What Biologists Want To Compute

Knowledge Search: What do we know about this Gene, Pathway, System, Organism, ...? Comparison: How are these organisms similar? Model Identification: What models fit this data? Model Analysis: What does this model predict? Annotation: What does this gene do? Use and Share Results.

Problem: Biologists need to be able to carry out novel, complex, computations *themselves*.

Why?

Need/Desire to "invent" novel computations... Need/Desire to understand the methods in detail... (for communication/replication/modification/...)

Few biology-savvy programmers (most places)... Potential communications problems... Lack of (money to pay) reliable programmers...

Need/Desire to "turn the data over in their hands"...

Goal: Enable biologists to carry out novel, complex, knowledge-based computations *themselves*.

Some biologists can already write complex programs, but most can't.

Why not?

They're busy with other things... Programming isn't easy... Most programming languages are terrible... Data and knowledge is all over the place... Their formats are also all over-the-place... The knowledge structures are completely random... Getting setup is a mess (even for a linux guru)... Most databases are in the style of "WebTV"... Biologists are used to "WebTV" computation... Goal: Enable biologists to carry out novel, complex, knowledge-based computations themselves.

Approach: Make complex biocomputing easier for biologists.

How?

Provide a uniform programming interface... Using a simple, interactive, paradigm... To a programmable data/knowledge base... With all the relevant data/knowledge preloaded... And all the relevant tools (incl. advanced ones)... And intelligent semi-automatic programming tools... In a biological community... All through the web. Goal: Enable biologists to carry out novel, complex, knowledge-based computations themselves.

Approach: Make complex biocomputing easier for biologists.

What?

KnowOS (Knowledge Operating System):

BioBike BioDeducta CACHE The Prime Directive (first clause):

All data and knowledge can be manipulated by user-written programs that approximate user's natural protocols.

The Prime Directive (second clause):

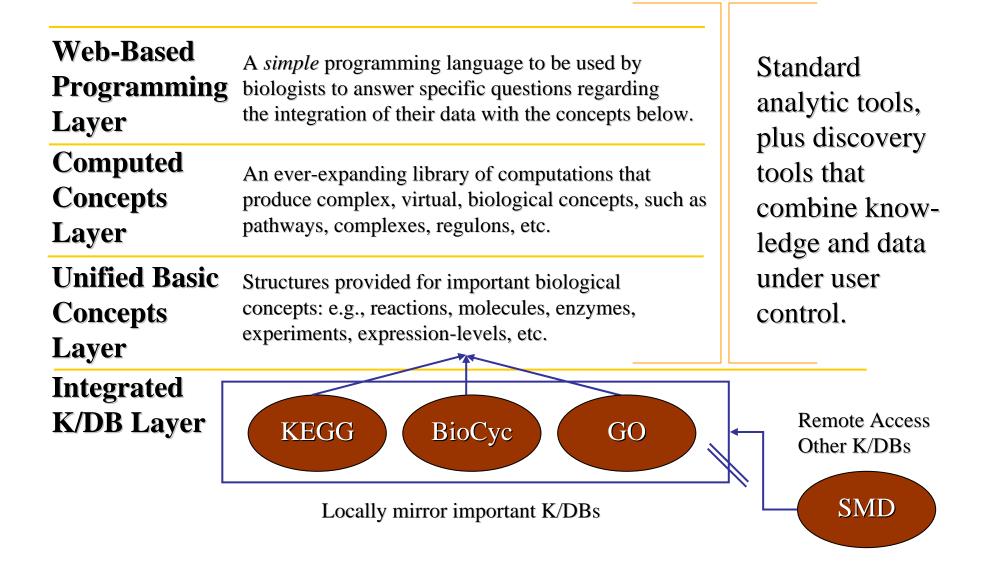
Users should not have to do any work to make this happen that is not directly relevant to the problem being solved.



A Course in Symbolic BioComputing

<u>11</u>	
Name	Description
A Tour of BioBike	Getting one's feet wet with BioLisp and the BioBike Listener
Lisp I: Evaluation	The basics of Lisp evaluation.
Lisp II: Data and Iteration	Lisp data structures and iteration (loops).
Functions	An important little Lisp lesson.
Tables	Working with data tables
Biocomputing I	Compring gene function across organisms using annotation and microarrays
Graph R&R	Representation and Reasoning about Graphs.
GO Analysis I	Simple symbolic biocomputing based on the Gene Ontology
Microarray Analysis	Simple microarray data clustering
Metabolic Simulation I	Introduction to dynamic analysis of metabolic pathways
Metabolic Simulation II	Dynamic pathway analysis using the Gene Ontology knowledge base
Regulation Simulation	Simulating the cell cycle (based upon a 2004 PNAS publication)
<u>Natural Language I</u>	Extracting biological relationships from PubMed using simple statistics
Functional Phylogeny	Exploring phylogeny based upon gene function
Model Discovery I	Reverse engineering of regulatory networks
Model Discovery II	Model discovery through partial correlations in microarray data
Reasoning Intro	Introduction to automated reasoning using Snark
More BioReasoning	Re-understanding the Elhai problem in reasoning terms
Complex Regulatory Reasoning	Using Snark to reason about the cell cycle

BioBike Conceptual Architecture



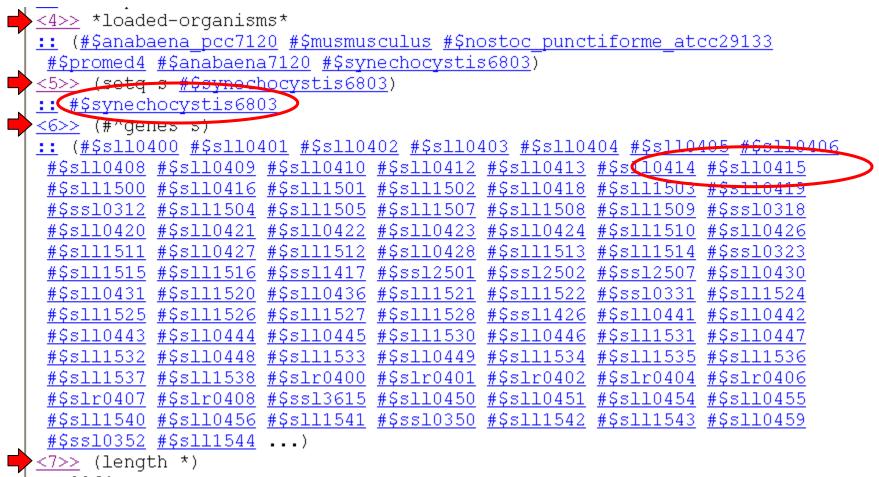
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<pre>#%PEPCarboxykinaseC4Photosynthesis #%Hexokinase-IndependentSignaling #%PEPCarboxykinaseC4Photosynthesis #%Hexokinase-IndependentSignaling #%PEPCarboxykinaseCtivity #%Water vuvateDikinaseActivity #%SluconokinaseActivity #%Water vuvateDikinaseActivity #%SluconokinaseActivity #%Water vuvateDikinaseActivity #%SluconokinaseActivity #%Phosyn inaseActivity #%PhosphoenolpyruvateCarboxyk itplActivity #%PhosphoenolpyruvateCarboxyk #%PhosphoenolpyruvateCarboxyk #tplActivity #%SPhosphoenolpyruvateCarboxyk #tivity #%SPhosphoenolpyruvateCarboxyk #tivity #%SPhosphoenolpyruvateCarboxyk #file #SPhosphoenolpyruvateCarboxyk #SPhos</pre>	
go-frames Simple Exprs	
(loop for frame in *go-frames* when (search "kinase" (#^fname frame))	
collect frame)	
Complex Exprs	
Eval Clear Matching paren context: (loop for frame 层	
BioLingua Listener v1.0 Lisp Spec BioLingua Primitives Upload facility Help	×

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Knowledge Search: What do we know about this Gene, Pathway, System, Organism, ...?

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Count the genes of an organism.



