Big data are not a substitute for, but a supplement to traditional data collection and analysis.

The Parable of Google Flu Lazer et al. 2014. *Science* 343 (6176): 1203-1205





Community-Driven Genome Curation: Harnessing the Power of the Crowd

Monica Munoz-Torres, PhD | @monimunozto

Phoenix Bioinformatics Formerly at Berkeley Bioinformatics Open-Source Projects, Berkeley Lab

Bioinformatics Workshop, CSHL | 29 November, 2017



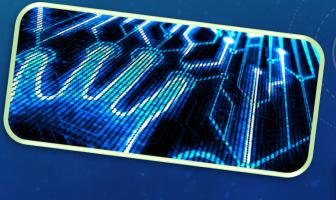
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U.S. DEPARTMENT OF

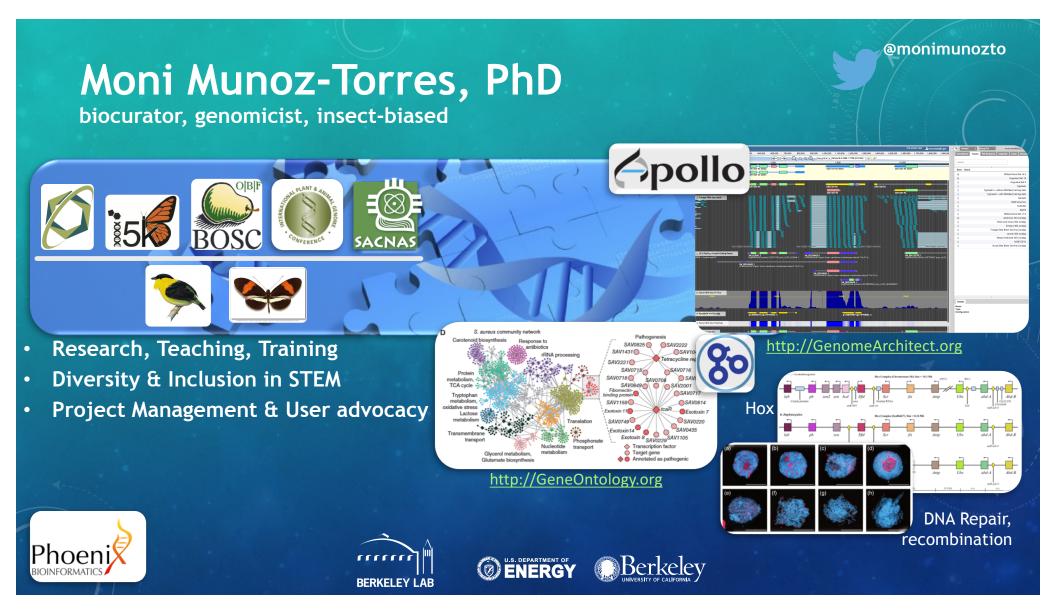
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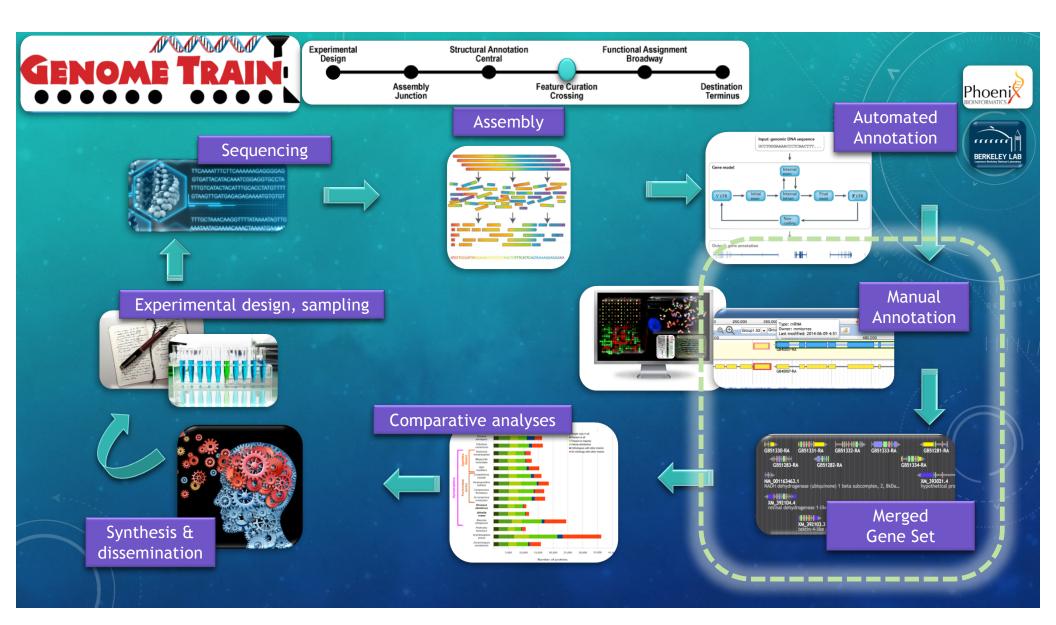
Today...

Collaborative approaches to improving genomic resources using software tools that facilitate the curation process.









Extracting Knowledge from Data



NIH [seeks] <u>fundamental knowledge about the</u> <u>nature and behavior of living systems</u> and the application of that knowledge to enhance health, lengthen life, and reduce illness and disability.

U.S. National Institutes of Health



Good health makes life better. We want to improve health for everyone by helping great ideas to thrive. Science and research <u>expand knowledge</u> by testing and investigating ideas.

Wellcome Trust



"

[The NSF aims to] promote and disseminate research, <u>creating knowledge that is valuable to</u> <u>society</u>, the economy, and politics.

Swiss National Science Foundation



Good data are required

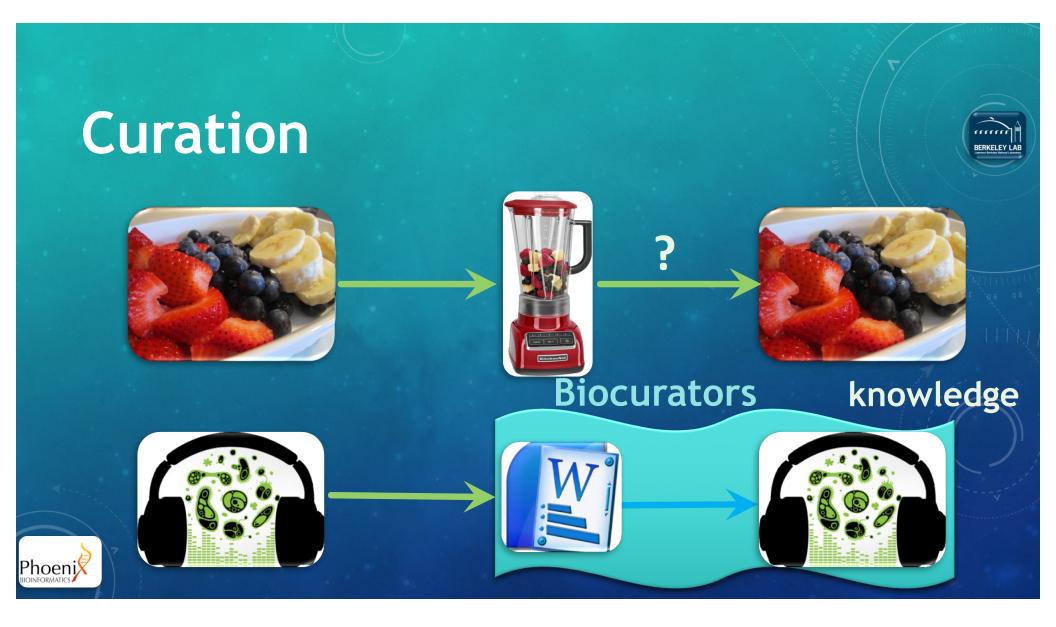
- Data must be infinitely shareable.
- Data reuse increases their value.
- The more data are reused, the more data they generate.
- Data are perishable.
- Combining data sets increases the value of individual data sets.
- The more accurate the information is, the more useful (and valuable!) it is.
- More data are not necessarily better.







