

# DrugLogics project: causality, modelling, drug predictions

PhD project and research stay at ENS

Towards the development of precision and personalised medicine

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Crossover Research

Structured Knowledge Commons resource DbTF curation Scicura

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Drug development of anti-cancer combinations

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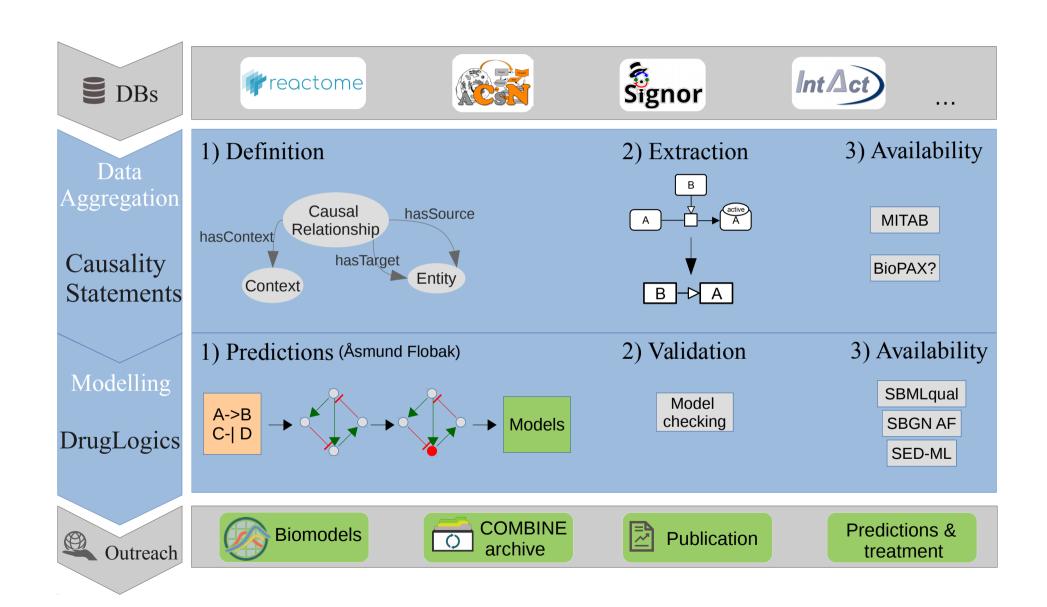
DrugLogics