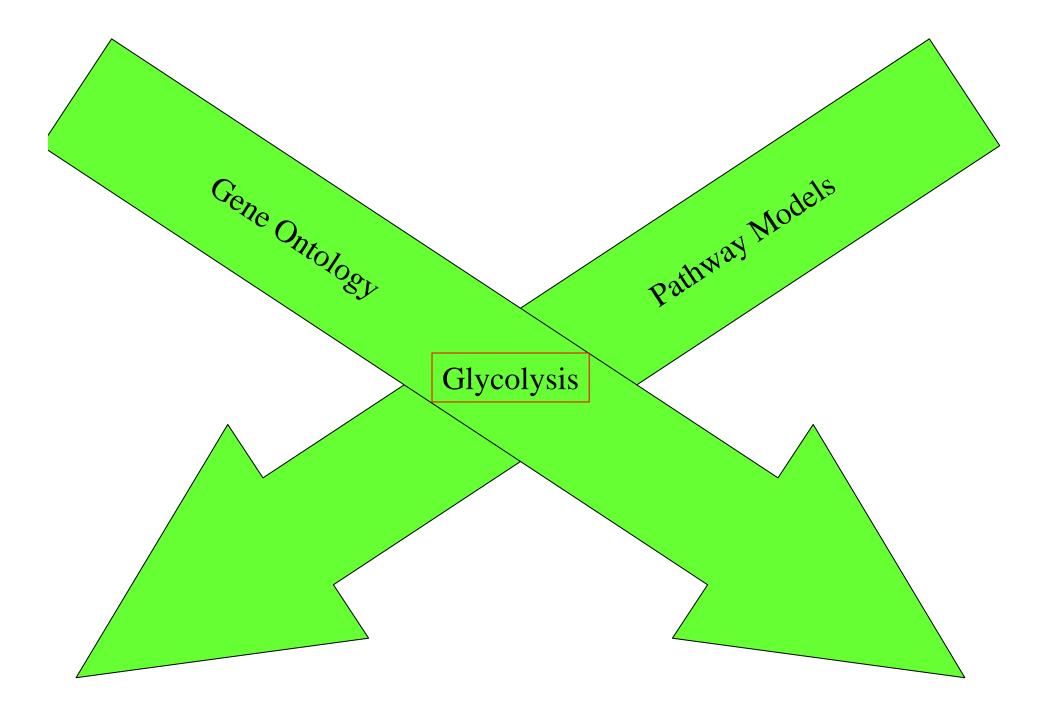
<u>::</u> 3264

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Children [Hide] #\$sll0415 SuperParts [Hide] #\$Pcc6803genome #\$sll0415 Slots	
DBLINKS	(<u>#\$CY</u> <u>#\$sll0415</u> ()()()())
fName	sll0415
go-frames	(#\$Atp-BindingCassette[Abc]Transporter #\$ATPBinding #\$ATPBinding #\$Transport)
Left-End-Position	2540821
organism	#\$synechocystis6803
PRODUCT	#\$SII0415-Monomer
Right-End-Position	2540821
SequenceInfo	(2540821 2541885 354 c)
source	ocelot

How many of those are transporters?



	Slots	
	DBLINKS	(<u>#\$CY</u> <u>#\$sll0415</u> () () () () ())
	fName	sii0415
Q	go-frames	(<u>#\$Atp-BindingCassette[Abc]Transporter</u> <u>#\$ATPBinding</u> <u>#\$ATPBinding</u> <u>#\$Transport</u>)
	Left-End Position	2540821
	organism	#\$synechocystis6803
	PRODUCT	#\$SII0415-Monomer
	Right-End-Position	2540821
	SequenceInfo	(2540821 2541885 354 c)
	source	ocelot



Instantiate a pathway for an organism.

```
<7>> *loaded-organisms*
 :: (#$anabaena pcc7120 #$musmusculus #$nostoc punctiforme atcc29133
  #$promed4 #$anabaena7120 #$synechocystis6803)
 <8>> (setq s (first (last *)))
 :: #$synechocystis6803
 \leq 9 \geq > (length (#^genes s))
 :: 3264
 <10>>> (defun instantiate-pathway (pwy org))
   (loop for gene in (#^genes org)
         when (member pwy (#^go-frames gene))
         collect gene))
 :: INSTANTIATE-PATHWAY
<11>> (instantiate-pathway <u>#$qlycolysis</u> s)
 :: (#$sll0587 #$sll0593 #$slr1096 #$sll0018 #$sll1196 #$sll0745 #$slr0752
  #$slr0783 #$sll1275 #$slr1945 #$slr0884 #$sll1342 #$slr1349 #$slr0943
 #$slr0394)
<12>> (mapcar #'#^common-name *)
 :: ("PYKF" "GLK" "PHDD OR LPD" "CBBA OR CFXA" "PFKA" "PFKA" "ENO" "TPI"
  "PYKF" "YIBO OR PGM" "GAP1" "GAP2" "PGI" "FDA" "PGK")
```

$\left \right $	<pre><31>> (instantiate-all-pathways s)</pre>
	:: ((#\$AntibioticBiosynthesis ((#\$slr0378)))
	(#\$CellWallBiosynthesis[SensuBacteria]
	((<u>#\$sll1833</u> . "FTSI OR PBPB") (<u>#\$slr0319</u>)))
	(<u>#\$LysineBiosynthesisViaDiaminopimelate</u> ((<u>#\$slr1665</u> . "DAPF")))
	(<u>#\$LysineBiosynthesis</u>
	((<u>#\$sll0504</u> . "LYSA") (<u>#\$slr0549</u> . "ASD") (<u>#\$slr0550</u> . "DAPA")
	(<u>#\$slr1665</u> . "DAPF") (<u>#\$sl11058</u> . "DAPB")))
	(<u>#\$ThreonineBiosynthesis</u>
	((<u>#\$sll0455</u> . "THRA OR HOM") (<u>#\$sll1760</u> . "THRB")
	(<u>#\$sll1172</u> . "THRC")))
	(<u>#\$IsoleucineBiosynthesis</u>
	((<u>#\$sll0455</u> . "THRA OR HOM") (<u>#\$slr2072</u> . "ILVA")))
	(<u>#\$LeucineBiosynthesis</u>
	((<u>#\$slr1517</u> . "LEUB") (<u>#\$slr0186</u> . "LEUA") (<u>#\$sll1444</u> . "LEUD")
	(<u>#\$sll1470</u> . "LEUC")))
	(<u>#\$BranchedChainFamilyAminoAcidBiosynthesis</u>
	((<u>#\$slr0452</u> . "ILVD") (<u>#\$sl10065</u> . "ILVN") (<u>#\$slr0032</u> . "ILVE")
	(<u>#\$sll1363</u> . "ILVC")))
	(<u>#\$ArginineBiosynthesis</u>
	((<u>#\$slr0585</u> . "ARGG") (<u>#\$slr1022</u> . "ARGD OR DTU")
	(<u>#\$sll0080</u> . "ARGC") (<u>#\$slr1133</u> . "ARGH") (<u>#\$sll1883</u> . "ARGJ")
	(<u>#\$slr1898</u> . "ARGB") (<u>#\$sl10902</u> . "ARGF")
	(<u>#\$sll0370</u> . "CARB OR PYRA") (<u>#\$sll1498</u> . "CARA OR PYRA")))
	(<u>#\$GlutamateBiosynthesis</u>
	((<u>#\$sll1502</u> . "GLTB") (<u>#\$sll1561</u> . "PUTA") (<u>#\$sll1499</u> . "GLTB")))
	(<u>#\$ProlineBiosynthesis</u>
	((<u>#\$slr2035</u> . "PROB") (<u>#\$slr0661</u> . "PROC") (<u>#\$sl10373</u> . "PROA")))
	(<u>#\$HistidineBiosynthesis</u>
	((<u>#\$slr1560</u> . "HISS") (<u>#\$slr0500</u> . "HISB") (<u>#\$slr0608</u> . "HISI")
	(<u>#\$slr0652</u> . "HISA") (<u>#\$slr0682</u> . "HISD") (<u>#\$slr0084</u> . "HISH")
	(<u>#\$slr1848</u> . "HISD") (<u>#\$sll1893</u> . "HISF") (<u>#\$sll1958</u> . "HISC")
l	(#\$sll0900 . "HISG")))

And for another organism!