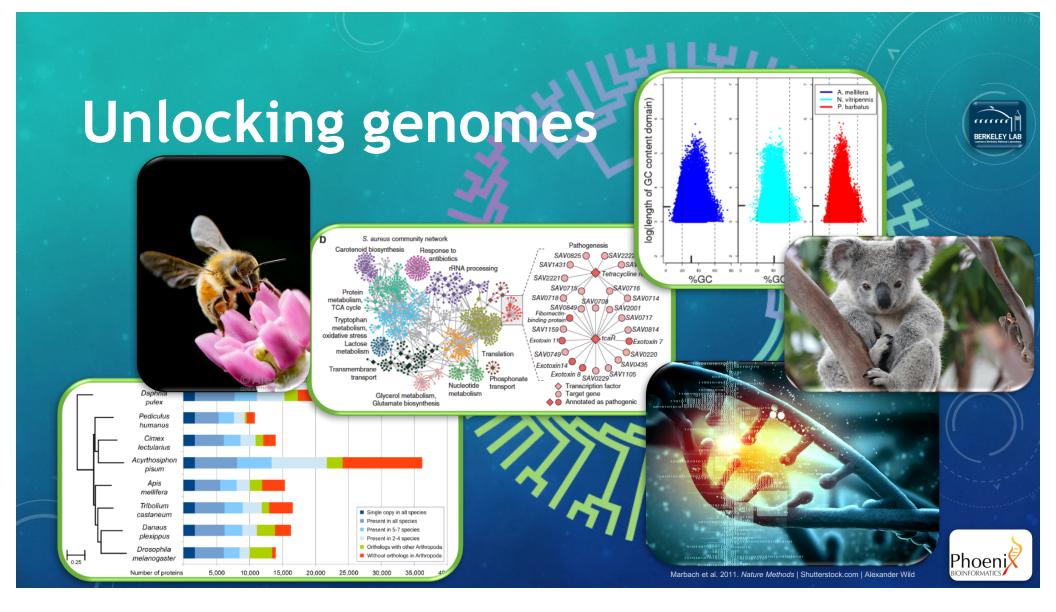






Genome Curation





Good genes are required!

1. Generate gene models

• A few rounds of gene prediction.

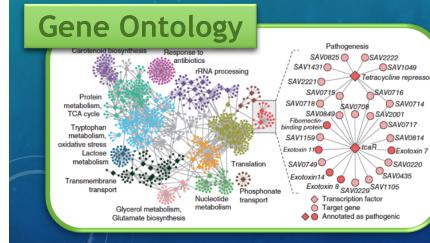
2. Annotate gene models

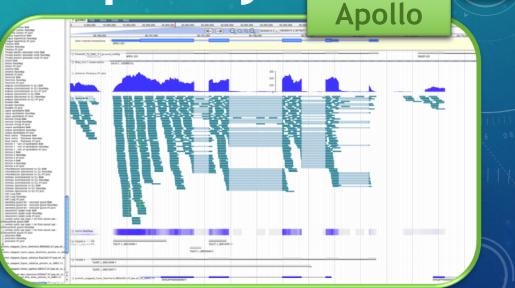
- Function, expression patterns, metabolic network memberships.
- 3. Manually review them• Structure & Function.

<image>

Curation improves quality

Best representation of biology & removal of elements reflecting errors in automated analyses.





Functional assignments through comparative analysis using literature, databases, and experimental data.



Curation is valuable

- To make accurate orthology assessments
- To accurately annotate expanded / contracted gene families
- To identify novel genes, species-specific isoforms
- To efficiently take advantage of transcriptomic analyses



Curation is inherently collaborative

re

 It is impossible for a single individual to curate an entire genome with precise biological fidelity.

 Curators need second opinions and insights from colleagues with domain and gene family expertise.

Predicting & annotating gene structures



Gene Prediction & Gene Annotation

Identification and annotation of genomic elements:

- Primarily focuses on protein-coding genes.
- Also identifies RNAs (tRNA, rRNA, long and small non-coding RNAs (ncRNA)), regulatory motifs, repetitive elements, etc.
- Happens in 2 steps:
 - Computation phase
 - Annotation phase