Drug development of anti-cancer combinations

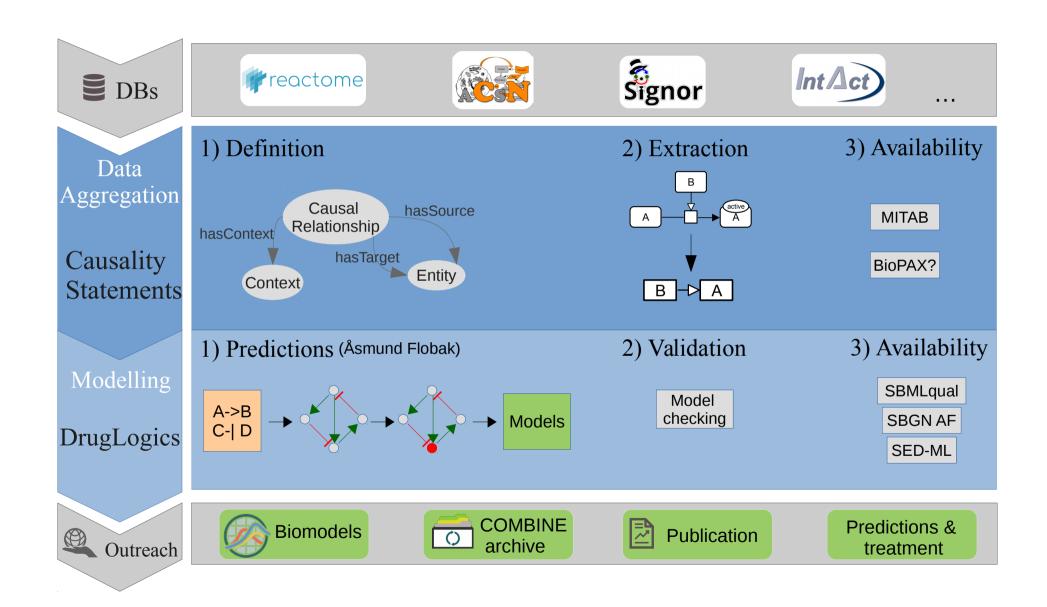
**COLOSYS** 

Drug resistance prediction in colon cancer via computer models

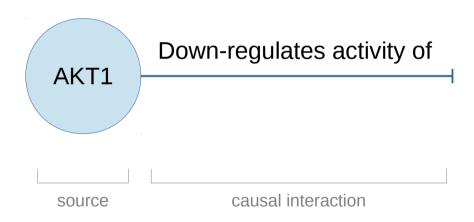
#### Overview of the PhD project

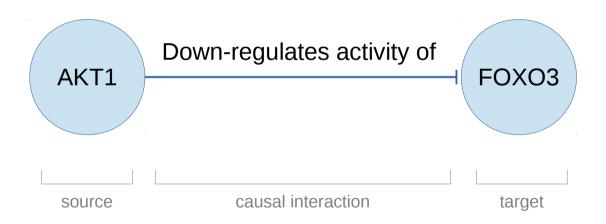


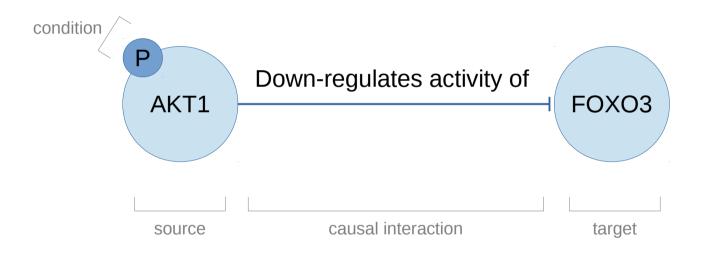
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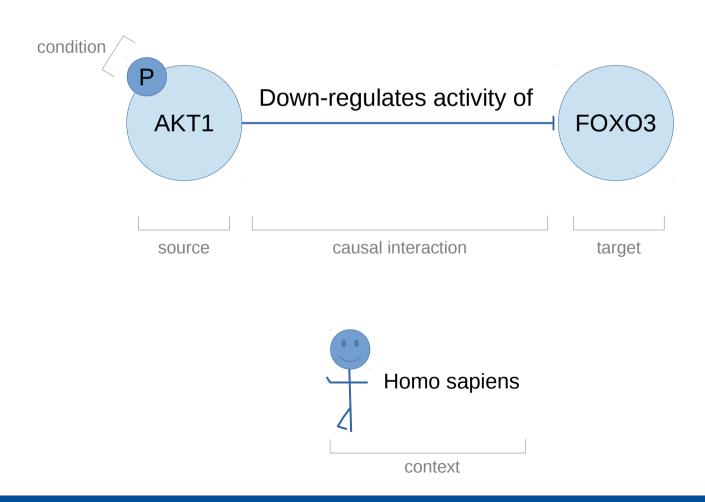










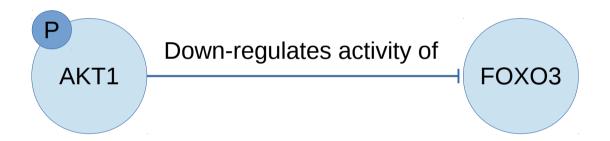


## How to encode meaningful causal statements?

What is FOXO3's state?

When and where does this interaction occurs?

Which molecular function is down-regulated?



What is the regulation type?

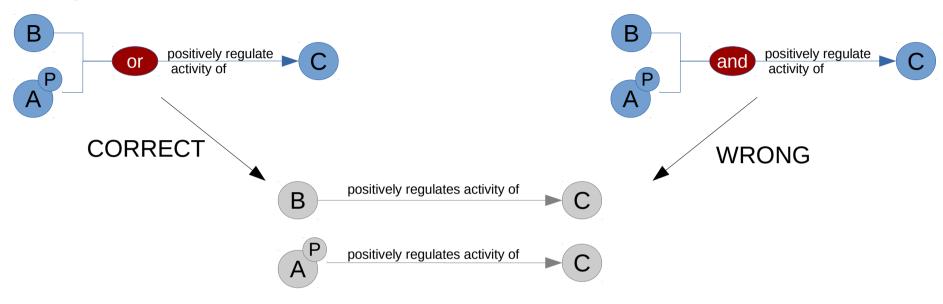
Is it a direct or indirect Interaction?