<32>> (instantiate-all-pathways #\$anabaena7120) :: ((#\$AntibioticBiosynthesis ((#\$all3924))) (#\$CellWallBiosvnthesis[SensuBacteria] ((#\$alr5045) (#\$all2480) (#\$alr0718))) (#\$LysineBiosynthesisViaDiaminopimelate ((#\$alr2048))) (#\$LvsineBiosvnthesis ((#\$alr2542) (#\$all3679) (#\$alr2048))) (#\$IsoleucineBiosynthesis ((#\$alr4232))) (#\$BranchedChainFamilyAminoAcidBiosynthesis ((#\$all2315) (#\$alr2771))) (#\$ArginineBiosynthesis ((#\$alr3887) (#\$alr5095) (#\$alr1155) (#\$alr2073) (#\$alr3809))) (#\$GlutamateBiosynthesis ((#\$alr0540))) (#\$ProlineBiosynthesis ((#\$all2166) (#\$alr0488) (#\$alr3103))) (#\$HistidineBiosynthesis ((#\$alr1965) (#\$all3263) (#\$all1368))) (#\$AlanineBiosynthesis ((#\$all3569))) (#\$AminoAcidBiosynthesis ((#\$all4644) (#\$alr3086) (#\$alr3103) (#\$alr1207) (#\$alr1244) (#\$alr3644))) (#\$HypusineBiosynthesisFromPeptidyl-Lysine ((#\$alr3804))) (#\$PhenylalanineBiosynthesis ((#\$alr4334))) (#\$AromaticAminoAcidFamilyBiosynthesis ((#\$alr2782) (#\$all0797))) (#\$PurineBaseBiosynthesis ((#\$alr3510))) (#\$'DeNovo'PyrimidineBaseBiosynthesis ((#\$alr1912) (#\$alr2945) (#\$alr2983) (#\$al14272))) (#\$PeptidoglycanBiosynthesis ((#\$all1663) (#\$all4316) (#\$alr1779) (#\$alr0094) (#\$alr4579) (#\$all0174) (#\$alr5065) (#\$alr2458) (#\$alr0477) (#\$alr5324) (#\$alr5326) (#\$alr3303) (#\$all2952) (#\$all2981) (#\$all2995) (#\$all0980)))

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Knowledge Search: What do we know about this Gene, Pathway, System, Organism, ...?

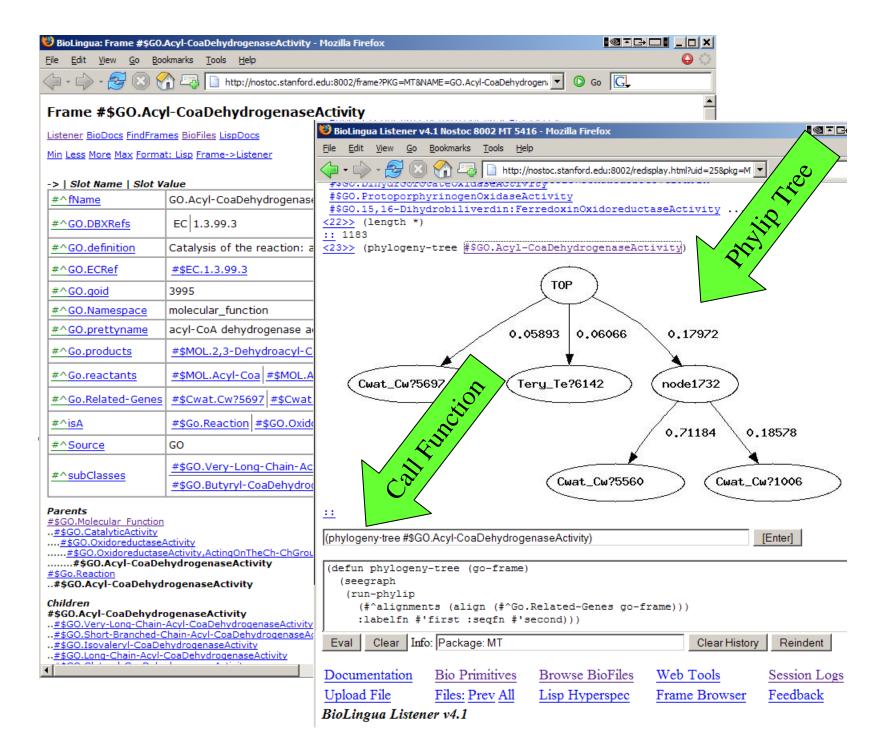
Comparison: How are these organisms similar?

Model Identification: What models fit this data?

Model Analysis: What does this model predict?

Annotation: What does this gene do?

Use and Share Results.



What Biologists Want To Compute

Knowledge Search: What do we know about this Gene, Pathway, System, Organism, ...?

Comparison: How are these organisms similar?

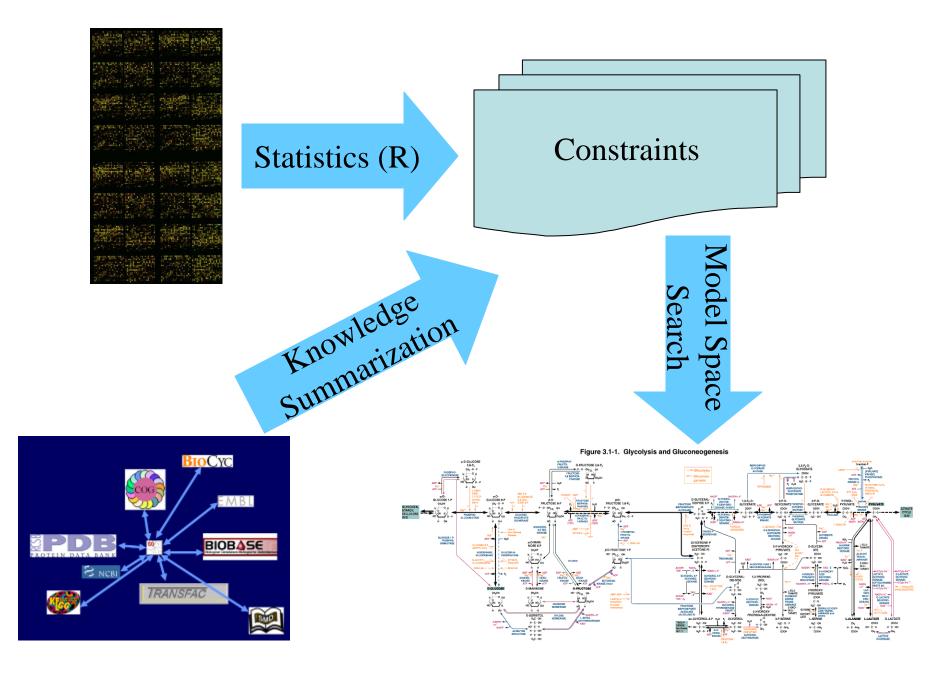
Model Identification: What models fit this data?

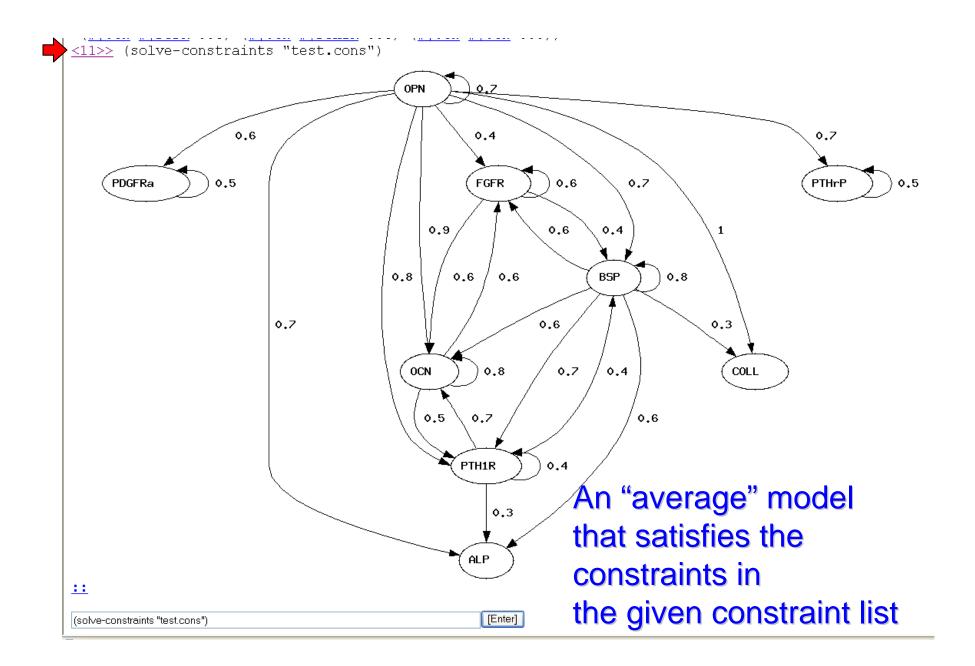
Model Analysis: What does this model predict?