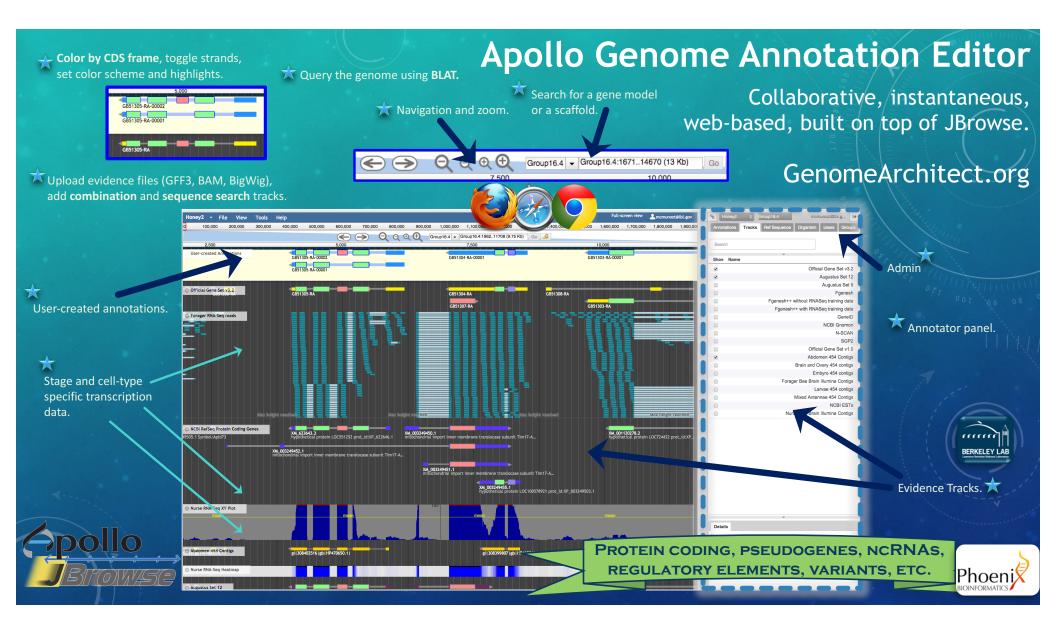


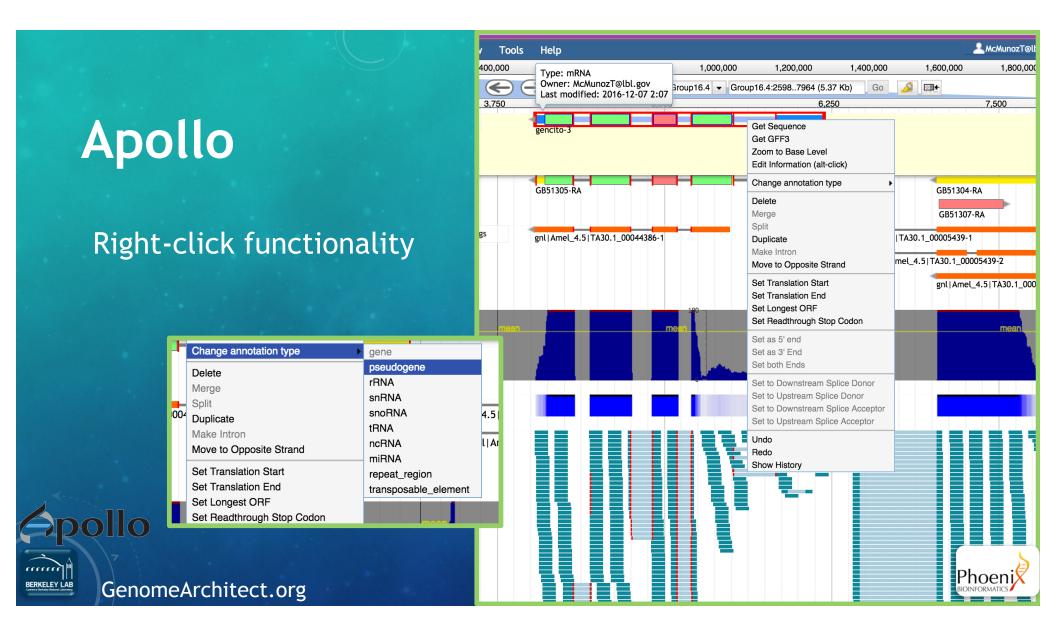




Collaboratively curating gene structures







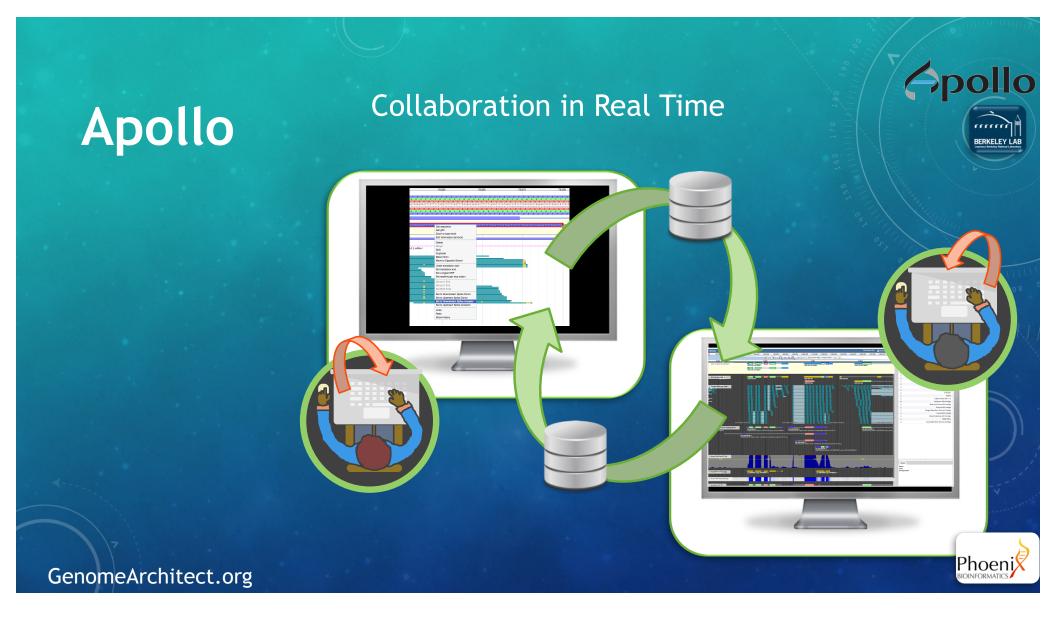
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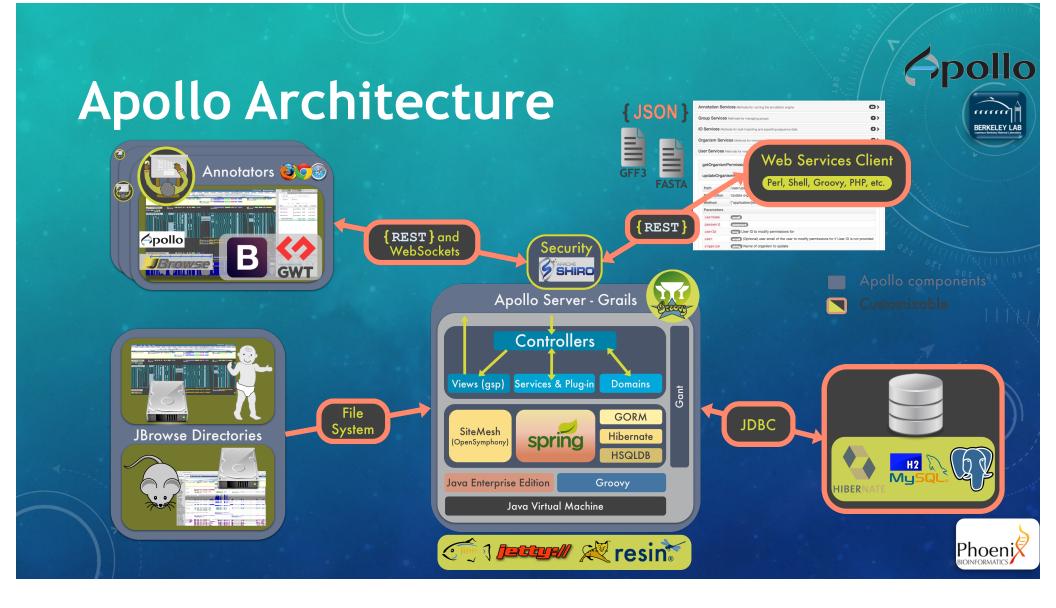
Export

GenomeArchitect.org

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Apollo BERKELEY LAB

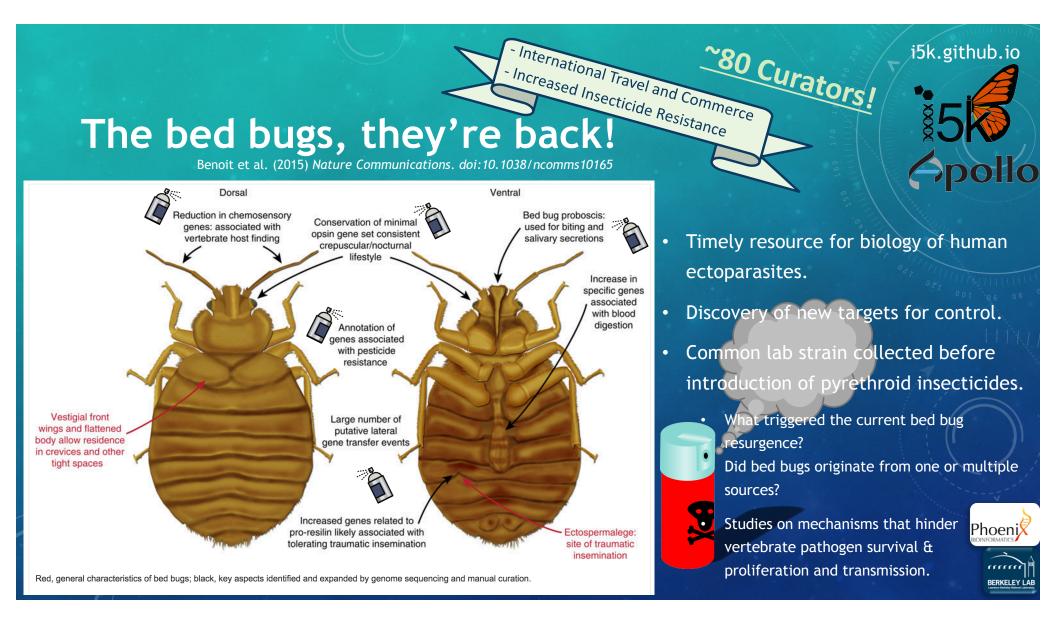




• Transformative, broad, & inclusive initiative to organize sequencing and analysis of 5,000 arthropod genomes.

