## Building and Using Ontologies to do biology

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### **Ernest Rutherford**



"All science is either physics or stamp collecting"

Image: http://en.wikipedia.org/wiki/File:Ernest Rutherford2.jpg



### The Basics

- Unless you know what you've got, it is not analysis
  - Unless you share that knowledge about what you've got, then other people's data isn't much use either
  - If we can make our information more intelligent, then we can make more sophisticated analyses



### The Annotation Baseline

- Most uses of ontology is to supply a 'arry for annotation
  - "This is what my thing is", "This is what my thing does"
  - Get me all gene products labelled as being involved in "cell motility"
  - Also gets those gene products labelled with kinds of "cell motility"



## What happens when we've annotated everything?

- Reliable querying across resources
- Wherever one needs to know what something is...
- Knowing how to recognise an entity is the heart of ontology
- Computational recognition of entities
- Capturing some of human knowledge in computational form
- Ontological definitions are not just written in English (though they should be this as well)
- Write the definition in logical form for the computer to use...



## AmiGO on "Cell motility"

Go to cell motility involved in somitogenic axis Graph View Graph View Other Views Downloads Mappings

- GO:0008150 biological\_process [405310 gene products]
  - GO:0009987 cellular process [241906 gene products]
  - GO:0051179 localization [58312 gene products]
    - GO:0006928 cellular component movement [7621 gene products]
    - GO:0051674 localization of cell [5206 gene products]
    - GO:0040011 locomotion [9689 gene products]
      - ▼ GO:0048870 cell motility [5197 gene products]
        - GO:0070358 actin polymerization-dependent cell motility [17 gene products]
        - GO:0071976 cell gliding [0 gene products]
        - GO:0016477 cell migration [4292 gene products]
        - GO:0003411 cell motility involved in camera-type eye morphogenesis [0 gene products]
        - GO:0021814 cell motility involved in cerebral cortex radial glia guided migration [0 gene products]
        - GO:0090247 cell motility involved in somitogenic axis elongation [0 gene products]
        - GO:0021805 cell movement involved in somal translocation [0 gene products]
        - GO:0061334 cell rearrangement involved in Malpighian tubule morphogenesis [0 gene products]
        - GO:0071975 cell swimming [0 gene products]
        - GO:0001539 ciliary or flagellar motility [670 gene products]
        - GO:0060327 cytoplasmic actin-based contraction involved in cell motility [18 gene products]
        - GO:2000146 negative regulation of cell motility [497 gene products]
        - GO:2000147 positive regulation of cell motility [1050 gene products]
        - GO:2000145 regulation of cell motility [1829 gene products]
        - GO:0030317 sperm motility [165 gene products]
        - GO:0043107 type IV pilus-dependent motility [14 gene products]



