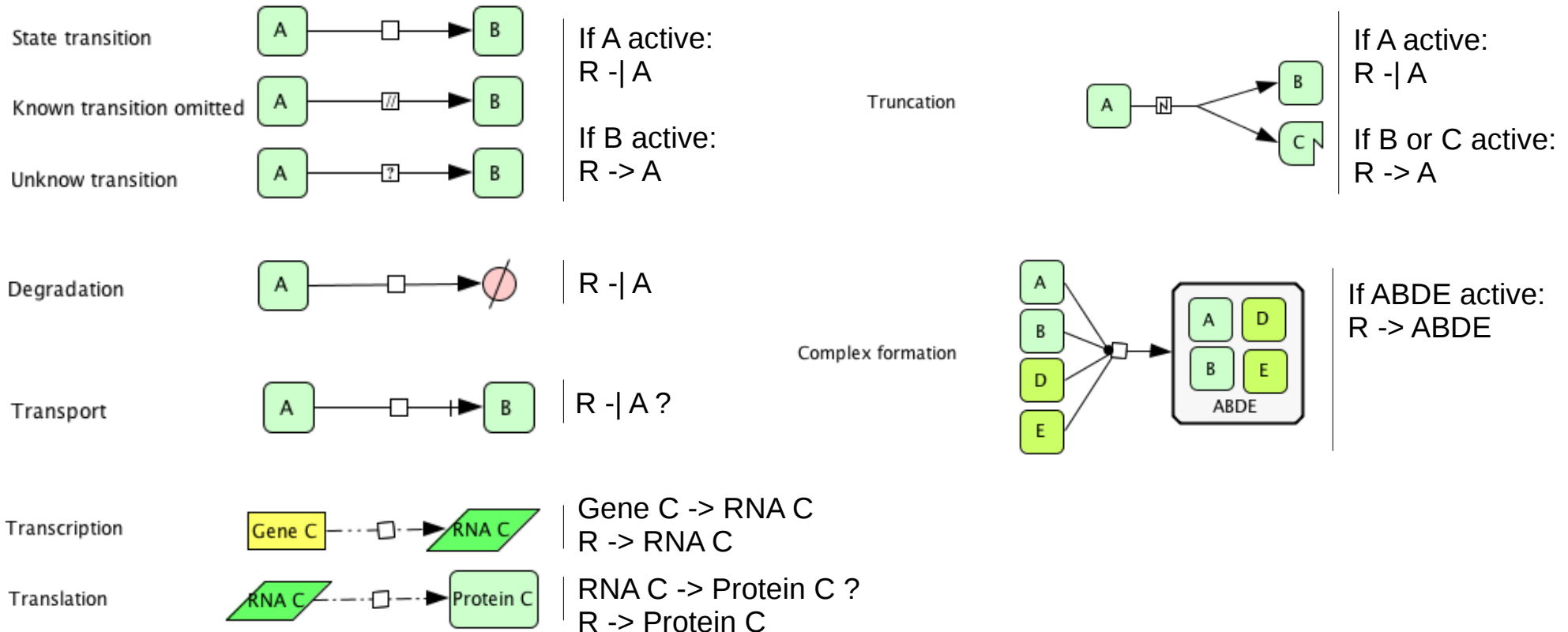
ACSN data model follows SBGN PD schema from CellDesigner tool