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- WORLDWIDE AGRICULTURE
- FOOD SAFETY
- MEDICINE
- ENERGY PRODUCTION
- MODELS IN BIOLOGY
- MOST ECOSYSTEMS
- EVERY BRANCH OF THE PHYLOGENY



Annotating gene functions

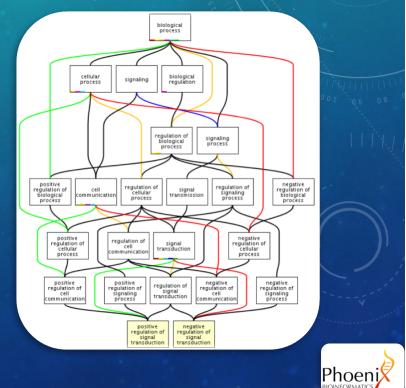


Background in Ontologies

- Terms (classes) arranged in a graph
 - Entities such as genes annotated to terms

Examples

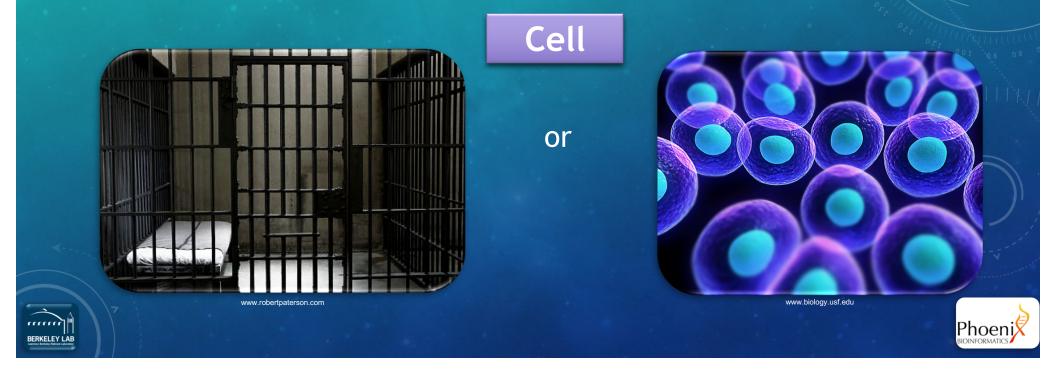
- GO
- PO
- TO
- CHEBI





Language inconsistencies in biology

The same name for two different concepts



Language inconsistencies in biology

Two or more different names for the same concept

Eggplant

Aubergine

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Melongene

Brinjal

The same is true for biological concepts:

This makes comparisons difficult, specially when comparing across species or databases.

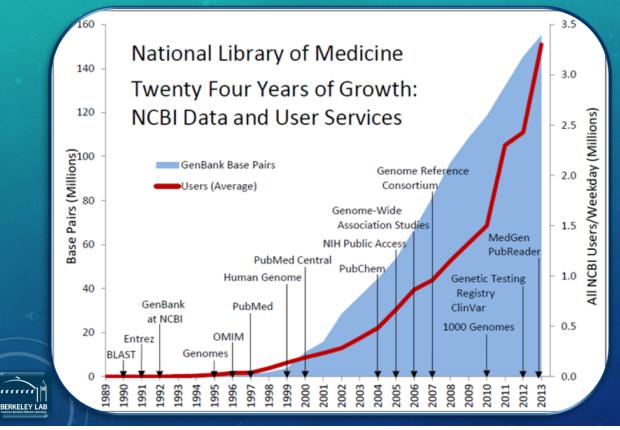


Growing number of available biological data

	NCBI Resources	☑ How To ☑ Results by year	
	Publiced.gov US National Library of Medicine National Institutes of Health	PubMed Image: dna repair Create RSS Create alert Advanced	
	Article types Clinical Trial Review Customize	Summary - 20 per page - Sort by Most Recent - Search results	111
	Text availability Abstract Free full text Full text PubMed	Items: 1 to 20 of 81894 < First < Prev Page 1 of 4095 Next > Last >> CITED2 silencing sensitizes cancer cells to cisplatin by inhibiting p53 trans-activation and chromatin relaxation on the ERCC1 DNA repair gene. Liu YC, Chang PY, Chao CC. leic Acids Res. 2015 Sep 17. pii: gkv934. [Epub ahead of print]	
Related so dna repair		26384430 r articles	
cancer dna		http://www.ncbi.nlm.nih.gov/pubmed/	
dna repair			
	mechanisms		
mitochondr	ial dna repair	Phoe	ni



Growing number of available biological data <u>still to come</u>



Information expansion in base pairs

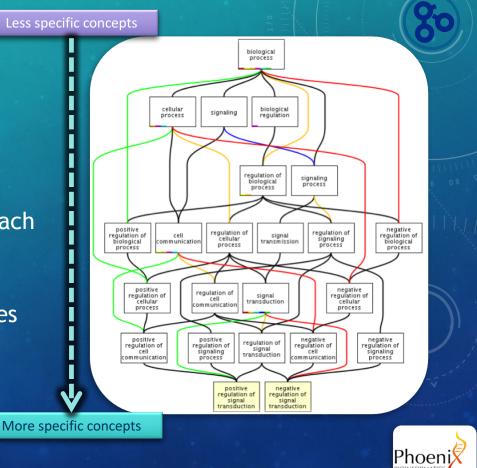


Gene Ontology

• A way to capture biological knowledge for individual gene products in written and computable form.

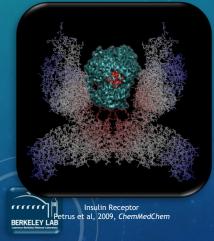
• A set of concepts, and the relationships to each other, arranged as a (non-linear) hierarchy.

• Gene Ontology Consortium (GOC): generates and maintains software and databases used to assign function to genes of interest with GO.





<section-header><text><text><text>



1. Molecular Function

An elemental activity or task or job

- protein kinase activity
- insulin receptor activity

3. Cellular Component

Where a gene product is located

- mitochondria
- mitochondrial matrix
- mitochondrial inner membrane

Mitochondrion. PaisekaScience Photo Library



A GO Annotation is:

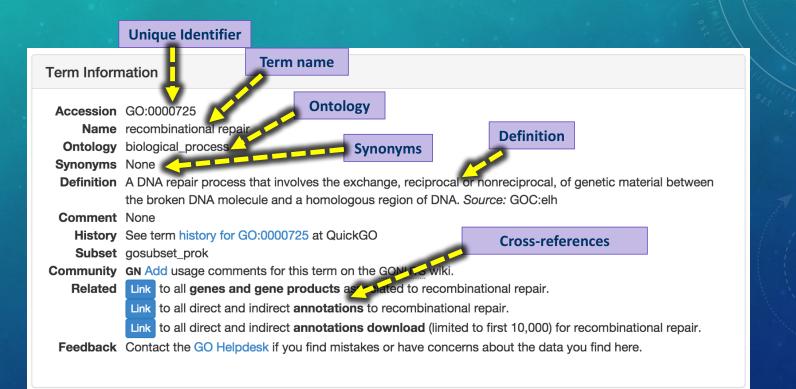
... a statement that a gene product:

- 1. has a particular molecular function or is involved in a particular biological process or is located within a certain cellular component
- 2. as determined by a particular method
- 3. as described in a particular reference

🔲 Gene/produ	ct Gene/product Qual	Direct ifier annotation	Annotation extension	Assigned by	Taxon	Evidence	Evidence with	PANTHER family	Isoform	Reference	Date
P02879	Ricin	protein binding		ParkinsonsUK- UCL	Ricinus communis	IPI	UniProtKB:Q8BJT9			PMID:24200403	20150609
P02879	Ricin	protein bindin GC	0:0005515 (e otein binding		details pag	le for	UniProtKB:Q925U4	80	AmiGO 2	PMID:24200403	20150609
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Anatomy of a GO term:

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Ontology structure

- Directed acyclic graph
- A term can have more than one 'parent' A term can have more than one 'child'

• Terms are linked by relationships

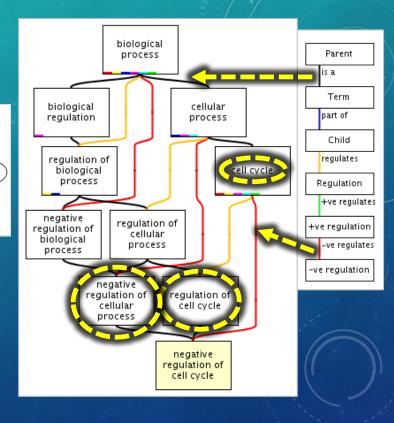
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regulates(& +/-)
has_part
occurs_in