## Representation of causality: current state

	Entities Identifiers	Directed	Causality annotation	Evidence	Format
MITAB2.7	Entrez gene/Ensembl embl/ddbj/genbank UniProtKB/RefSeq ChEBI	no	Free text: "causality statement:"	PUBMED	tabular
Causaltab	Embl/ddbj/genbank UniprotKB/RefSeq ChEBI/PubChem ComplexPortal Signor_ID	yes	MI – causal interaction	PUBMED	tabular
GO-CAM	Gene symbols UniprotKB ChEBI	yes	Relation Ontology	PUBMED ECO	OWL
BEL	Mainly HGNC but flexible	yes	Own representation	Text with ontologies	BEL script, JSON

#### Representation of causality: what is missing?

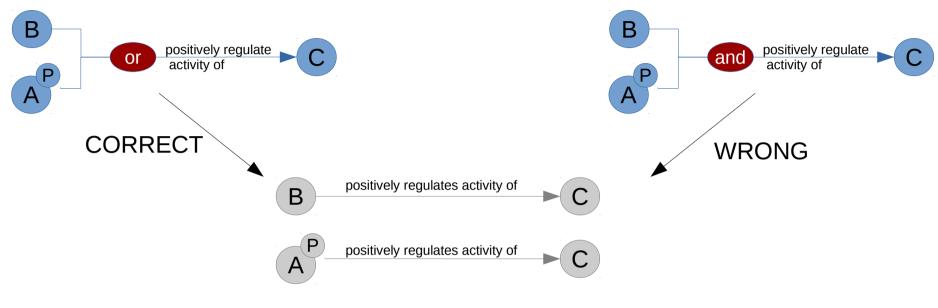
1) Multi-regulated causal interaction



→ introduce logics in formats

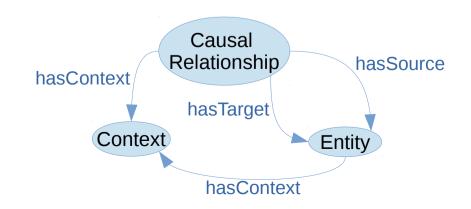
#### Representation of causality: what is missing?

1) Multi-regulated causal interaction



→ introduce logics in formats

- 2) Common structure for representing causality
  - → Guideline for representing causality (MICAST)
     Frame for defining context
     Ontologies recommendation



## Extraction from prior knowledge

Aggregation of causal data from several existing resources



Pathways, reactions



Pathways of cancer related signaling networks



DB of causal interactions



DB of molecular interactions

~ 6 000 interactions

~ 2 500 interactions

~ 20 000 interactions

~ 800 interactions



Exclude trivial molecules



Exclude trivial molecules

Missing information

ex: IDs for the modified mechanism type

Transfers
Transfora

Translocates from ... to

**Transports** 

Exchanges ... for ...

Cotransports

Regulates



Exclude trivial molecules

Missing information

ex: IDs for the modified mechanism type

**Transfers** 

Translocates from ... to

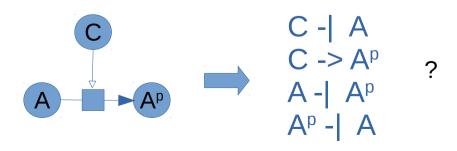
**Transports** 

Exchanges ... for ...