Annotation: What does this gene do?

Use and Share Results.

Knowledge-Based Microarray Casual Analysis

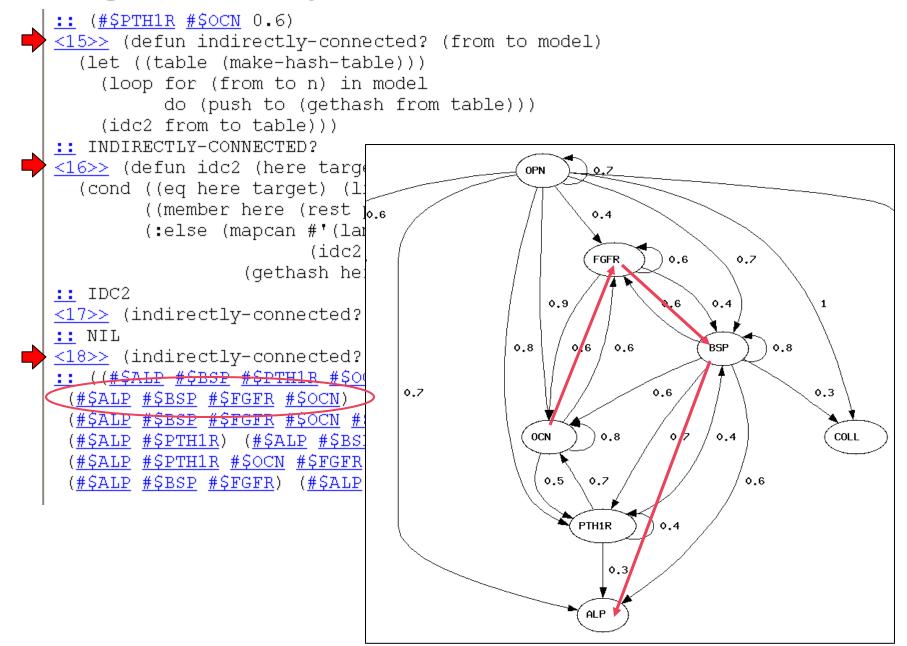




Get the model in computable form.

<9>> (solve-constraints "test.cons" :result-type :list) :: (("OPN" "OPN" 0.6) ("OPN" "PDGFRa" 0.4) ("OPN" "FGFR" 0.7) ("OPN" "PTH1R" 0.8) ("OPN" "PTHrP" 0.4) ("OPN" "COLL" 0.7) ("OPN" "ALP" 0.7) ("OPN" "BSP" 0.7) ("OPN" "OCN" 0.6) ("PDGFRa" "PDGFRa" 0.9) ("FGFR" "FGFR" 0.6) ("FGFR" "BSP" 0.3) ("FGFR" "OCN" 0.6) ("PTH1R" "PTH1R" 0.9) ("PTH1R" "ALP" 0.5) ("PTH1R" "BSP" 0.3) ("PTH1R" "OCN" 0.6) ("PTHrP" "PTHrP" 0.7) ("BSP" "FGFR" 0.8) ("BSP" "PTH1R" 0.6) ("BSP" "COLL" 0.6) ("BSP" "ALP" 0.6) ("BSP" "BSP" 0.8) ("BSP" "OCN" 0.8) ("OCN" "FGFR" 0.6) ("OCN" "PTH1R" 0.5) ("OCN" "OCN" 0.8)) <10>>> (setf model (->frames *)) :: ((#\$OPN #\$OPN 0.6) (#\$OPN #\$PDGFRa 0.4) (#\$OPN #\$FGFR 0.7) (#\$OPN #\$PTH1R 0.8) (#\$OPN #\$PTHrP 0.4) (#\$OPN #\$COLL 0.7) (#\$OPN #\$ALP 0.7) (#\$OPN #\$BSP 0.7) (#\$OPN #\$OCN 0.6) (#\$PDGFRa #\$PDGFRa 0.9) (#\$FGFR #\$FGFR 0.6) (#\$FGFR #\$BSP 0.3) (#\$FGFR #\$OCN 0.6) (#\$PTH1R #\$PTH1R 0.9) (#\$PTH1R #\$ALP 0.5) (#\$PTH1R #\$BSP 0.3) (#\$PTH1R #\$OCN 0.6) (#\$PTHrP #\$PTHrP 0.7) (#\$BSP #\$FGFR 0.8) (#\$BSP #\$PTH1R 0.6) (#\$BSP #\$COLL 0.6) (#\$BSP #\$ALP 0.6) (#\$BSP #\$BSP 0.8) (#\$BSP #\$OCN 0.8) (#\$OCN #\$FGFR 0.6) (#\$OCN #\$PTH1R 0.5) (#\$OCN #\$OCN 0.8)) [Enter] (setf model (->frames *))

Are two genes *indirectly* connected?



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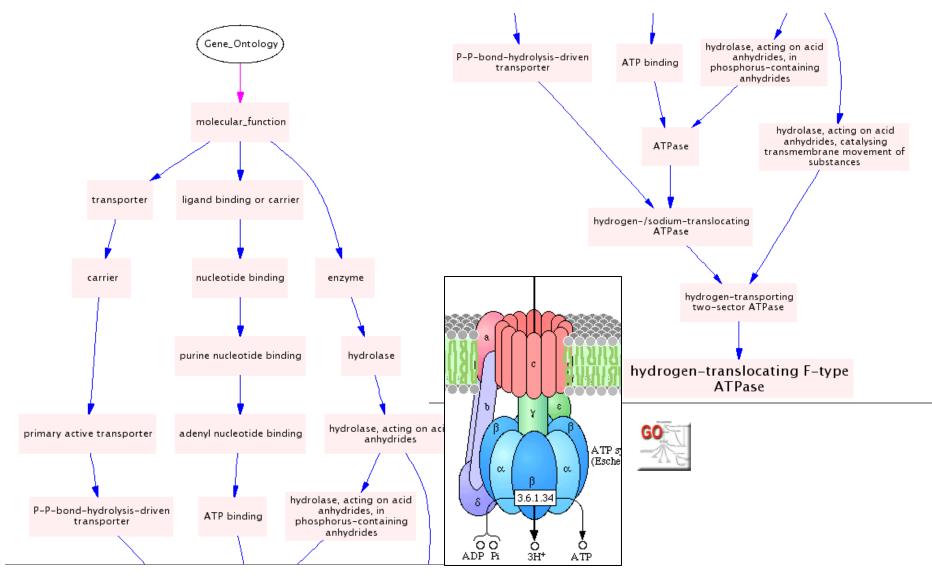
Model Identification: What models fit this data?

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Annotation: What does this gene do?

Use and Share Results.