These relationships allow for complex analysis of large datasets

10

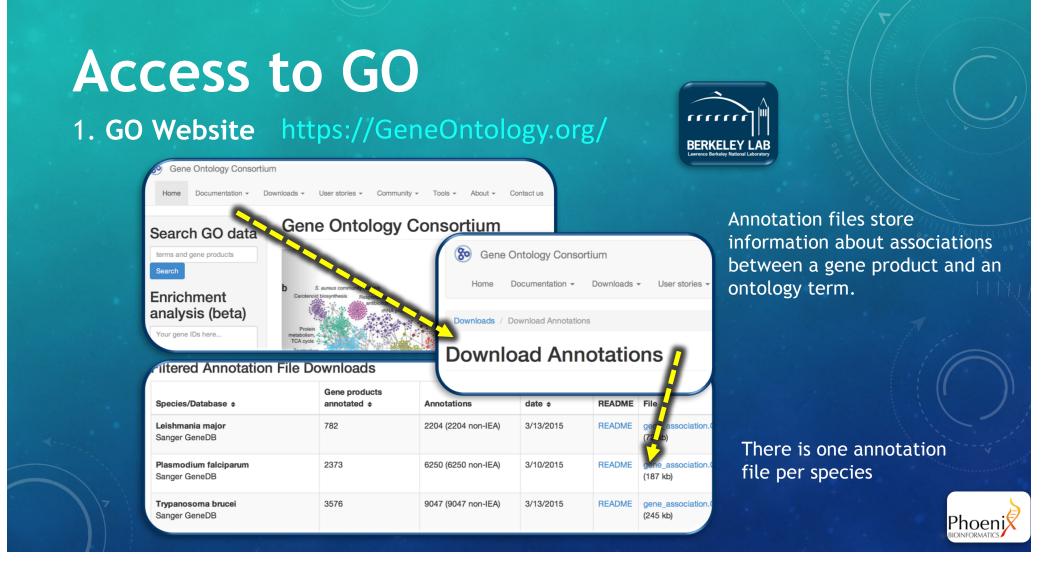
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11



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Access to GO

2. UniProt-GOA

UniProt-G<u>OA</u>

Overview New to UniProt-GOA FAQ Contact Us

Gene Ontology Annotation (UniProt-GOA) Database

The UniProt GO annotation program aims to provide high-quality Gene Ontology (GO) annotations to proteins in the UniProt Knowledgebase (UuiProtKB). The assignment of GO terms to UniProt records is an integral part of <u>UniProt</u> biocuration. UniProt manual and electronic GO annotations are supplemented with manual annotations supplied external collaborating GO Consortium groups, to ensure a comprehensive GO annotation dataset is supplied to

http://www.ebi.ac.uk/GOA

4. Ensembl

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BLAST Align Retrieve/10 mapping The mission of United is to previde the scientific community with a c

UniPro



http://www.uniprot.org/uniprot/

5. NCBI Gene

3. UniProtKB



http://www.ncbi.nlm.nih.gov/gene/

GO Browsers

http://amigo.geneontology.org/

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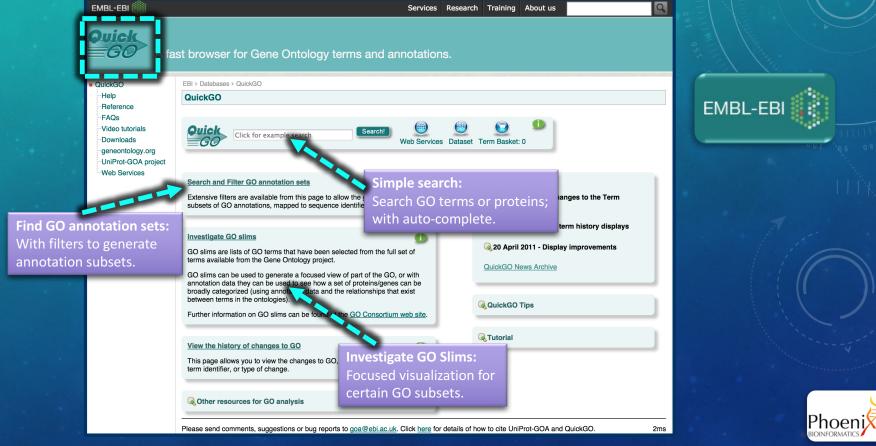
AmiGO 2 Home Search - Tools & Resources Help Feedback About AmiGO 1.8 AmiGO 2 Quick search **Grebe**: assisting interface for **GOOSE**: interrogate Search AmiGO2 with 'fill in the blank'. the GO database using Simple search: with SQL. auto-complete. Get Started with Greb Advanced Search GOOSE Use the Grebe Search Wizard to get started in exploring the Interactively search the Gene Ontology data for annotations, Use GOOSE to query a legacy GO database with SQL or edit Gene Ontology data. gene products, and terms using a powerful search syntax and one of the templates filters. Search -**Term Enrichment Service** Statistics And Much More... X **Term Enrichment** 1.1.1 Service. View the most recent statistics about the Gene Ontology data Many more tools are available from the software list, such as Your genes here .. on the main site. alternate searching modes, Visualize, non-JavaScript pages. Powered by PANTHER biological process H. sapiens Submit Phoeni Powered by PANTHER

GO Browsers

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http://www.ebi.ac.uk/QuickGO/



Functional Annotation

Attaching metadata to structural annotations for the purpose of assigning a particular function.

- Assignments do not necessarily have to be supported by your own experimental data.
- Sequence similarity approaches must be informed and validated by evolutionary theory, not just a score value.





Functional Annotation

Assembly:

- Genome
- Transcriptome

Predicted DNA / Protein Sequences

Compare against databases

Examples:

- InterProScan
- PANTHER Term Enrichment Tool
- JAMp

Relying solely on sequence similarity

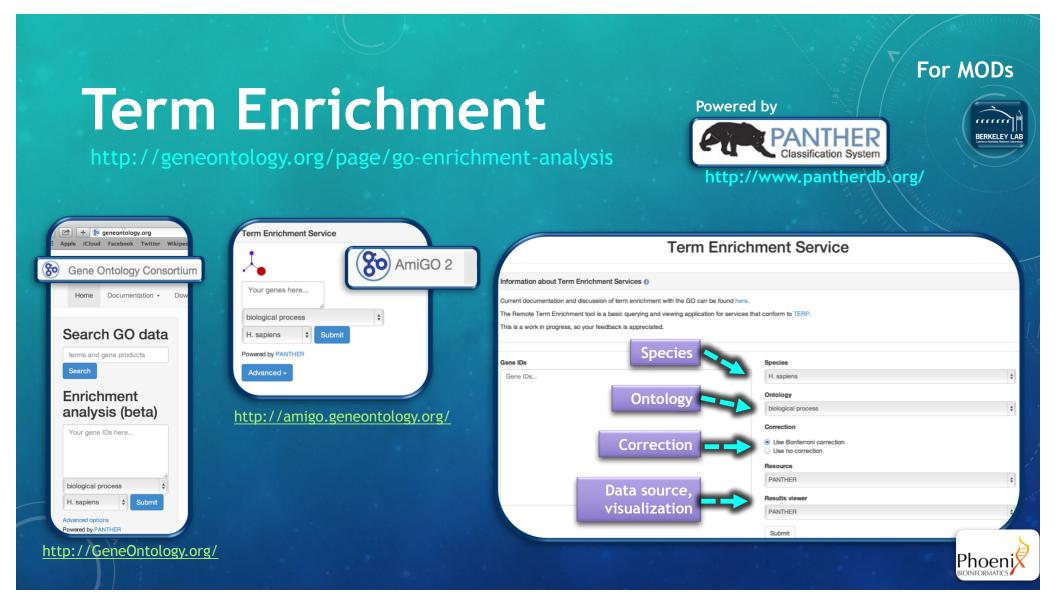
Building protein and domain profiles, then running sequence similarity analysis

Enrichment analysis (expression data)

Functional assignments

Gene Ontology, Uberon anatomy (or stage) Ontology, Chemical Entities of Biological Interest, Kyoto Encyclopedia of Genes and Genomes (KEGG), OrthoDB, Benchmarking Universal Single-Copy Orthologs (BUSCO), etc.





