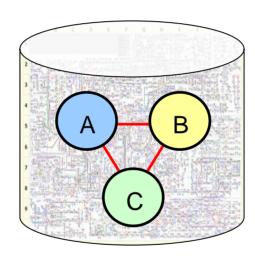
# Pathway Knowledge Base: A Public Repository for Searching Biological Pathways

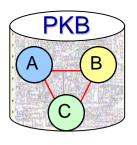


http://pkb.stanford.edu

Nikesh Kotecha<sup>1</sup>, Kyle Bruck<sup>1</sup>, William Lu<sup>1</sup> and Nigam Shah<sup>1</sup>

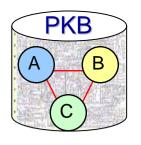
<sup>1</sup>Department of Biomedical Informatics, Stanford University Email: pathwaykb@lists.stanford.edu

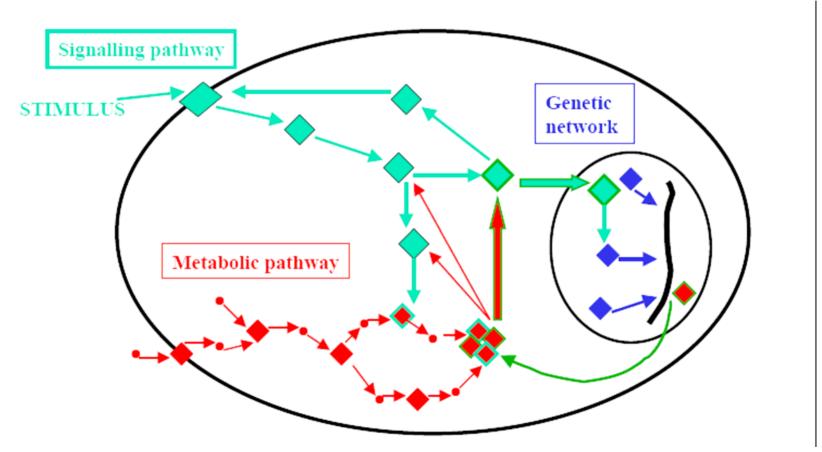
#### **Outline**



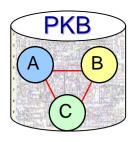
- The problem with pathways...
- BioPAX and data exchange
- Pathway Knowledge Base
  - Querying over multiple data sources
  - Data import and query process
- Evaluation
- Conclusion & Next Steps

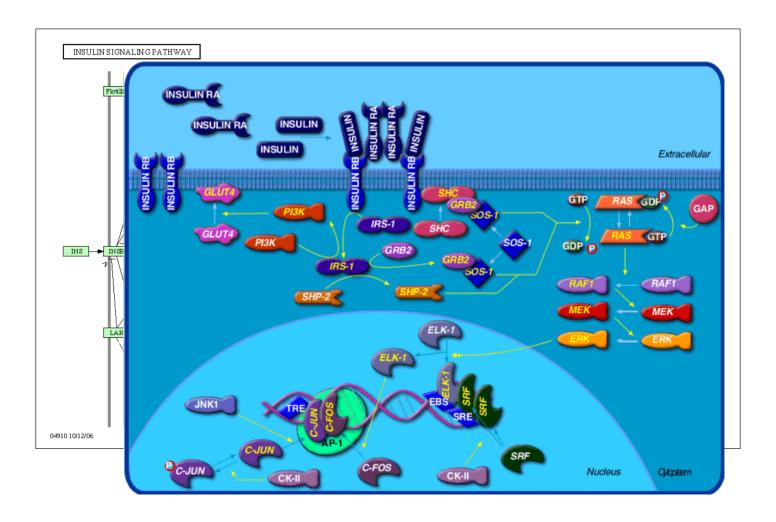
# Pathways convey biological phenomena





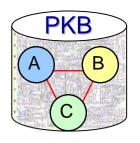
# Users interpret non-standard pathway diagrams





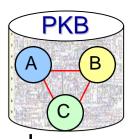
Insulin signaling pathways – KEGG & BioCarta