Current representational practice:



From GenNav, the NIH Gene Ontology Browser

Goal: "Runnable" Biochemistry

```
(photosynthesis isa process with
  inputs (chloroplast-inside.water everywhere.light chloroplast-outside.nadph+
          chloroplast-outside.adp chloroplast-outside.pi)
  outputs (chloroplast-outside.atp chloroplast-outside.nadph everywhere.o2)
  implemented-by photosystem)
(photosystem composition (psii antenna-array atpase pq-pool))
(light-absorption isa process with
  inputs (everywhere.light)
  outputs (chlorophyll.energy)
  function absorption
  implemented-by chlorophyll)
(light-energy-concentration isa process with
  outputs psii.energy
 driver chlorophyll.energy
  function concentration
  implemented-by antenna-array)
(psii-water-breakdown isa process with
  inputs (chloroplast-inside.water)
 driver psii.energy
  outputs (psii.e- psii.e- chloroplast-inside.h+ chloroplast-inside.o2)
  function molecular-splitting
  implemented-by psii)
(psii-pq-reduction isa process with
  inputs (psii.e- chloroplast-membrane.h+ chloroplast-membrane.plastoquinone)
  outputs (chloroplast-membrane.plastoquinol)
  function reduction
  implemented-by psii
  inhibited-by dcmu)
```

Frame #\$Glycolysis

definition definition_ Deltag0 -8.5d0 fName Glycolysis Goid 6096 In-Pathway (#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy) IsaLevel 5 Net-Reaction- Equation Glucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)O ((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy)) ((#\$Pyruvate #\$Fermentation-Rxn #\$F16aldolase-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn PREDECESSORS (#\$Triosepisomerization-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglypho (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))	I (SIOLS	
definition The breakdown of a monosaccharide (generally glucose) into simpler components, including pyruvate definition_ Deltag0 -8.5d0 fName Glycolysis Goid 6096 In-Pathway (#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy) IsaLevel 5 Net-Reaction- Equation Glucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)O Pathway-Links ((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy)) ((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$Phosglyphos-Rxn #\$F16aldolase-Rxn #\$Phosglyphos-Rxn #\$F16aldolase-Rxn #\$Phosglyphos-Rxn #\$Papadehydrat-Rxn #\$Phosglyphos-Rxn #\$Papadehydrat-Rxn #\$Papadehydrat-Rxn)			no
definition definition_ Deltag0 -8.5d0 fName Glycolysis Goid 6096 In-Pathway (#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy) IsaLevel 5 Net-Reaction- Equation Glucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)O Pathway-Links ((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy)) ((#\$Pyruvate #\$Fermentation-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$f0fructphos-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglypho (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))		Common-Name	glycolysis
FNameGlycolysisGoid6096In-Pathway(#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy)IsaLevel5Net-Reaction- EquationGlucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)OPathway-Links((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy))PREDECESSORS((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn) (#\$F16aldolase-Rxn #\$Phosglyphos-Rxn #\$F16aldolase-Rxn #\$Phosglyphos-Rxn #\$Phosglyphos-Rxn #\$Padephos-Rxn #\$Pglucison-Rxn)		definition	The breakdown of a monosaccharide (generally glucose) into simpler components, including pyruvate. definition_
Goid6096In-Pathway(#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy)IsaLevel5Net-Reaction- EquationGlucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)OPathway-Links((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy))PREDECESSORS((#\$Pyruvate #\$Fermentation-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn #\$F16aldolase-Rxn #\$F16aldolase-Rxn #\$Phosglypho (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglypho (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn #\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))		Deltag0	-8.5d0
In-Pathway(#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy)IsaLevel5Net-Reaction- EquationGlucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)OPathway-Links((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy))PREDECESSORS((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn) (#\$F16aldolase-Rxn #\$Phosglyphos-Rxn #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglyphos-Rxn #\$Phosgly		fName	Glycolysis
IsaLevel 5 Net-Reaction- Equation Glucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)O Pathway-Links ((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy)) REDECESSORS ((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn) (#\$F16aldolase-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglypho (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))		Goid	6096
Net-Reaction- Equation Glucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)O Pathway-Links ((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy)) REDECESSORS ((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn (#\$Triosepisomerization-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglyphos (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))		In-Pathway	(#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy)
EquationGlucose + 2 PI + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)OPathway-Links((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy))PREDECESSORS((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn) (#\$F16aldolase-Rxn #\$f16aldolase-Rxn) (#\$f16aldolase-Rxn) (#\$f16aldolase		IsaLevel	5
PREDECESSORS((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn (#\$Triosepisomerization-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglypho (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))			Glucose + 2 Pi + 2 ADP + 2 NAD = 2 pyruvate + 2 ATP + 2 NADH + 2 H + 2 H(2)O
PREDECESSORS (#\$Triosepisomerization-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization- #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglypho (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))		Pathway-Links	((#\$Pyruvate #\$Fermentation-Pwy #\$Amino-Acid-Biosynthesis) (#\$Glc-6-P #\$Pentose-P-Pwy))
		PREDECESSORS	((#\$Pglucisom-Rxn) (#\$6pfructphos-Rxn #\$Pglucisom-Rxn) (#\$F16aldolase-Rxn #\$6pfructphos-Rxn) (#\$Triosepisomerization-Rxn #\$F16aldolase-Rxn) (#\$Gapoxnphosphn-Rxn #\$Triosepisomerization-Rx #\$F16aldolase-Rxn) (#\$Phosglyphos-Rxn #\$Gapoxnphosphn-Rxn) (#\$3pgarearr-Rxn #\$Phosglyphos- (#\$2pgadehydrat-Rxn #\$3pgarearr-Rxn) (#\$Pepdephos-Rxn #\$2pgadehydrat-Rxn))
Prettyname glycolysis		Prettyname	glycolysis
Reaction-List (#\$Pglucisom-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn #\$Triosepisomerization-Rxn #\$Gapoxnphos-Rxn #\$3pgarearr-Rxn #\$2pgadehydrat-Rxn #\$Pepdephos-Rxn)		Reaction-List	(#\$Pglucisom-Rxn #\$6pfructphos-Rxn #\$F16aldolase-Rxn #\$Triosepisomerization-Rxn #\$Gapoxnpho Rxn <u>#\$Phosglyphos-Rxn</u> #\$3pgarearr-Rxn #\$2pgadehydrat-Rxn #\$Pepdephos-Rxn)
source ocelot		source	ocelot
Super-Pathways (<u>#\$Glucfermen-Pwy</u> <u>#\$Glycolysis+Citric-Acid-Pwy</u>)		Super-Pathways	(#\$Glucfermen-Pwy #\$Glycolysis+Citric-Acid-Pwy)
SYNONYMS Embden-Meyerhof pathway		SYNONYMS	Embden-Meyerhof pathway
Internet		ê	 Internet

Frame #\$Pglucisom-Rxn

	Slots	
K	Common- Name	Glucose-6-phosphate isomerase
	DBLINKS	((#\$PIR T51720 () pkarp 3199817462) (#\$PIR T46970 () pkarp 3199817462) (#\$PIR T44843 () pkarp 3199817462) (#\$PIR T43196 () pkarp 3199817462) (#\$PIR T14631 () pkarp 3199817462) (#\$PIR T0915 pkarp 3199817462) (#\$PIR T09153 () pkarp 3199817462) (#\$PIR T05572 () pkarp 3199817462) (#\$PIR () pkarp 3199817462) (#\$PIR T03948 () pkarp 3199817462) (#\$PIR T02094 () pkarp 3199817462) (#\$PIR 575607 () pkarp 3199817462) (#\$PIR S73908 () pkarp 3199817462) (#\$PIR S58164 () pkarp 3199817462) (#\$PIR S57831 () pkarp 3199817462) (#\$PIR S57830 () pkarp 3199817462) (#\$PIR S41808 () pkarp 3199817462) (#\$PIR S41807 () pkarp 3199817462) (#\$PIR S41806 () pkarp 3199817462) (#\$PIR S235 pkarp 3199817462) (#\$PIR NUZQF () pkarp 3199817462) (#\$PIR NUVKL () pkarp 3199817462) (#\$PIR pkarp 3199817462) (#\$PIR NUPG () pkarp 3199817462) (#\$PIR NUMS () pkarp 3199817462) (#\$PIR NUBSSA () pkarp 3199817462) (#\$PIR NUBSSA () pkarp 3199817462) (#\$PIR pkarp 3199817462) (#\$PIR PKAFP 3199817462) (#\$PIR
	Deltag0	0.4d0
	ec-number	5.3.1.9
	Enzymatic- Reaction	#\$Enzrxn-256
	fName	Pglucisom-Rxn
	In-Pathway	(#\$Sucsyn-Pwy #\$P341-Pwy #\$Glycolysis #\$Gluconeo-Pwy #\$P124-Pwy #\$P125-Pwy)
X	LEFT	#\$Glc-6-P
	RIGHT	#\$Fructose-6p
	source	ocelot
	SYNONYMS	(Hexose monophosphate isomerase Phosphohexoisomerase Phosphoglucoisomerase Phosphosaccharom Hexosephosphate isomerase Oxoisomerase Phosphohexomutase Phosphohexose isomerase Phosphoglu isomerase)
		🖉 🖉 Inte