"Term Enrichment"



InterProScan •

Predicts GO terms based on detected domains using our mapping file InterPro-2-GO, one sequence at a time.

http://geneontology.org/page/download-mappings

Download **InterProScan**

InterProScan 5.14-53.0

Name

If not working with MODs



http://www.ebi.ac.uk/interpro/search/sequence-search

InterProScan sequence search

This form allows you to scan your sequence for matches against the InterPro protein sig Enter or paste a protein sequence in FASTA format (complete or not - e.g. PMPIGSKER 40,000 amino acid long.

Release notes Download About InterPro Help Contact

Please note that you can only scan one sequence at a time.

Analyse your protein sequence

Advanced options

Search

By sequence By domain architecture

Search I Clear Example protein sequence



Term Enrichment at The Arabidopsis Information Resource (TAIR)

https://arabidopsis.org



						Gene	Search
tair	Home Help	Contact Ab	out Us Subscribe	Login Register			
Search	Browse	Tools	Portals	Download	Submit	News	ABRC Stocks

The Arabidopsis Information Resource

The North American Arabidopsis Steering Committee User survey to gather input on ICAR2020

About TAIR

The Arabidopsis Information Resource (TAIR) maintains a database of genetic and molecular biology data for the model higher plant *Arabidopsis thaliana*. Data available from TAIR includes the complete genome sequence along with gene structure, gene product information, gene expression, DNA and seed stocks, genome maps, genetic and physical markers, publications, and information about the Arabidopsis research community. Gene product function data is updated every week from the latest published research literature and community data submissions. TAIR also provides extensive linkouts from our data pages to other Arabidopsis resources.

The Arabidopsis Biological Resource Center at The Ohio State University collects, reproduces, preserves and distributes seed and DNA resources of *Arabidopsis thaliana* and related species. Stock information and ordering for the ABRC are fully integrated into TAIR.



TAIR is located at Phoenix Bioinformatics and funded by subscriptions.

Breaking News

NAASC community survey

[Nov 6, 2017] The North American Arabidopsis Steering Committee (NAASC) is soliciting community feedback on the 2020 ICAR meeting. Please contribute your opinions by filling out the **survey**.

New stocks available from ABRC

[Oct 18, 2017] HALO-tagged transcription factors for DAP-Seq to identify transcription factor binding sites donated by Joe Ecker (CD4-92).

Featured Paper

[Oct 17, 2017] Waese, J., et al., (2017) ePlant: Visualizing and Exploring Multiple Levels of Data for Hypothesis Generation in Plant Biology DOI: 10.1105/tpc.17.00073

12th public release of TAIR@Phoenix data

[Oct 2, 2017] 12th public release of data curated under TAIR's subscription-based funding model. Files contain new publications, annotations, gene symbols and other data through September 30, 2016.

Mark your calendars [Oct 2, 2017]

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Also, capture experimental data about gene functions (GO) and expression (Plant Ontology) using TOAST: The *Arabidopsis* Annotation Submission Tool

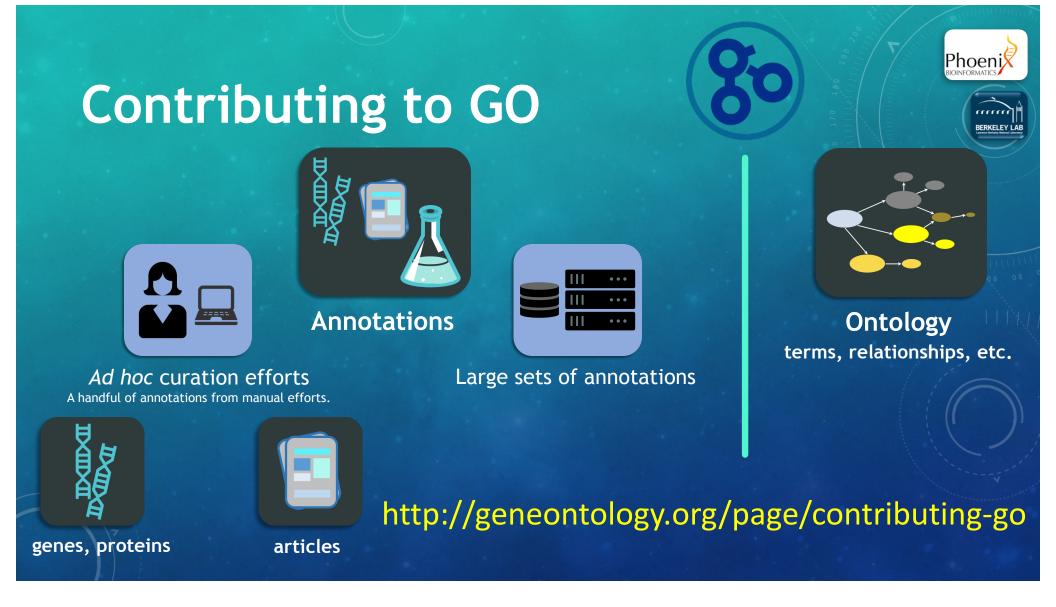
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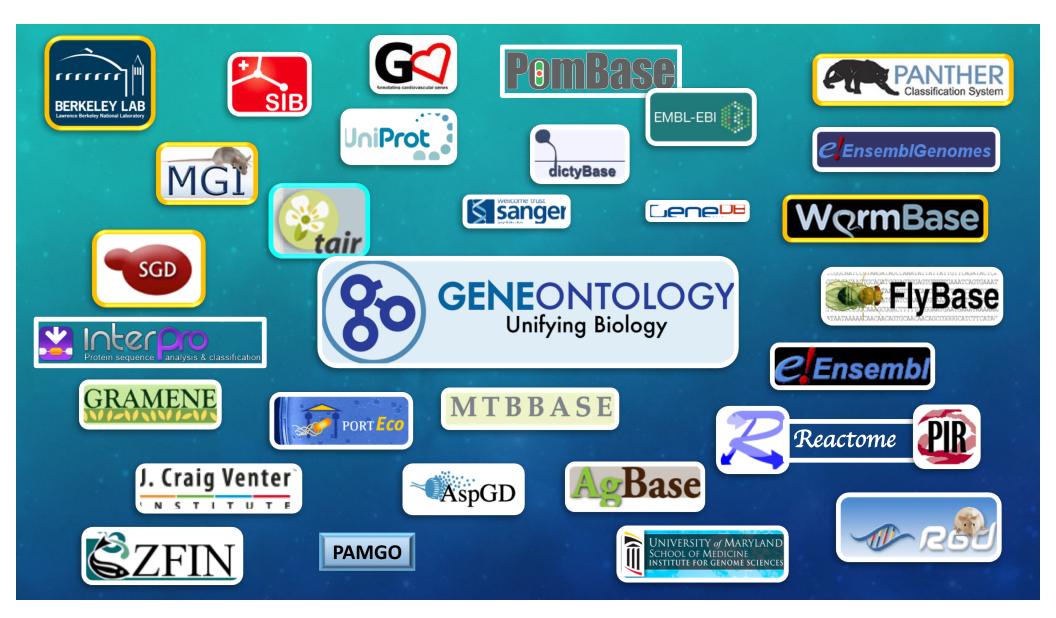
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Noctua