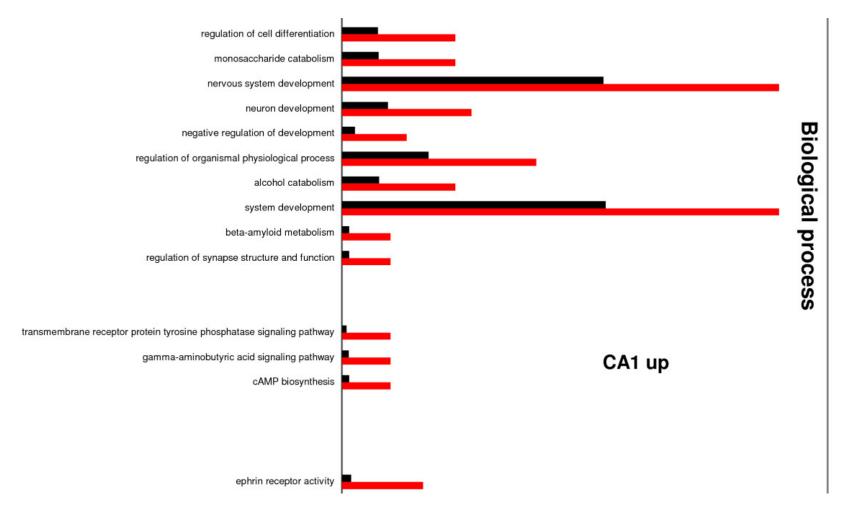
## UniversityManchester

Ras-related C3 botulinum toxin substrate 1

## Associations on "Cell motility"

6	the Gene Untology			AmiGC
		Search Browse BLAST Homolog Annotations Tools & Resou	urces Help	
		Search GO e terms _ genes or proteins _ exa	ct match Submit	
		cell motility		
		Term associations # Term information ◆ Term lineage ◆ External refer	ences *	
	Gene Product Associations to cell motility; GO:0048870 and ch	ildren		
l	Download all association information in:   gene association format  RDF-XML			
	Current filters  Species:  ▼ Filter associations displayed ②  Filter by Gene Product  Gene Product Type Data source  All Complex gene Agene Agene Product  gene product  Gene Product Type Data source  ASAP Geobaciflus stear Geobacter sulfurr Agene Geobacter sulfurr Geobact	View associations  @ All O Direct associations  Remove all filters		
Г	1 2 3 4 5 6 7 8 9 29 View all results			
	cell motility; GO:0048870 [show def] [view in tree]			
l	Symbol, full name	Information	Qualifier Evidence	Reference Assigned by
	ADAM17     Disintegrin and metalloproteinase domain-containing protein 17	visw associations protein from Homo saplens BLAST	ISS With UniProtKB:Q9Z0F8	PMID:10433800 BHF-UCL (via UniProtKB)
	DST Dystonin	view associations protein from Homo saplens BLAST	IMP	PMID:19403692 UniProtKB
	ENG Endoglin	view associations <b>protein</b> from <i>Homo saplens</i>	<u>IMP</u>	PMID:18223685 BHF-UCL (via UniProtKB)
	Protein C-ets-1	view associations <b>protein</b> from <i>Homo saplens</i>	<u>ІМР</u>	PMID:15247905 BHF-UCL (vla UniProtKB)
	FSCN1 Fascin	view associations <b>protein</b> from <i>Homo sapiens</i> BLAST	IDA	PMID:9571235 UniProtKB
	ITGB4 Integrin beta-4	view associations <b>protein</b> from <i>Homo saplens</i>	IMP	PMID:19403692 UniProtKB
	MAP2K1 Dual specificity mitogen-activated protein kinase kinase 1	view associations <b>protein</b> from <i>Homo saplens</i>	IEA With Ensembl:ENSMUSP0000005066	GO REF:0000019 Ensembl (via UniProtKB)
	RAC1	view associations protein from Homo saplens	IDA	PMID:19403692 UniProtKB

## Over expression analysis



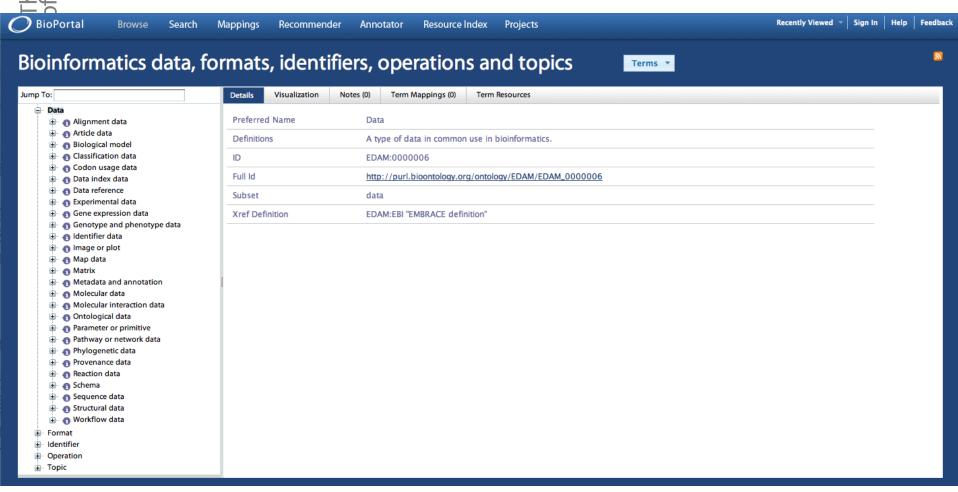
Newrzella et al. BMC Genomics 2007 **8**:370 doi 10.1186/1471-2164-8-370



## Annotating more than gene products

- Ontologies spreading from genotype to phenotype
- Ontologies for describing the experiments that produce data and the information they produce
- All comes down to knowing what we've got and being able to compare
- Semantic description of bioinformatics services

## MANCHESTER RACE Data and Methods Ontology (http:// edamontology.sf.net)





## Making Deductions

- "All french people like wine"

  's a Frenchman"

  - Thus we know "Pierre likes wine"
  - We've already seen the application of this in AmiGO
  - ..., but there's a whole lot more "reasoning"



### The GOAL User Interface

- http://owl.cs.manchester.ac.uk/goal;
- GWT application for building simple queries against Gene Ontology Annotations (GOA);
- Uses OWL API and uses HermiT reasoner;
- Simply browse and "add" classes to a conjunctive query;
- Write your own DL queries (can be dangerous...)