Find the genes involved in glycolysis, and their reactions.

```
<38>> (remove-if-not #'(lambda (q) (member #$qlycolysis (#^qo-frames q))) (#^qene
:: (#$sl10587 #$sl10593 #$slr1096 #$sl10018 #$sl11196 #$sl10745 #$slr0752
 #$slr0783 #$sll1275 #$slr1945 #$slr0884 #$sll1342 #$slr1349 #$slr0943
 #$slr0394)
<39>>> (first *)
:: #$s110587
<40>> (#^product *)
:: #$S110587-Monomer
<41>> (#^catalyzes *)
:: #$Enzrxn-491
<42>> (#^reaction *)
:: #$Pepdephos-Rxn
<43>>> (#^left *)
:: (#$Pyruvate #$Atp)
<44>>> (defun extract-reaction (gene)
   (ignore-errors (let ((reaction (#^reaction (#^catalyzes (#^product gene)))))
      (list gene (#^left reaction) (#^right reaction)))))
:: EXTRACT-REACTION
<45>> (mapcar #'extract-reaction (hop 38))
:: ((#$sll0587 (#$Pyruvate #$Atp)
  (#$Phospho-Enol-Pyruvate #$Adp #$PROTON))
 NIL
 (#$slr1096 (#$Red-Dihydrolipoamide #$NAD)
  (#$0x-Lipoamide #$Nadh #$PROTON))
 (#$sll0018 #$Fructose-16-Diphosphate
  (#$Dihydroxy-Acetone-Phosphate #$GAP))
 NIL NIL (#$slr0752 #$2-Pq (#$Phospho-Enol-Pyruvate #$WATER))
 (#$slr0783 #$GAP #$Dihydroxy-Acetone-Phosphate)
 (<u>#$sll1275</u> (<u>#$Pyruvate</u> #$Atp)
  (#$Phospho-Enol-Pyruvate #$Adp #$PROTON))
 (#$slr1945 #$G3p #$2-Pq)
```

"Runnable" Biochemistry

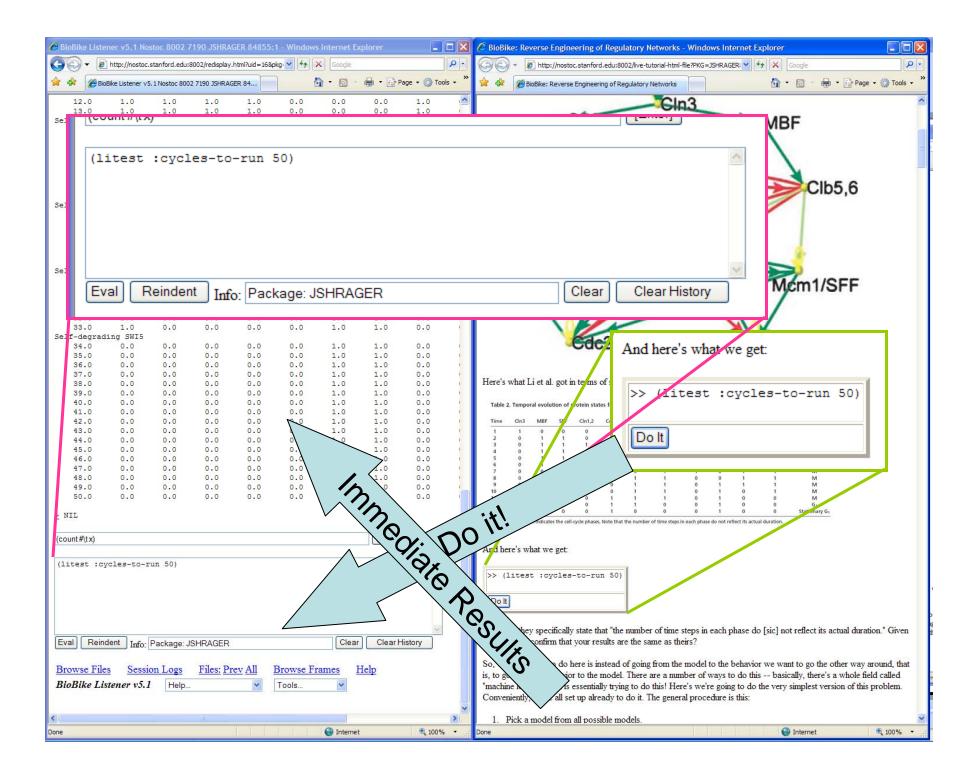
```
<98>>> (defun run-chemistry (reactions env)
  (loop with old-env = env
        as new-env = (new-environment reactions old-env)
        until (equal new-env old-env)
        do (setq old-env new-env)
         (print new-env)
        finally (return new-env)))
:: RUN-CHEMISTRY
<99>>> env
:: (#$G3p #$Atp)
<100>> rs
:: (#$sll0587-reaction #$slr1096-reaction #$sll0018-reaction
 #$slr0752-reaction #$slr0783-reaction #$sll1275-reaction
 #$slr1945-reaction #$slr0884-reaction #$sll1342-reaction
 #$slr1349-reaction #$slr0943-reaction #$slr0394-reaction)
<101>> (run-chemistry rs env)
2.2
(#$Adp #$DPG #$2-Pq #$G3p #$Atp)
(#$WATER #$Phospho-Enol-Pyruvate #$Adp #$DPG #$2-Pg #$G3p #$Atp)
(#$WATER #$Phospho-Enol-Pyruvate #$Adp #$DPG #$2-Pg #$G3p #$Atp)
```

Additional KnowOS Features

- Multi-headed multi-threaded architecture
- Built-in (nascent) electronic lab notebook
- Easily access other web-based DBs
- Integrated file system
- Easily integrate any new (linux based) tools
- Easily integrate new knowledge or data
- Complete OO programming model
- Fully compiled language
- Program development tools (editors, debuggers, etc.)
- Easy to deploy functions as new web services
- Online "Live Tutorials" provide a complete biocomputing course!
- Totally open source freeware

Live Tutorials (A Course in Symbolic BioComputing)

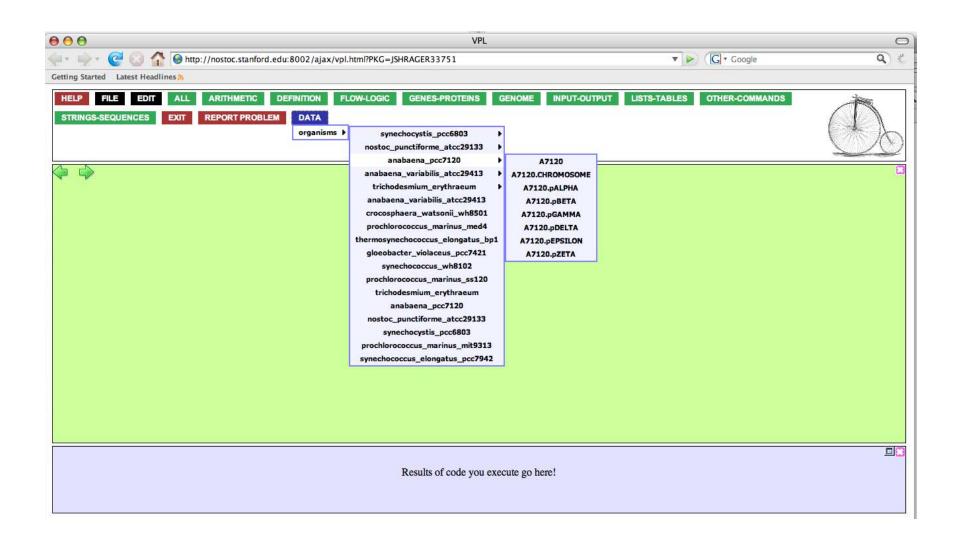
<u>11</u>	
Name	Description
A Tour of BioBike	Getting one's feet wet with BioLisp and the BioBike Listener
Lisp I: Evaluation	The basics of Lisp evaluation.
Lisp II: Data and Iteration	Lisp data structures and iteration (loops).
Functions	An important little Lisp lesson.
Tables	Working with data tables
Biocomputing I	Compring gene function across organisms using annotation and microarrays
<u>Graph R&R</u>	Representation and Reasoning about Graphs.
<u>GO Analysis I</u>	Simple symbolic biocomputing based on the Gene Ontology
Microarray Analysis	Simple microarray data clustering
Metabolic Simulation I	Introduction to dynamic analysis of metabolic pathways
Metabolic Simulation II	Dynamic pathway analysis using the Gene Ontology knowledge base
Regulation Simulation	Simulating the cell cycle (based upon a 2004 PNAS publication)
Natural Language I	Extracting biological relationships from PubMed using simple statistics
Functional Phylogeny	Exploring phylogeny based upon gene function
Model Discovery I	Reverse engineering of regulatory networks
Model Discovery II	Model discovery through partial correlations in microarray data
Reasoning Intro	Introduction to automated reasoning using Snark
More BioReasoning	Re-understanding the Elhai problem in reasoning terms
Complex Regulatory Reasoning	Using Snark to reason about the cell cycle