Collaboratively curating gene functions



GO Annotation

http://amigo.geneontology.org/ amigo/gene_product/UniProtKB: P20719

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Gene/product	Gene/product name	Annotation qualifier	GO class (direct)	Annotation extension		Contribut	or Organi	ism E	Evidence	Evidence with	PANTHER family	Isoform	Reference
HOXA5	Homeobox protein Hox- A5		RNA polymerase Il core promoter proximal region sequence- specific DNA binding			NTNU_SB	Homo sapiens		DA		family not named pthr24326		PMID:10879542
HOXA5	Homeobox protein Hox- A5		transcriptional activator activity, RNA polymerase Il core promoter proximal region sequence- specific binding			NTNU_SB	Homo sapiens		DA		family not named pthr24326		PMID:10879542
HOXA5	Homeobox protein Hox- A5		respiratory system process			Ensembl	Homo sapiens		EA	UniProtKB:P09021 ensembl:ENSMUSP00000039012	family not named pthr24326		GO_REF:0000107
HOXA5	Homeobox protein Hox- A5		DNA binding			UniProt	Homo sapiens		DA		family not named pthr24326		PMID:8657138
HOXA5	Homeobox protein Hox- A5		transcription factor activity, sequence- specific DNA binding	has_direct_i UniProtKB:F		UniProt	Homo sapiens		DA		family not named pthr24326		PMID:10879542
HOXA5	Homeobox protein Hox- A5		transcription factor activity, sequence- specific DNA binding			UniProt	Homo sapiens		DA		family not named pthr24326		PMID:16756717
HOXA5	Homeobox protein Hox- A5		protein binding			UniProt	Homo sapiens		PI	UniProtKB:Q15672	family not named pthr24326		PMID:15545268
HOXA5	Homeobox protein Hox- A5		nucleus			UniProt	Homo sapiens		DA		family not named pthr24326		PMID:15545268
HOXA5	Homeobox protein Hox- A5		transcription from RNA polymerase II promoter			GOC	Homo sapiens		EA	GO:0001077	family not named pthr24326		GO_REF:0000108
HOXA5	Homeobox protein Hox- A5		anterior/posterior pattern specification			Ensembl	Homo sapiens		EA	UniProtKB:P09021 ensembl:ENSMUSP00000039012	family not named pthr24326		GO_REF:0000107

GO Annotation

http://amigo.geneontology.org/ amigo/gene_product/UniProtKB: P35453



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Gene/product	Gene/product name	Annotation qualifier	GO class (direct)	Annotation extension	Contributor	Organism	Evidence	Evidence with	PANTHER family I	soform	Reference
HOXD13	Homeobox protein Hox- D13		RNA polymerase II core promoter proximal region sequence- specific DNA binding		Ensembl	Homo sapiens	IEA	UniProtKB:P70217 ensembl:ENSMUSP00000001872	family not named pthr24326		GO_REF:000010
HOXD13	Homeobox protein Hox- D13		transcriptional activator activity, RNA polymerase Il core promoter proximal region sequence- specific binding		Ensembl	Homo sapiens	IEA	UniProtKB:P70217 ensembl:ENSMUSP00000001872	family not named pthr24326		GO_REF:000010
HOXD13	Homeobox protein Hox- D13		transcriptional activator activity, RNA polymerase Il transcription regulatory region sequence- specific binding		UniProt	Homo sapiens	IMP		family not named pthr24326		PMID:24789103
HOXD13	Homeobox protein Hox- D13		skeletal system development		Ensembl	Homo sapiens	IEA	UniProtKB:P70217 ensembl:ENSMUSP00000001872	family not named pthr24326		GO_REF:000010
HOXD13	Homeobox protein Hox- D13		DNA binding		UniProt	Homo sapiens	IDA		family not named pthr24326		PMID:26581570
HOXD13	Homeobox protein Hox- D13		chromatin binding		Ensembl	Homo sapiens	IEA	UniProtKB:P70217 ensembl:ENSMUSP00000001872	family not named pthr24326		GO_REF:000010
HOXD13	Homeobox protein Hox- D13		transcription factor activity, sequence- specific DNA binding		UniProt	Homo sapiens	ISS	UniProtKB:P70217	family not named pthr24326		GO_REF:000002
HOXD13	Homeobox protein Hox- D13		nucleus		HPA	Homo sapiens	IDA		family not named pthr24326		GO_REF:000005
HOXD13	Homeobox protein Hox- D13		regulation of transcription, DNA-templated		PINC	Homo sapiens	TAS		family not named pthr24326		PMID:9207113
HOXD13	Homeobox protein Hox- D13		transcription from RNA polymerase II promoter		PINC	Homo sapiens	TAS		family not named pthr24326		PMID:8614804

Strengths of classic GO annotation

- Simplicity
- Basically just 'tagging' genes with terms
- You can do GO annotation (sort of) in a spreadsheet
- Easy to process computationally
- 100s of tools



Limitations of classic GO annotation 89

- Classic GO annotations don't describe how genes work together
- Every annotation is independent
- Limited ability to use other ontologies:
 - E.g. PO for plant anatomy and cell types
 - TO for traits



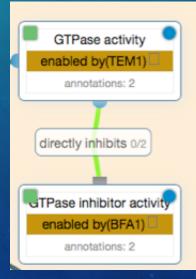
Solution: Linked expressions in the Gene Ontology (LEGO)

Classic Annotation

Gene	Term	Evidence
TEM1	GTPase activity	IDA
	•••	
BFA1	GTPase inhibitor activity	IDA