### The Gene Product Class

- Class: 'Gene product'
- SubClassOf:
- has\_function some 'molecular function',
- participates\_in some 'biological process',
- located\_in some 'cellular component'



## Two Mouse Gene Products as Primitive OWL classes

Class: Frem1

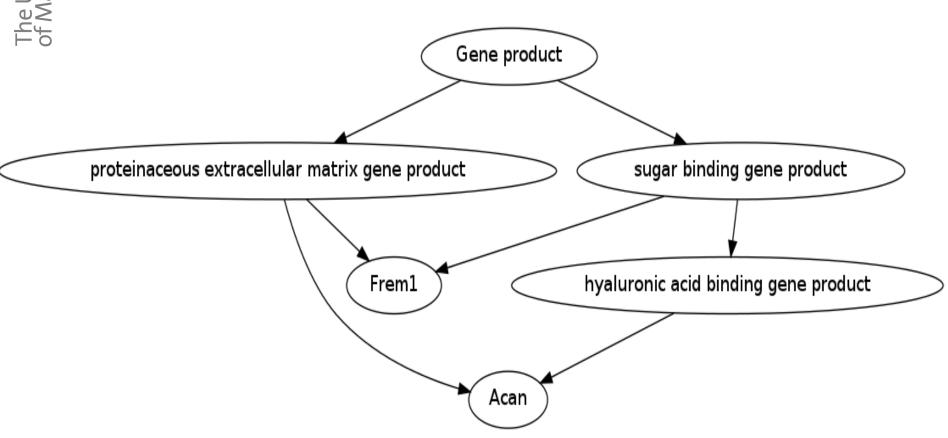
- SubClassOf:
- has function some 'sugar binding',
- participates\_in some 'cell adhesion',
- located\_in some 'proteinaceous extracellular matrix',
- located in some 'extracellular region'
- Class: Acan
- SubClassOf:
- has\_function some 'hyaluronic acid binding',
- participates\_in some 'collagen fibril organization',
- located\_in some 'proteinaceous extracellular matrix'



### Two Defined Classes

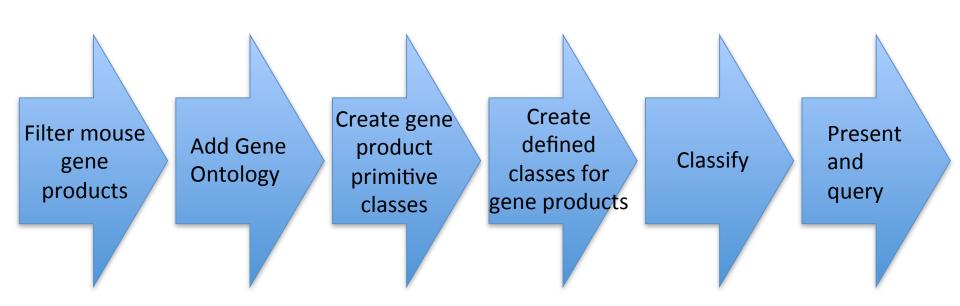
- The University of Manchester Class: 'proteinaceous extracellular matrix gene product'
  - EquivalentTo:
  - 'Gene product' and located in some 'proteinaceous extracellular matrix'
  - Class: 'sugar binding gene product'
  - EquivalentTo:
  - 'Gene product' and has function some 'sugar binding'

## The Resulting Hierarchy





### Workflow





### Basic GOAL interface

# The University of Manchester

Logical Gene Ontology Annotations

This simple application demonstrates how we can exploit OWL semantics to query over Gene Ontology annotations. This application currently covers only a subset of the mouse uniprot proteins.

You can download all the ontologies from here, they are best veiwed in Protege 4.1 and can be classified on a desktop machine with HermiT in around 5 minutes.