Cotransports

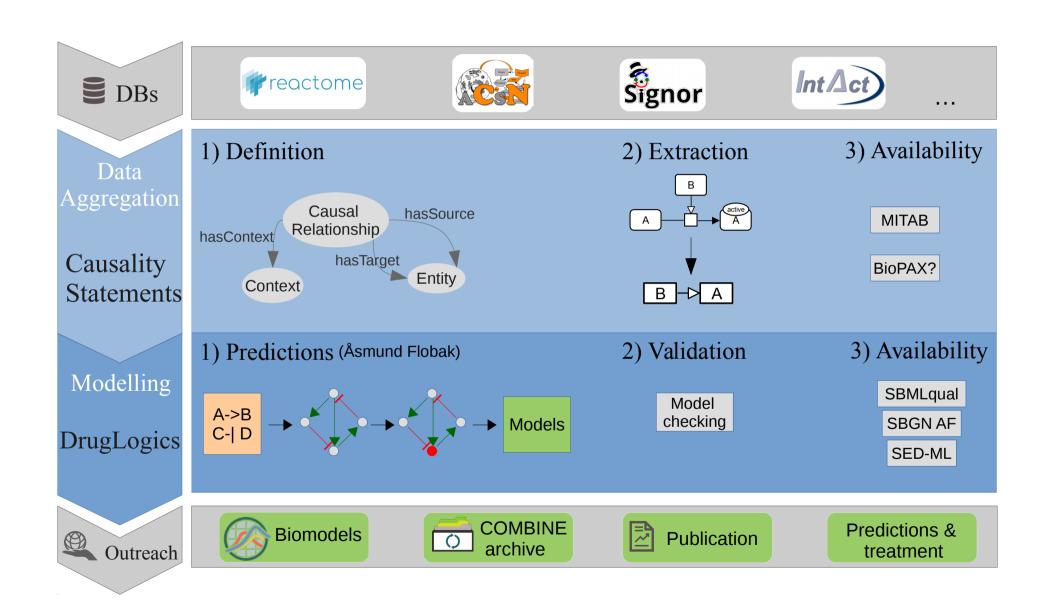
Regulates

Inference of causal interactions from reaction networks

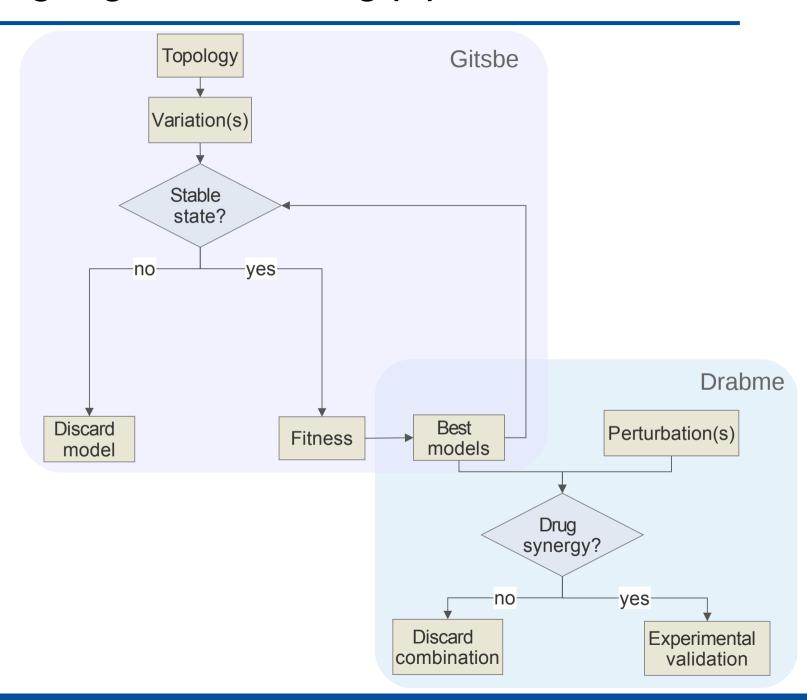




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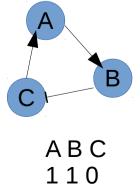


## The DrugLogics' modelling pipeline



#### Stable states identification

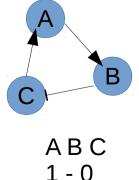
- BNReduction algorithm (Veliz-cuba)
- Combination of network reduction and computational algebra
- Works fine up to 1000 nodes