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LEGO



Phoen

Activity GO:nnnnnn

Phoen

What: <molecule>



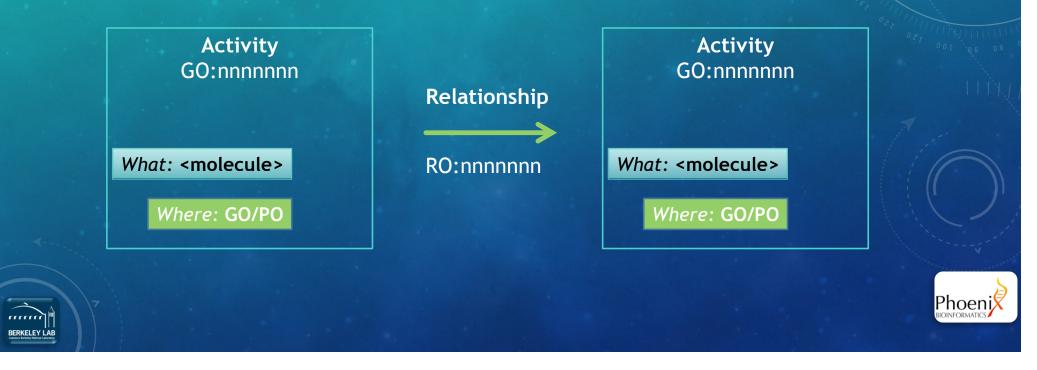
Activity GO:nnnnnn

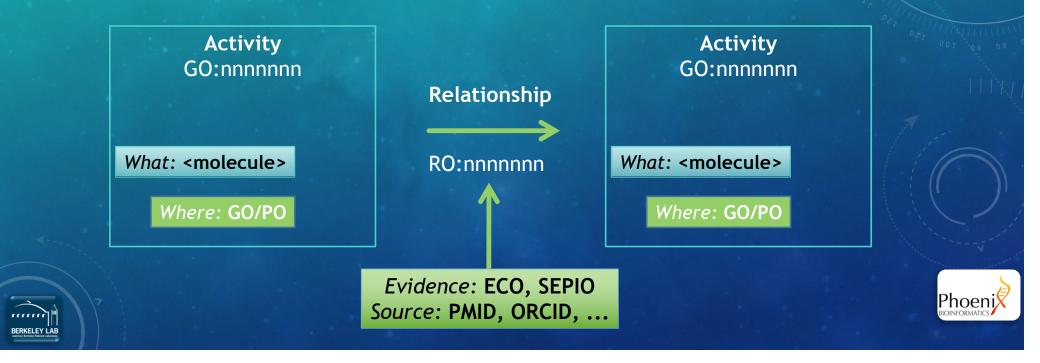
What: <molecule>

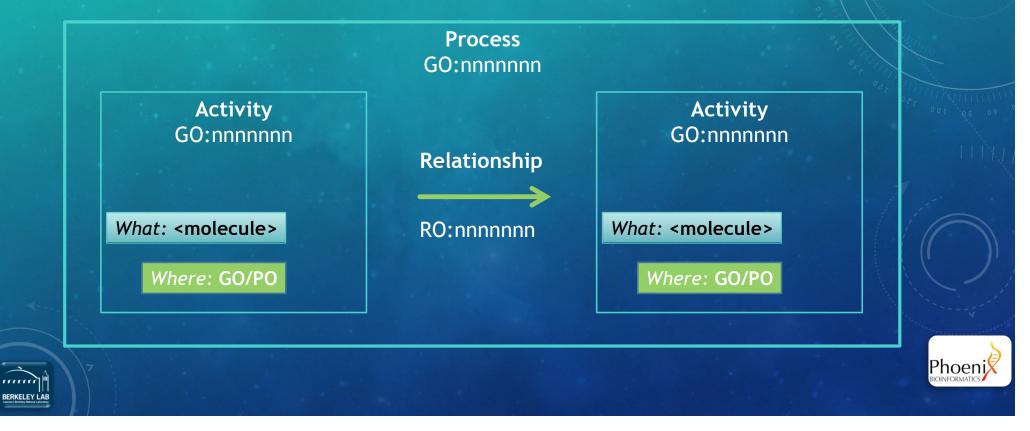
Where: GO/PO











GTPase inhibitor activity GO:0005095

What: BFA1 S000003814

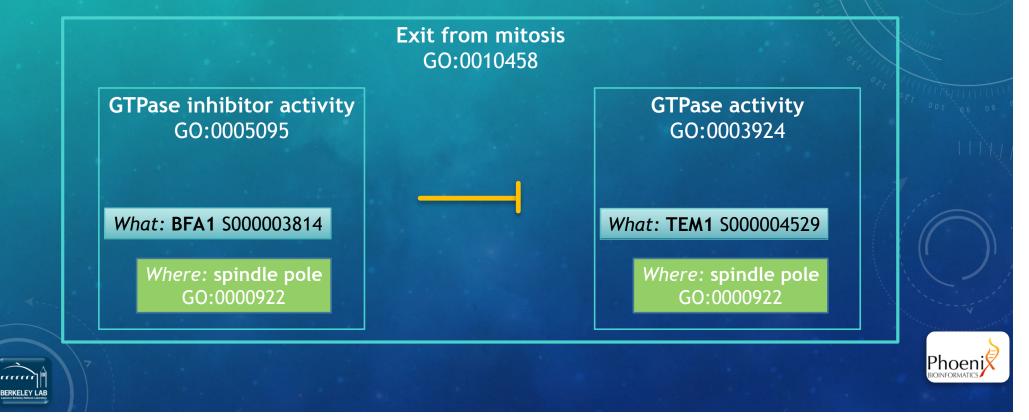
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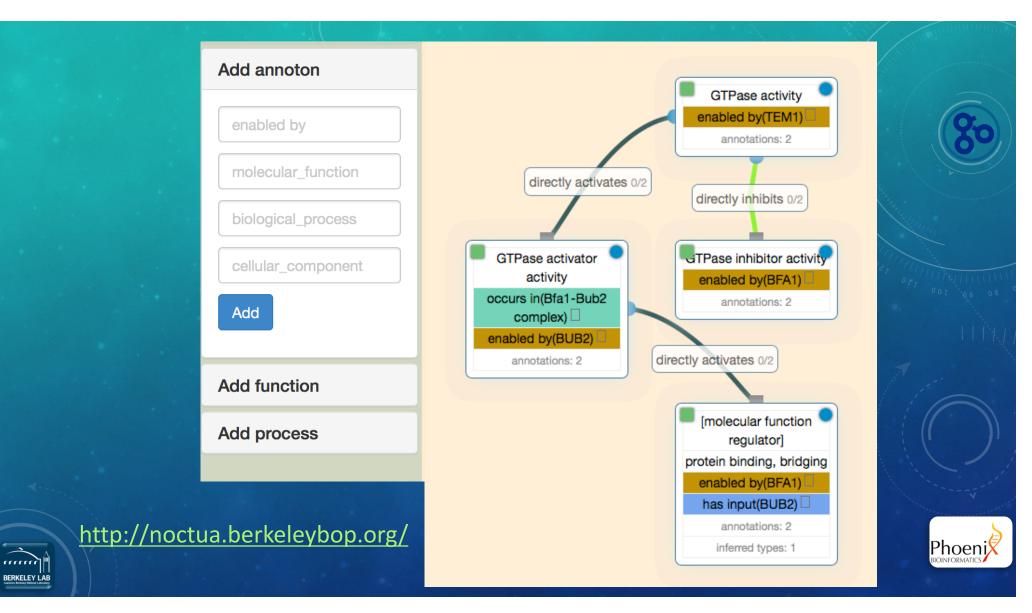
Where: spindle pole GO:0000922 GTPase activity GO:0003924

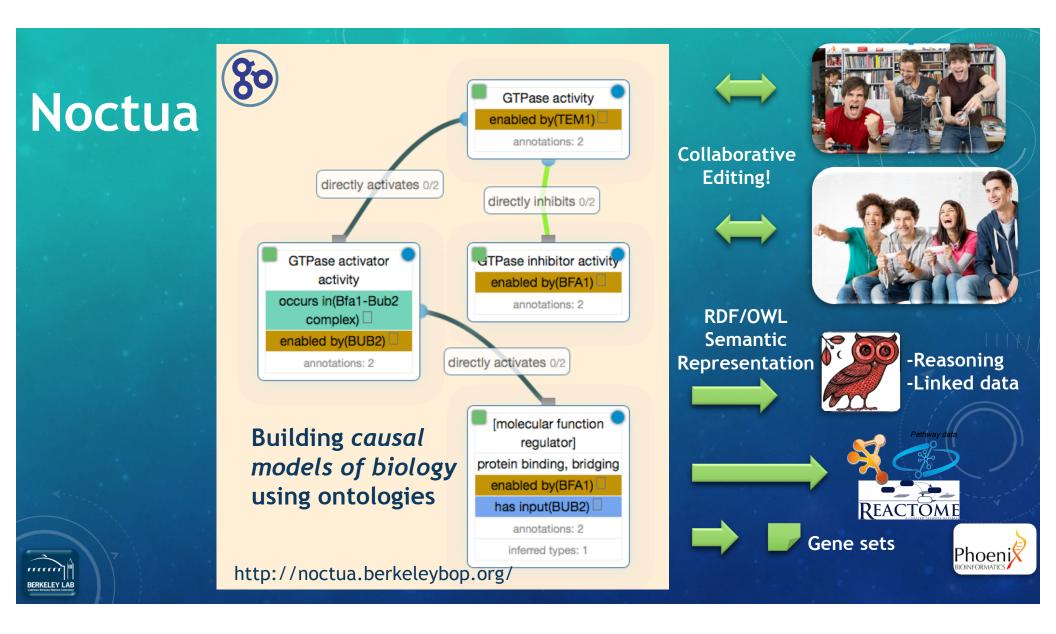
What: TEM1 S000004529

Where: spindle pole GO:0000922









Noctua: Current Workflow

- GO curators create models using Noctua
- A lossy version of this is exported as GAF/GPAD
 - All existing GO tools and databases can use and display this
 - Does not include full precision of Noctua model
- The complete version is stored in a graph database
 - Can be browsed using AmiGO (alpha)
 - Can be exported as cytoscape etc.
 - Awaiting the next generation of analytic tools....!



Upcoming improvements.



Improving the quality of annotated genomes requires:

1) Increasing researchers' efficiency by providing a suite of <u>integrated curation tools</u>, and

2) Increasing the effective population of researchers by providing <u>universally accessible tools</u>.

DATA ANALYSIS DISTILLS VALUABLE KNOWLEDGE!

Phoe

Lessons learned: Plan from the start

GENOME TRAIN

* Experimental design:

- which are the most interesting, "burning" biological matters to explore?
- what questions do we wish to answer?
- which data do we need to answer these questions?
- what are the best strategies to obtain these data?

Data capture:

- Agree on minimum standards for efficiently capturing data, even before data capture begins.
 - Cultural shift: Not so common to rely on big genome centers. Not all data come from large repositories, but mostly from GFF3s (from sequencing centers & individual labs).
- * Long-term housing for these data; storage & dissemination:
 - where will the data live?
 - who will pay for resources?
 - large investment in hardware, and longer-term investment on maintenance.



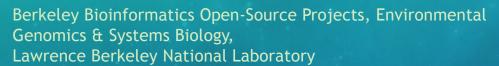
Lessons learned: Plan from the start



- Link to and/or add to existent databases:
 Find your 'home' database, AND / or deposit to large public resource (NCBI, DDBJ, Ensembl, etc.)
- Seek IT support at hosting institution(s) now:
 Engage reliable and responsive systems administrators.



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