### **Gene Product Ontology Browser**

Use ctr/cmd key to select multiple terms

### **▼** GeneProduct

- cellular\_component gene product
- biological\_process gene product
- molecular function gene product

### **Class Description**

### **Enter DL Query**

This query is evaluated and returns all decending classes that are uniprot proteins. Any inferred gene product classes are removed from the results table

## GOAL query

### **Gene Product Ontology Browser** Use ctr/cmd key to select multiple terms **▼** GeneProduct ▼ cellular\_component gene product cell part gene product ► synapse part gene product extracellular region gene product ▶ virion part gene product ▼ organelle part gene product ▶ intracellular organelle part gene product ▶ plasma membrane-derived photosystem I gene product organellar ribosome gene product ► contractile fiber part gene product In flagellum part gene product ▶ plasma membrane-derived thylakoid photosystem II gene product axoneme part gene product

Class: flagellum part gene pr	roduct	
Super class description: 'co	ell projection part gene product'	
'intracellular part gene produc	ct'	Add to
'organelle part gene product'		query
	on: 'GeneProduct and (located_in some flagellum	
part)'		
Enter DL Query		
Enter DL Query		
	eturns all decending classes that are uniprot protein	s. Any inferred
This query is evaluated and r		s. Any inferred
This query is evaluated and regene product classes are rem	noved from the results table	s. Any inferred
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This query is evaluated and regene product classes are rem 'flagellum part gene pro	noved from the results table	s. Any inferred
This query is evaluated and regene product classes are rem	noved from the results table	s. Any inferred

### **GOAL** results

'microtubule-based flagellum part gene product'

'flagellum part gene product' product organellar ribosome gene product contractile fiber part gene product DL Query In flagellum part gene product Gene Results Table plasma membrane-derived thylakoid photosystem II gene product Protein Super Classes axoneme part gene product ID 'regulation of mRNA stability gene product' organelle membrane gene product 'GeneProduct and (located\_in some acrosomal vesicle)' plasma membrane-derived thylakoid membrane 'acrosomal vesicle gene product' gene product 'microtubule-based flagellum part gene product' 'MouseGeneProduct' plasma membrane-derived thylakoid ribulose 'elevation of cytosolic calcium ion concentration gene product' bisphosphate carboxylase complex gene 'activation of adenylate cyclase activity by G-protein signaling pathway gene product product' 'calcitonin receptor activity gene product' stereocilium membrane gene product Calcr 'GeneProduct and (participates in some elevation of cytosolic calcium ion symbiont-containing vacuolar space gene concentration)' 'osteoclast differentiation gene product' product 'GeneProduct and (participates in some regulation of mRNA stability)' organelle lumen gene product GeneProduct and (located\_in some microtubule-based flagellum part) 'GeneProduct and (molecular\_function some calcitonin receptor activity)' organelle membrane contact site gene product 'GeneProduct and (participates\_in some activation of adenylate cyclase activity by G-protein signaling pathway)' kinocilium gene product 'GeneProduct and (participates\_in some osteoclast differentiation)' stereocilium gene product 'GeneProduct and (located in some microtubule-based flagellum part)' 'peptidyl-serine phosphorylation gene product' axoneme gene product 'GeneProduct and (participates in some peptidyl-serine phosphorylation)' extracellular region part gene product 'GeneProduct and (molecular function some calcium ion binding)' Fscb

## More complex GOAL query

response to stimulus gene product establishment of localization gene product death gene product pigmentation gene product reproductive process gene product phosphorus utilization gene product nitrogen utilization gene product locomotion gene product sugar utilization gene product developmental process gene product multicellular organismal process gene product reproduction gene product cell killing gene product cellular component organization or biogenesis gene product viral reproduction gene product sulfur utilization gene product rhythmic process gene product biological regulation gene product growth gene product

cell proliferation gene product

This query is evaluated and returns all decending classes that are uniprot proteins. Any inferred gene product classes are removed from the results table 'flagellum part gene product' and 'biological regulation gene product' DL Query Gene Results Table Protein Super Classes ID 'regulation of mRNA stability gene product' 'GeneProduct and (located in some acrosomal vesicle)' 'acrosomal vesicle gene product' 'microtubule-based flagellum part gene product' 'MouseGeneProduct' 'elevation of cytosolic calcium ion concentration gene product' 'activation of adenylate cyclase activity by G-protein signaling pathway gene product' 'calcitonin receptor activity gene product' Calcr 'GeneProduct and (participates in some elevation of cytosolic calcium ion concentration)' 'osteoclast differentiation gene product' 'GeneProduct and (participates in some regulation of mRNA stability)' 'GeneProduct and (located in some microtubule-based flagellum part)' 'GeneProduct and (molecular function some calcitonin receptor activity)' 'GeneProduct and (participates in some activation of adenylate cyclase activity by G-protein signaling pathway)' 'GeneProduct and (participates in some osteoclast differentiation)'