# Case 2: extraction from ACSN

## How to convert reaction types to causal interactions?

Suppose R, a regulator targeting each reaction below

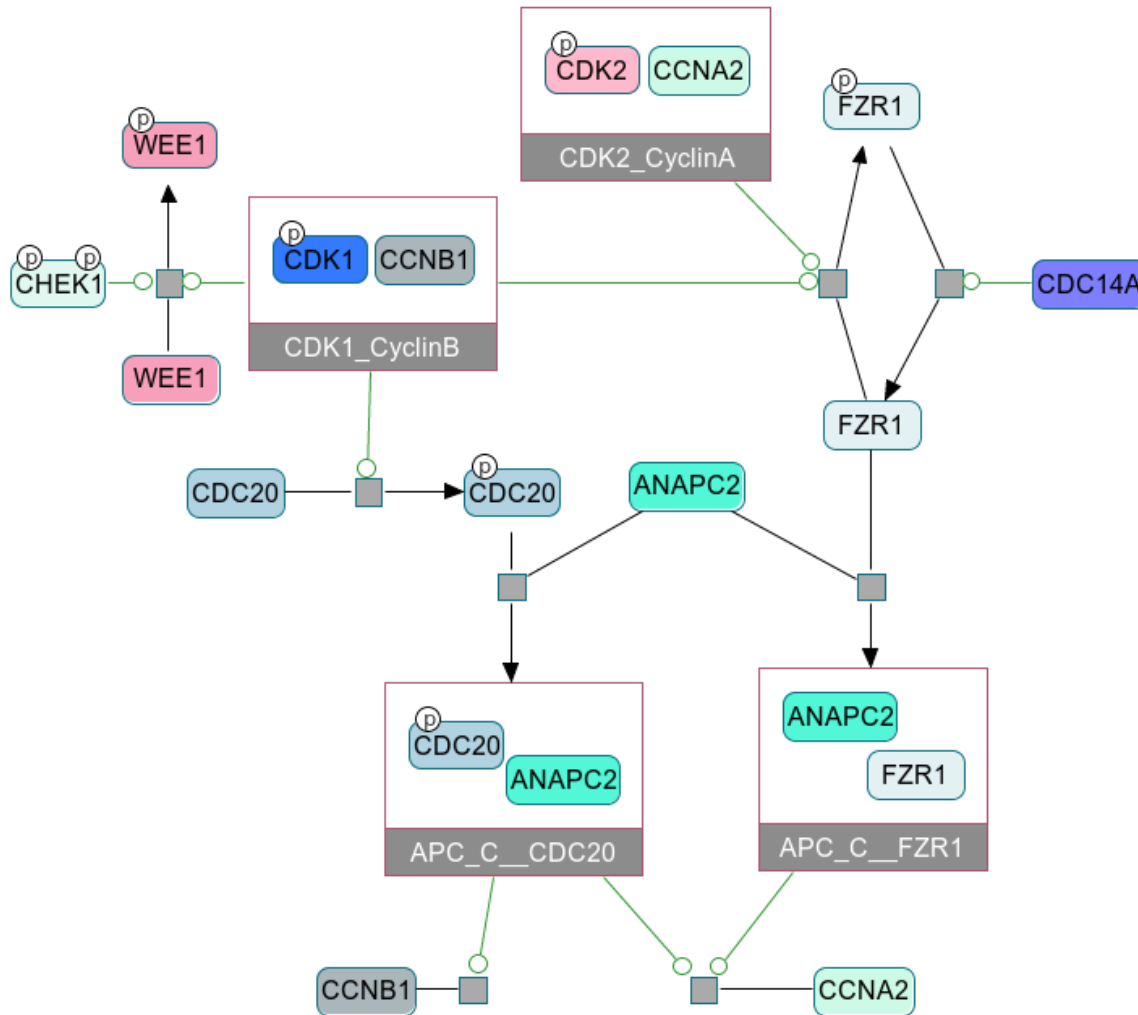


Catalysis, unknown catalysis, trigger, physical stimulation  $\rightarrow$  positive influences  
 Inhibition, unknown inhibition  $\rightarrow$  negative influences  
 Modulation  $\rightarrow$  not defined influence

**Notation**  
 $\dashv$  inhibition  
 $\rightarrow$  activation

# Case 2: extraction from ACSN

## Manual inference of causal interactions from the Cell Cycle – APC module



### List of causal interactions:

CDK2\_CyclinA -| FZR1

CDK1\_CyclinB -| FZR1

CDC14A -> FZR1

APC\_C\_CDC20 -| CCNA2

APC\_C\_FZR1 -| CCNA2

APC\_C\_CDC20 -| CCNB1

CDK1\_CyclinB -> CDC20

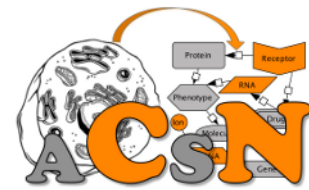
Undefined causality:

CDK1\_CyclinB regulates Wee1

CHEK1 regulates Wee1

→ How to interpret when both reactant and product are regulators...?

# Case 2: extraction from ACSN



Atlas of Cancer Signaling Network – pathways of biochemical interactions

SBML with CellDesigner annotations



Difficult to parse

BioPAX

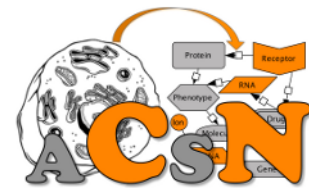


Easier to parse  
More intuitive

2 659 CATALYSIS:  
2 537 – regulatory interactions  
122 – boolean gates



## Case 2: Possible improvements in ACSN's BioPAX



- BioPAX online validator: No.unification.xref errors
- Family information missing: use 'memberEntityReference' ?
- Complex association / dissociation: better defined with 'spontaneous' in ComplexAssembly?
- Annotations on Entities: PMIDs should be on Reactions

# Future work

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- Pipeline to extract causal interactions from PD networks with conversion rules defined
- Model checking to validate our models
- Discuss MICAST with the community (curation workshop in Dec)

# Thank you for your attention!

## The DrugLogics team

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