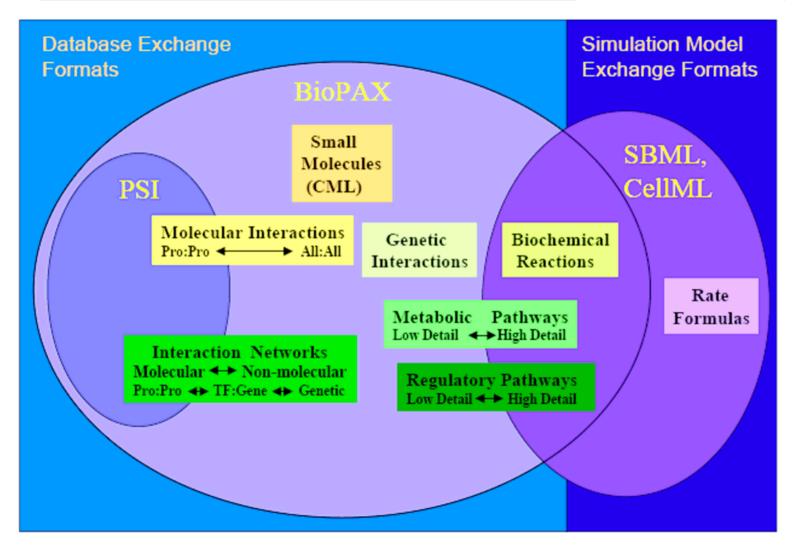
## The problem with pathways...



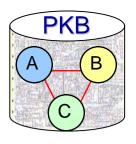
- Too many sources to investigate
  - >200 databases in the Pathway Resource List
    - http://www.pathguide.org
- Pathway diagrams are the primary way for consuming information
  - Non-standard
  - Incorporates a handful of genes and proteins
  - Difficult to compute over
- "Pathway" representation is not easy to define
  - Appropriate levels of abstraction
  - Standard naming systems for molecules
  - Appropriate numbers of components

# BioPAX is an emerging standard for pathway representation





# BioPAX allows for creation of a central resource



#### BioPAX

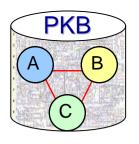
- Standardized representation of Pathway data in OWL
  - Provide method for exchange that promotes interoperability between known data sources.

Development level	Scope of format	Sample data sources*
Level 1	Metabolic pathways	aMAZE, BioCyc, KEGG, PUMA2
Level 2	Level 1 plus molecular interactions	BIND, DIP, HPRD, IntAct, MINT
Level 3	Level 2 plus signaling pathways and gene regulation	CSNDB, INOH, PATIKA, Reactome, TRANSPATH
Level 4	Level 3 plus genetic interactions	FlyBase, MIPS
Future levels	Level 4 plus abstract associations	PubGene, GeneWays

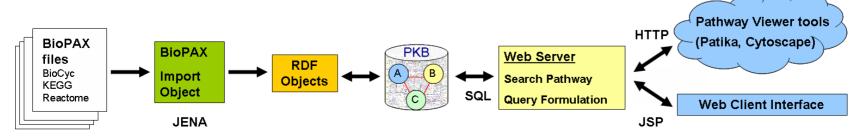
\*For a complete listing, see http://www.cbio.mskcc.org/prl.

We use BioPAX level 2 to integrate Kegg, BioCyc and Reactome

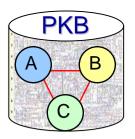
## Pathway Knowledge Base (PKB)