## What does an OWL ontology look like?

```
Annotations: [in flower]
  label "Ranunculus Repens",
  comment "Common buttercup"^^string
SubClassOf: [in flower]
  * ActinomorphicFlower,
  * 'Apopetalous Flower',
  * 'Aposepalous Flower',
  * 'Heterosporangiate Flower',
  and (hasFlowerSymmetry some 'Radial Flower Symmetry')
  and (hasPart some
    (Androecium
     and (hasAndroecialFusion some Apostemonous)
     and (hasPart some
       (Stamen
       and (hasPart some Filament)
       and (hasPart some
         and (hasAntherAttachment some 'Adnate Anther Attachment')
         and (hasDehiscenceType some 'Longitudinal Dehiscence')))))))
  and (hasPart some
    (Gvnoecium
     and (hasGynoecialFusion some Apocarpous)
     and (hasPart some
       (Pistil
       and (hasPart some Carpel)
       and (hasPart some Style)
       and (hasPart some
         (Stigma
         and (hasStickiness some Stickiness)
         and (hasStigmaShape some 'Hooked Stigma Shape')))
       and (hasPart only
         (Carpel
         or Stigma
         or Style))))
     and (hasSexualPartArrangement some 'Spiral Arrangement')))
```



## Actinomorphic Flower

Class: 'Actinomorphic flower'

Annotations: label "Actinomorphic flower"

EquivalentTo: [in flower]

\* 'Actinomorphic flower',

Flower

and (hasFlowerSymmetry some 'Radial Flower Symmetry')



## Who knows about biology?

- Biologists know about biology;

  \*\*\* a biologist into a signature of the art. Easier to turn a biologist into an ontologist, rather than a CS person to an ontologists then a biologist
  - Do we need to craft axioms to deliver domain knowledge to an ontology?



## Can biologists write OWL?

- Yes, but why should they?
  - Once we have the ontology design patterns, domain experts can fill them in
  - Spreadsheets often used tablulation of relationships between entities;
  - Map contents of spreadsheets to the underlying ontology's axioms

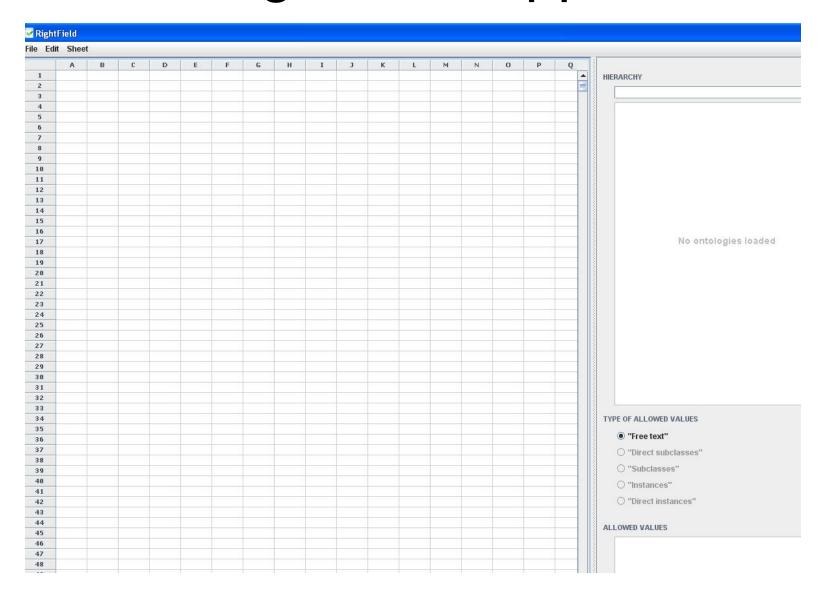


## How can we enable biologists to semantically describe data?

- Scientists like using spreadsheets (and for good reasons)
- Put the data into spreadsheets and suck it out into ontologies
- Constrain the descriptions in the spreasheet to conform to a particular description style
- Semantic Spreadsheets RightField ( http://www.rightfield.org) and Populous (http://www.populous.org)