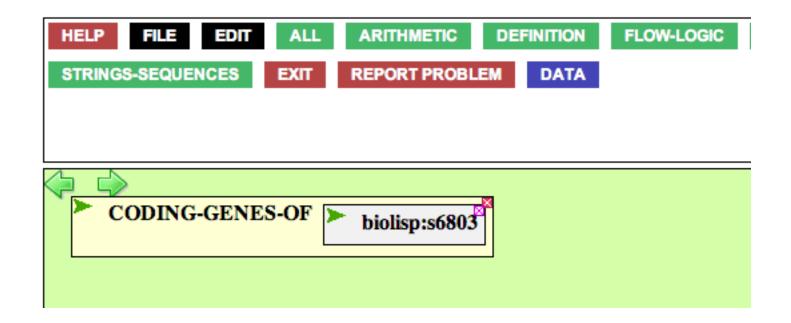


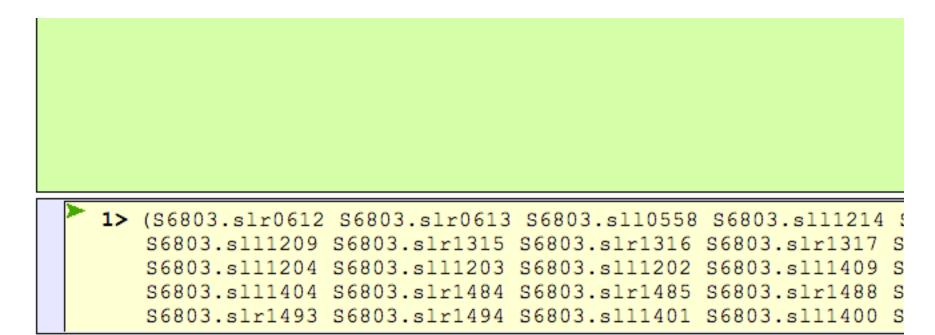
On Beyond Programming...

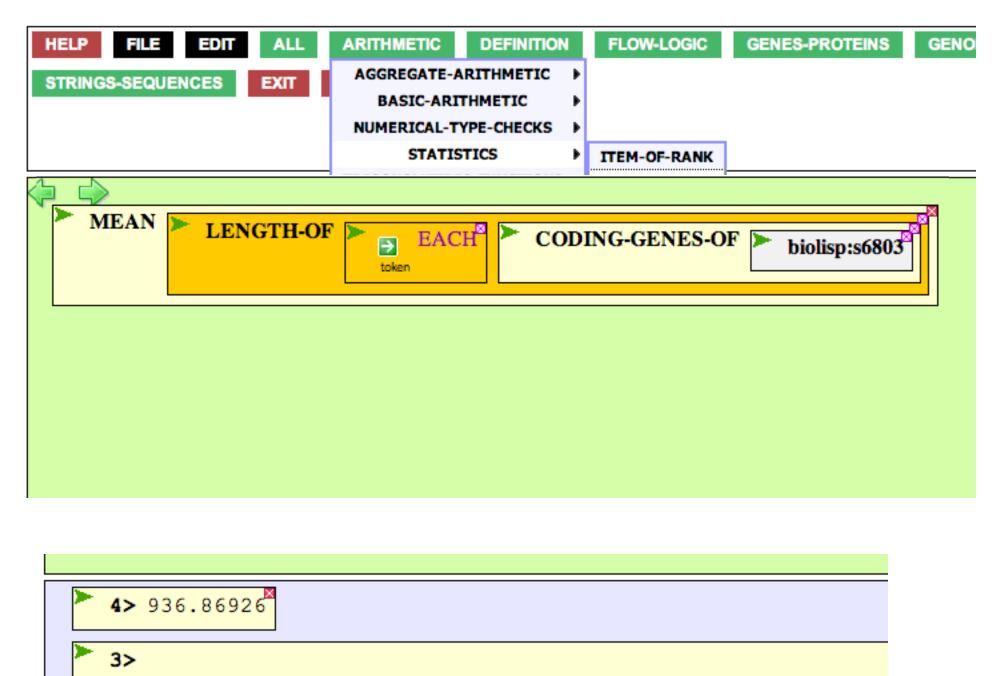
- -- Visual Programming
- -- Deductive biocomputing
- -- Natural language biocomputing

BioBike Visual Programming Language

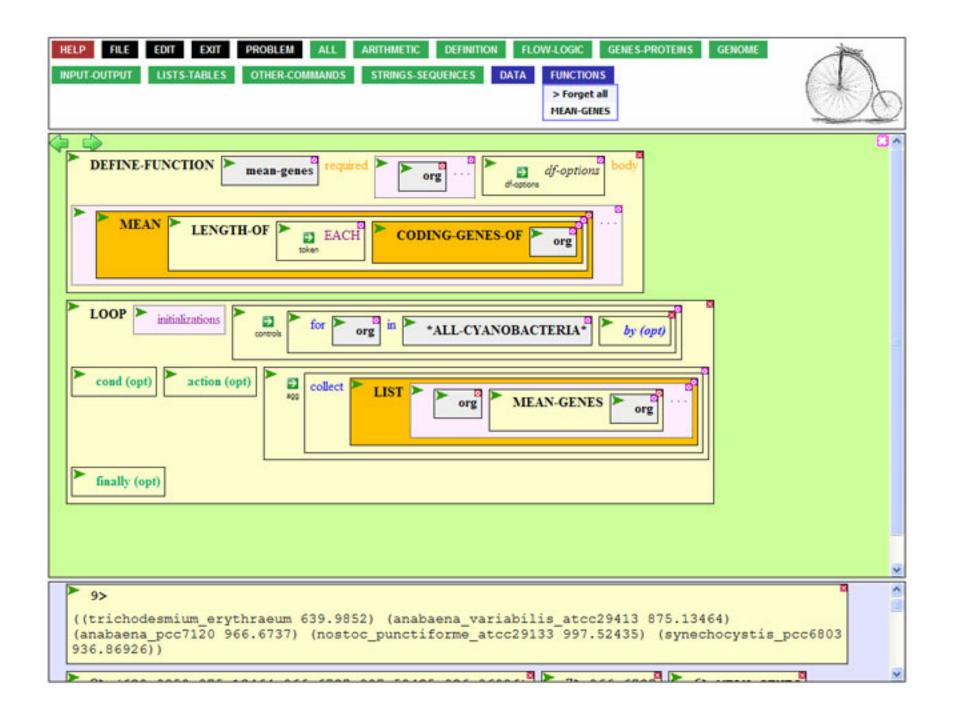




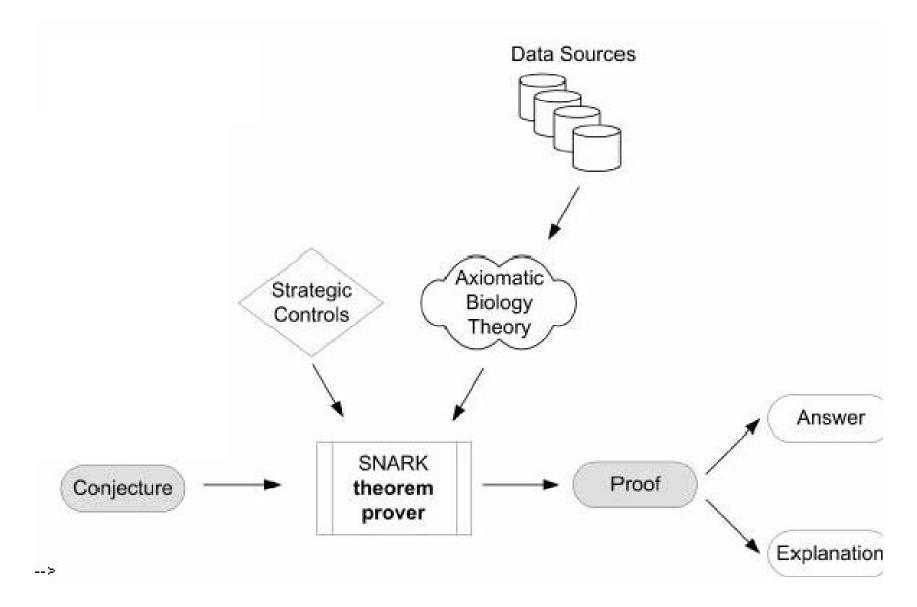




(693 522 702 1077 939 1089 1083 1980 2010 609 1032 1050 807



Toward semi-automatic programming (BioDeducta)