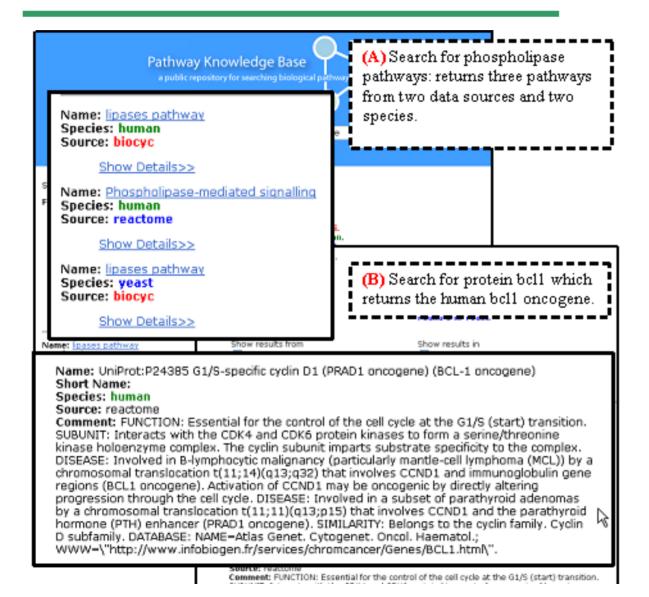


- Infrastructure to integrate pathway information from multiple sources into a central resource
  - BioPAX and Oracle RDF model
- Methods to query pathways in these databases
  - SQL/SPARQL
- A web interface that allows users and other programs to query and access these pathways
  - JSP/AJAX

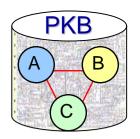


#### Search pathways across data sources and species





#### Visualize and navigate pathway results



Comment: FUNCTION: Essential for the control of the cell cycle at the G1/S (start) transition. SUBUNIT: Interacts with the CDK4 and CDK6 protein kinases to form a serine/threonine kinase holoenzyme complex. The cyclin subunit imparts substrate specificity to the complex. DISEASE: Involved in 8-lymphorytic malignancy (particularly mantle-cell lymphoma (MCL)) by a

- (C) Neighborhood search for pathways containing bcll returns five pathways
  - reactome Ubiquitin dependent degradation of Cyclin D1
  - reactome Cyclin D Cdk4 6 mediated phosphorylation of Rb and dissociation of Rb from the
  - reactome Formation of Cyclin D Cdk4 6 complexes
  - reactome Phosphorylation of Cyclin D Cdk4 6 complexes
  - reactome Translocation of Cyclin D Cdk4 6 complexes from the cytoplasm to the nucleus
- (D) Tree view of the reactions in the first pathway in the result

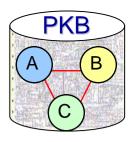
Ubiquitin-dependent degradation of Cyclin D1

Relocalization of nuclearly localized Cyclin D1 to the cytoplasm Proteasome mediated degradation of Cyclin D1

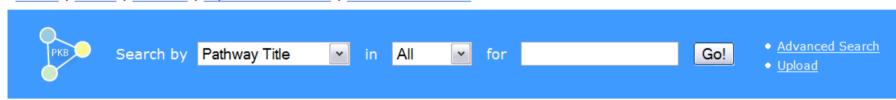
Ubiquitination of Cyclin D1

Phosphorylation of Cyclin D1 at T286 by glycogen synthase kir Relocalization of nuclearly localized phospho-(T286):cyclin D1:0

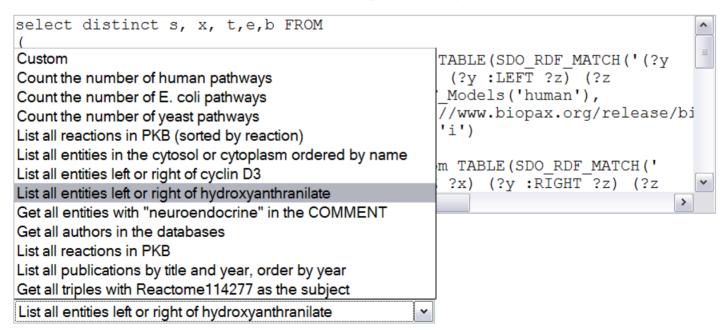


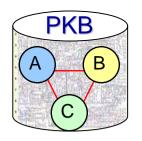


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Enter the query in the box below (omit the trailing semicolon):

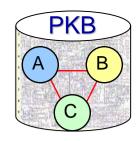




# Under the Hood...

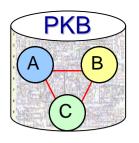
#### PKB Architecture **Pathway Viewer tools** Patika, Cytoscape **HTTP** etc. **Web Server Web Client Interface Search Pathway JSP BioPAX output PKB** SQL **BioPAX** files Reactome **BioPAX BioCyc Import Object RDF Objects JENA**