## RightField Application





## The User View

	B12 ▼ ( f <sub>x</sub>	QualityControlDescriptionType					
	A	В	С		D	Е	F
1	# Use this template for 3' or whole G	ene expression studies w	hen summa	rization	probe set data will	be provided in Ma	trix table format
2							
3							
4	Series		ı				
5	# This section describes the overall of	cperiment		On	tology terms f		
6	title				cells in drop-o		
7	Summary			чР	cens in drop (	JOWII DOXES	
8	Overall Design description						
9	Experiment Class (assay Type)	methylation_profiling					
10	Experiment Design type	ExperimentDesignType					
11	Technology type	microarray	_				
	quality control type	QualityControlDescription	▼ /pe				
	contributer (person or SEEK ID)	biological_replicate					
14	project	dye_swap_quality_control peer_review_quality_control					
15		real_time_PCR_quality_contr	ol				
16	•	reverse_transcription_PCR_c					
17	# The Sample names in the first colu	spike_quality_control technical_replicate	ist match	the co	lumn headers of the	Matrix table (see	next worksheet).
	#To find the Affymetrix platform acce	-		://www.	ncbi.nlm.nih.gov/pr		
19	•	title	CEL file		source name	organism	characteristics: Strain
20						organism	
21	SAMPLE 2					organism	
22	SAMPLE 3					organism	
	SAMPLE 4					organism	
24	SAMPLE 5					organism	
25						organism	
	SAMPLE 7					organism	
	SAMPLE 8					organism	
	SAMPLE 9					organism	
	SAMPLE X					organism	
30	I					I	



# What can reasoning do for me?



## Kidney and Urinary Knowledge Base and Ontology



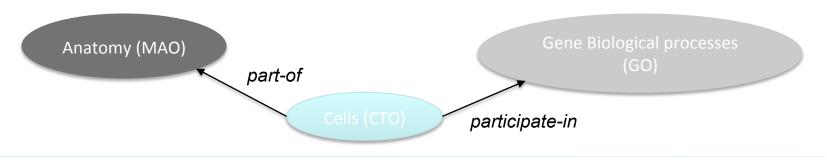


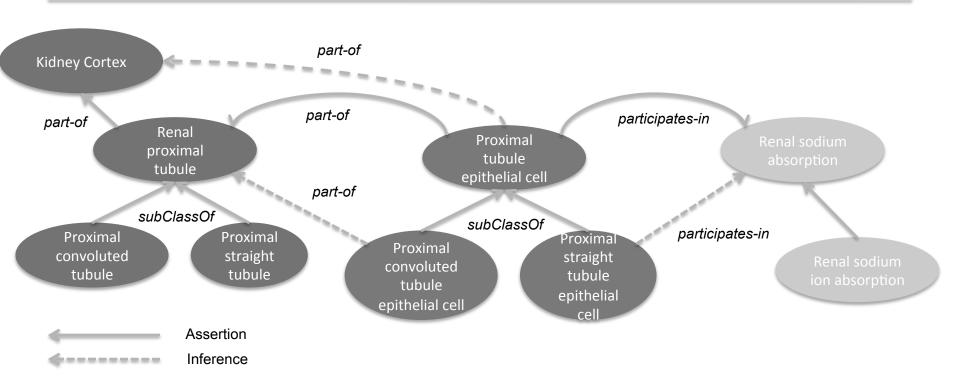


- Specialised repository of KUP related data
- KUP ontology for integration, query and inference
- Background knowledge for data mining experiments
- Collaborative update by the community

## KUPKB: KUP ontology

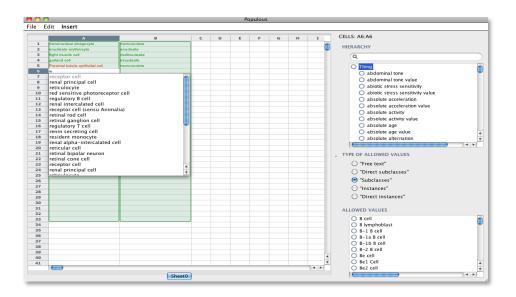
Each kidney cell is currently described by its localisation and function