## Trap space identification

- "Symbolic steady states"
- Highlight potential existence of complex attractors

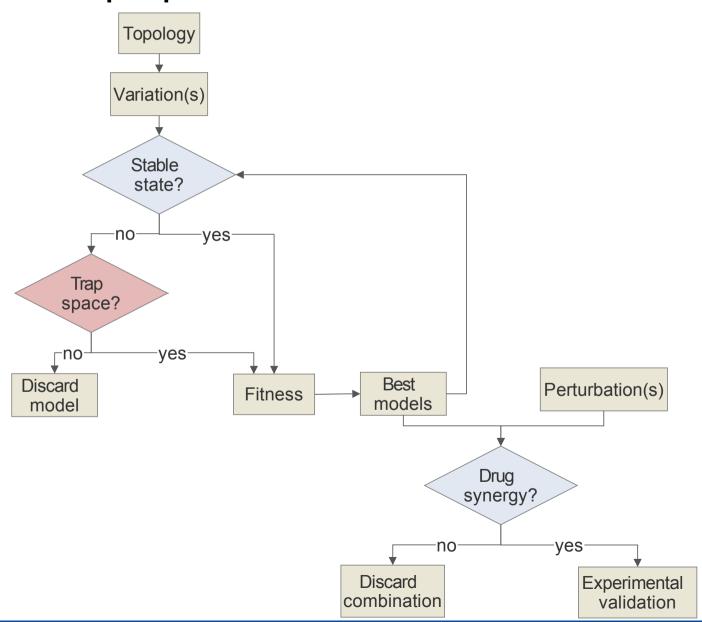
Use of bioLQM library



## Scripting with GINsim and bioLQM



Compute trap spaces



## Scripting with GINsim and bioLQM



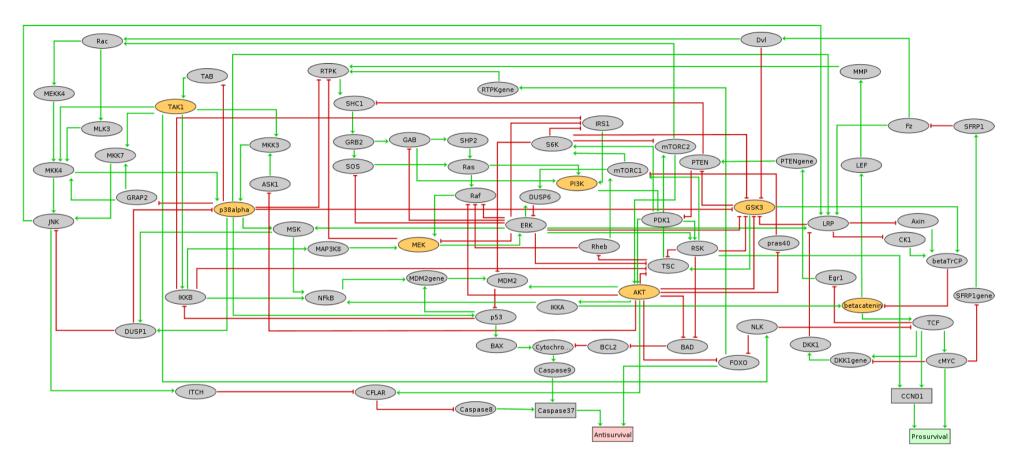
- Compute stable states for multiple combinations of perturbation
  - → automation

- Export into SBMLqual, ginml, bnet
  - → standardardisation

#### Model Checking: validating our models

- NuSMV + temporal logic formulas
- Trap space reachability
- Findings on drug synergies?

#### Case study: gastric adenocarcinoma cells



- 77 nodes & 149 interactions
- 7 drugs
- 2 outputs: Prosurvival & Antisurvival

#### Thank you for your attention!

#### The DrugLogics team

#### **Dept of Biology**

Martin Kuiper Steven Vercruysse Wim De Mulder Vladimir Mironov Vasundra Touré Stian Holmås Rafel Riudavets

## Dept of Clinical and Molecular Medicine

Astrid Lægreid
Liv Thommesen
Åsmund Flobak
Miguel Vazquez
Marcio Acencio
Barbara Niederdorfer
Evelina Folkesson
Kathleen Heck

## Dept of Philosophy and Religious Studies

Rune Nydal Ane Møller Gabrielsen Anamika Chatterjee



Norwegian University of Science and Technology

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