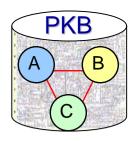


```
select distinct t.x.v FROM
   Each species has its own RDF model
se
                                                              e
:bi
nu
   Query across species via UNION ALL
ase
UN
sel
   Determine data source via URI:
   http://pkb.stanford.edu/biopax#biocyc_biochemicalReaction12408630 le
   1HUMANRecruitment of elongation factors to form HIV-1 elongation
   complex
UN
sel
   http://pkb.stanford.edu/biopax#reactome_Recruitment_of_elongation
:bi
    factors_to_form_HIV_1_elongation_complex
NUIT, JUD NUIT ATTAGES (JUD NUIT ATTAGE), TILLE // WWW.DIOPAX.OTG/TE/18
ase/biopax-level2.owl#')),null))
)ORDER BY x
```

## Adding new species and data sources

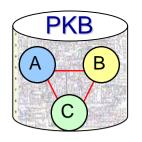


- Add new species
  - Create TABLE for storing rdf data
  - Create an RDF\_MODEL for that species
  - Insert data as N-Triples
- Add new data source
  - Obtain BioPAX pathway data
  - Convert BioPAX OWL files into the triples format using JENA
  - Update all unique identifiers to have a custom URI\* (<a href="http://pkb.stanford.edu/biopax#datasourcename">http://pkb.stanford.edu/biopax#datasourcename</a>)
  - Upgrade biopax identifiers from level 1 to level 2\*
  - Insert data into table



# **Evaluation**





#### Summary of data available in PKB

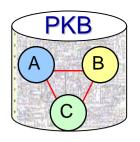
	Human	E. coli	Yeast	Total
# of pathways	1072	515	606	2193
# of reactions	3550	1966	1794	7310
# of triples	525148	367454	238877	1,131,479

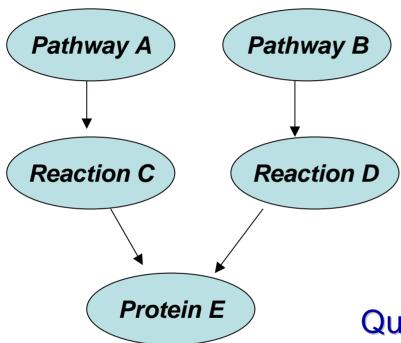
#### Example query times

Query	Time (s)
Search for pathway titles containing phospholipase	1.3
Find all proteins with bcl1 in their name or synonym	16.1
Find all pathways with protein bcl1	35.3
List all entities to the left or right of hydroxyanthranilate	39.7

Queries run on a Dell PowerEdge 2800 w/ 4 GB RAM and Oracle 10.2.0.2

# Certain queries are easier with relational structures





Directed Graph

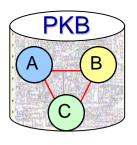
Pathway	Reaction Protein	
Α	С	Е
В	D	E

Relational Structure

Query:

Given protein E, find all pathways

## Pathway Knowledge Base



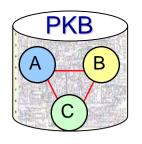
#### Benefits

- Centralized resource for querying pathway information across data sources and species
- Demonstrates use of BioPAX and RDF for exchange and integration of pathway data

#### Limitations

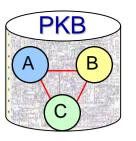
- Storing data only as RDF graph structures limits query performance
- Import requires manipulation of namespaces
- Querying options and methods are based on SPARQL but do not currently support all the features specified in SPARQL

## Next Steps in PKB?

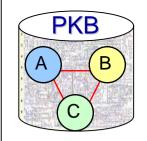


- Pathway differences between data sources
  - How does the galactose metabolism differ b/w ecocyc and reactome
- Pathway merging
  - Merge information from the same pathways from different data sources
- Pathway consistency checking
  - BioPAX rules for testing pathway models

#### Acknowledgements



- PKB Team
  - Kyle Bruck
  - William Lu
  - Nigam Shah
- Feedback
  - Daniel Rubin
  - Russ Altman
- Hosting
  - National Center for Biomedical Ontologies
- Funding Sources
  - Stanford Medical Informatics
  - National Library of Medicine
  - National Institute of Health



## Thanks. Any Questions?

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