## Populous



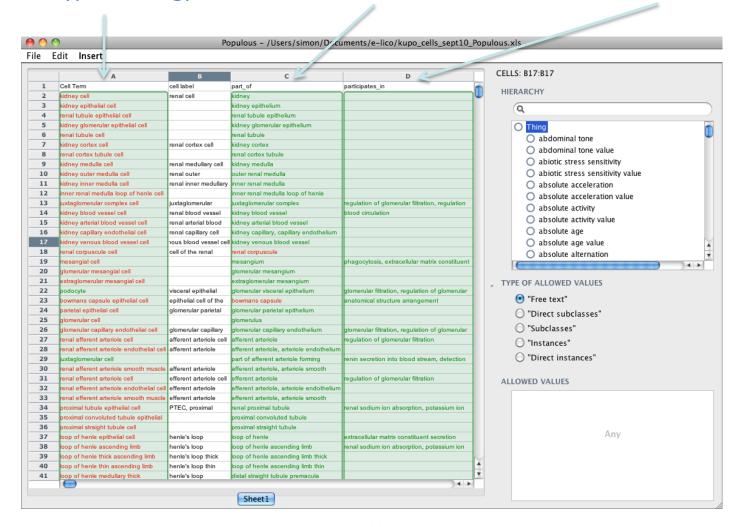
http://www.e-lico.eu/populous

- Generic tool for populating ontology templates
- Spreadsheet style interface
- Supports validation at the point of data entry
- Expressive pattern language for OWL Ontology generation

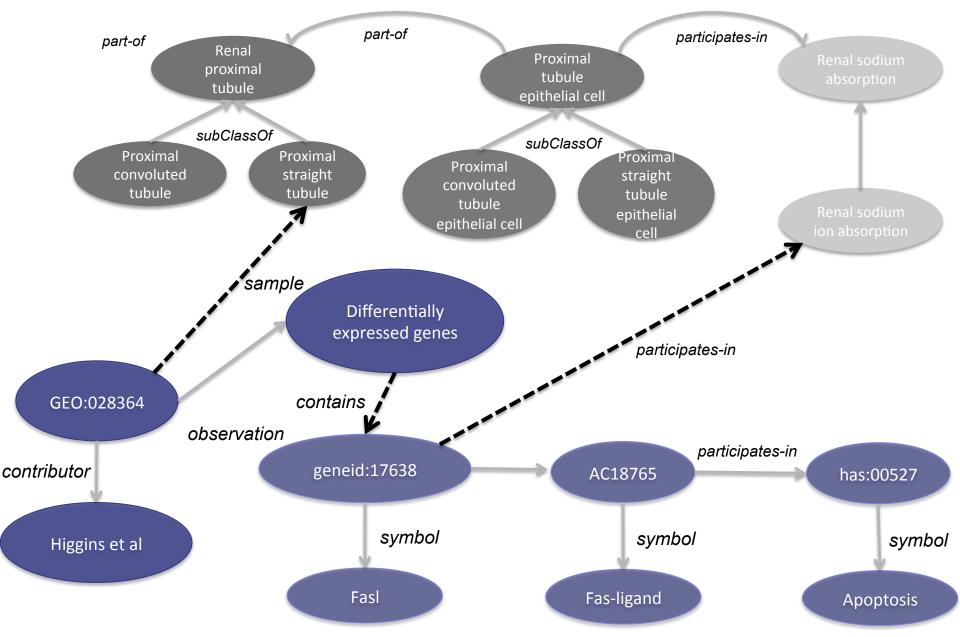


## KUPO cells in Populous

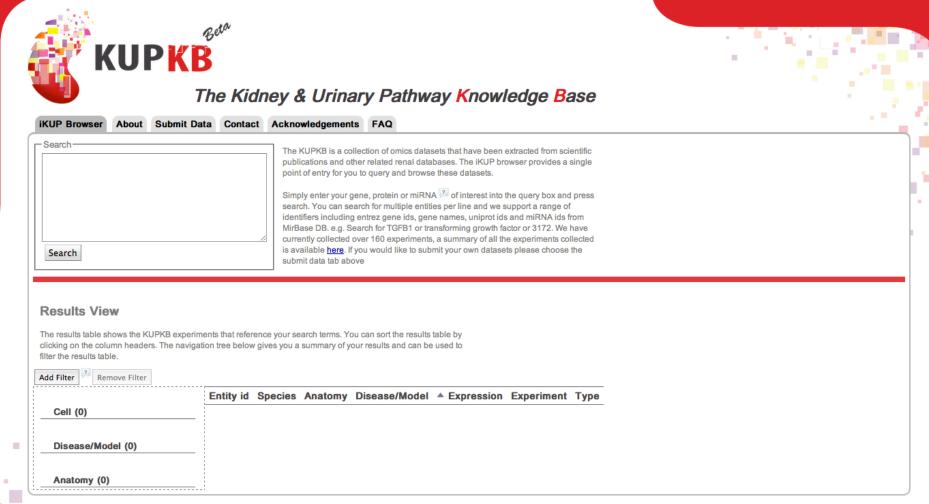
Cell type Ontology Mouse anatomy Ontology Biological Process (GO)



## Connecting the graphs



## www.kupkb.org



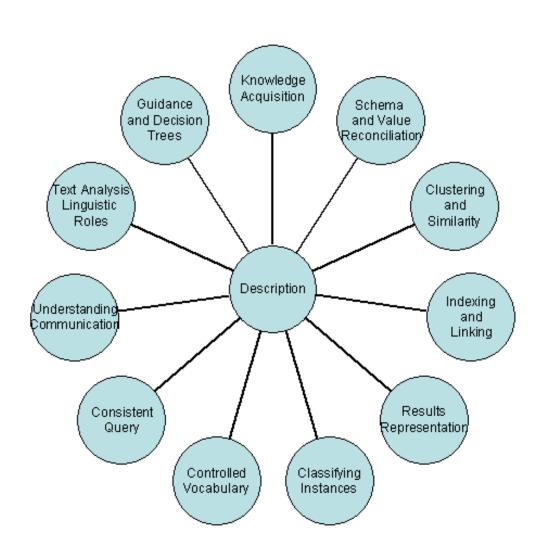
## iKUP search results

▼ Cell (1)	Entity id	Species	Anatomy	Disease/Model	Expression	Experiment	▲ Type
Somatic cell (1)	Tgfb1	Rat (mature)	Distal straight tubule premacula segment	Healthy	Absent	Yu, GSE13672	mRNA
► Epithelial cell (1)  ► Barrier cell (1)	Tgfb1	Rat (mature)	Renal proximal tubule	Healthy	Absent	Yu, GSE13672	mRNA
<ul><li>Kidney cell (1)</li><li>Secretory cell (1)</li></ul>	Tgfb1	Rat (neonatal)	Kidney	Polycystic kidney disease model	Unmodified	Koupepidou, BMC Nephrol, 2010	mRNA
► Contractile cell (1)  ► Motile cell (1)	Tgfb1	Rat (juvenile)	Kidney	Polycystic kidney disease model	Up	Koupepidou, BMC Nephrol, 2010	mRNA
► Stem cell (1)  ► Defensive cell (1)	Tgfb1	Rat (neonatal)	Kidney	Polycystic kidney disease model	Unmodified	Koupepidou, BMC Nephrol, 2010	mRNA
► Leucocyte (1)  CL_0000461 (1)	Tgfb1	Rat (mature)	Kidney cortex	Thy-1 nephritis rat model	Up	Sadlier, Kidney Int, 2005	mRNA
► Lower urinary tract cell (1)  ► Electrically active cell (1)	Tgfb1	Rat (mature)	Kidney	Interstitial fibrosis and tubular atrophy model	Up	von Toerne, Am J Transplant, 2009	mRNA
▼ Anatomy (3)	Tgfb1	Rat (mature)	Kidney	Interstitial fibrosis and tubular atrophy model	Up	von Toerne, Am J Transplant, 2009	mRNA
► Kidney (3)  ► Pelvis (1)	Tgfb1	Rat (mature)	Kidney	Interstitial fibrosis and tubular atrophy model	Up	von Toerne, Am J Transplant, 2009	mRNA
Lower urinary tract (1)	TGFB1	Human	Kidney	Acute renal allograft rejection	Down	Head, GSE1563	mRNA
▼ Disease/Model (2)  ► Animal model (1)	TGFB1	Human	Kidney	diabetic nephropathy (severe)	Up	Rooney, FEBS Lett, 2011	mRNA
► Urinarv system disease (1)		Human					

## Doing some Biology

- With the iKUP interface biologists find things to test
- These facts already existed, but difficult to find
- Easy to find if you know to look
- Integration and presentation allows one to see things you weren't looking for....

## Uses of Ontology in Bioinformatics



## Is all this doing biology?

- Ontologies enable biology;
- Ontological machinery can be used to "find new things";
- Most often through a level of indirection to a real biologist
- Enabling things to be found more easily, enables hypothesis generation to be easier
- Unforeseen connections enabled through common language and common definition
- "I see these genes differentially regulated across a range of diseases"
- Can only be asked or found through common language and common description
- Can automate the application of knowledge through deduction, but need a whole lot more...

## Acknowledgements

- Simon Jupp, Julie Klein and Joost Schanstra for KUPKB
- Carole Goble and Simon Jupp for slides
- Katy Wolstencroft, Stuart Owen, Matt Horridge for RightField
- Simon Jupp for Populous
- ... and the rest of the legion