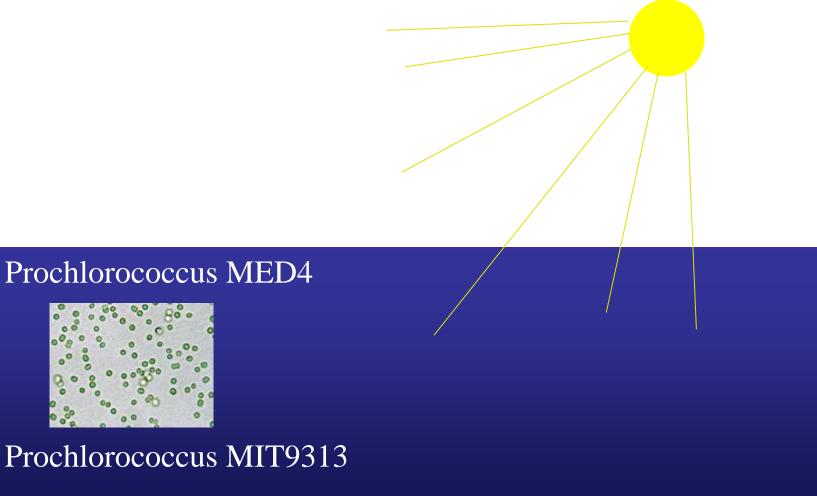


What Biologists Want To Compute

Knowledge Search: What do we know about this Gene, Pathway, System, Organism, ...?
Comparison: How are these organisms similar?
Model Identification: What models fit this data?
Model Analysis: What does this model predict?
Annotation: What does this gene do?

Use and Share Results.

How do cells control response to light? I.e., What genes are related to the adaptation to high light?



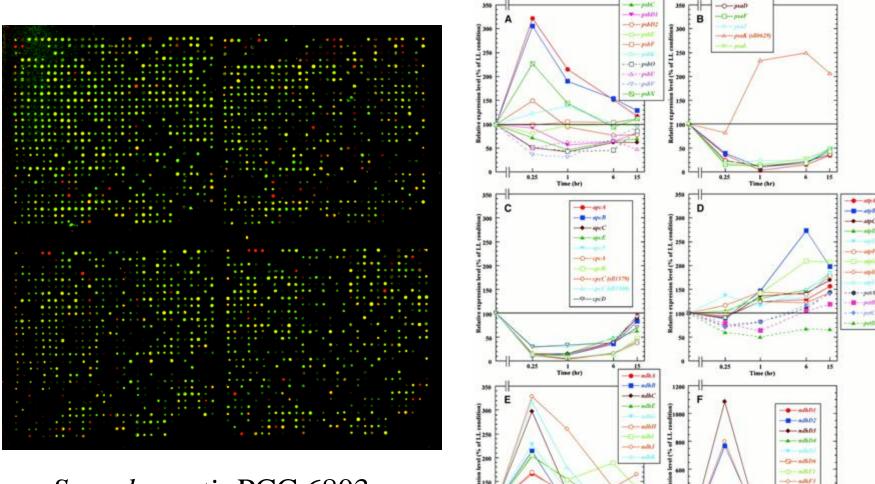
Hihara, Kamei, Kanehisa, Kaplan, and Ikeuchi (2001) DNA microarray analysis of cyanobacterial gene expression during acclimation to high light. Plant Cell, 13(4)

+ phil

-mall

0.25

I Time (hr)



6.25

Time (hr)

15

Synechocystis PCC 6803

How do cells control response to light?

I.e., What genes are related to the adaptation to high light?

Outline Protocol

Look for:

- <u>Gene present in *Prochlorococcus* MED4</u> MED4 is naturally adapted to grow in high light.
- <u>Ortholog absent in *Prochlorococcus* MIT9313</u> MIT9313 is naturally adapted to grow in low light
- <u>Ortholog present in *Synechocystis* PCC 6803</u> In order to make contact with annotation and microarray data
- <u>Synechocystis PCC 6803 ortholog responds to high light</u> Gene turns on by factor > 2 in response to high light

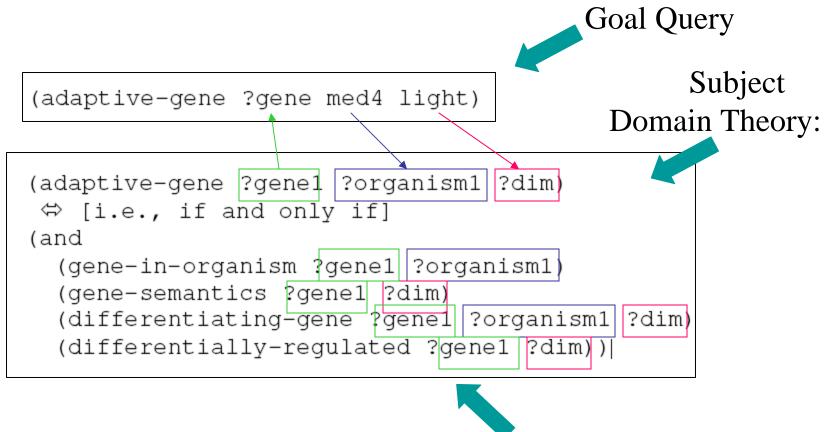
The Prime Directive (first clause):

All data and knowledge can be manipulated by user-written programs that approximate user's natural protocols.

BioBike program:

Language for Expressing Conjectures, and Platform for Analysis

- A. First Order Logic (FOL) representation
- B. Subject Domain Theory
- C. Biological Process (and entities) Ontology
- D. Visual query language.



Subject Domain Theory

(experiment hihara :dimension light :organism s6803)

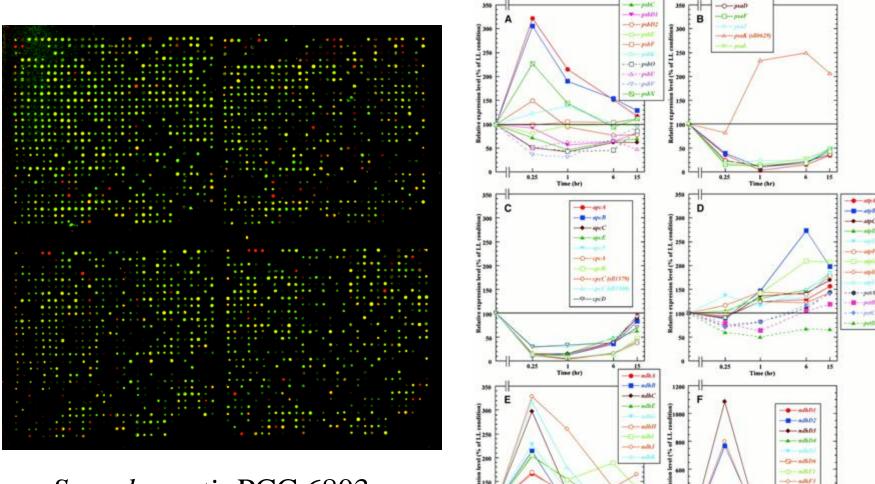
Hihara, Kamei, Kanehisa, Kaplan, and Ikeuchi (2001) DNA microarray analysis of cyanobacterial gene expression during acclimation to high light. Plant Cell, 13(4)

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0.25

I Time (hr)



6.25

Time (hr)

15

Synechocystis PCC 6803

Goal Query: (adaptive-gene ?gene med4 light)

Result:

```
?gene: #$PMED4.PMM0817
?organism2: #$prochlorococcus_marinus_mit9313
?experiment: HIHARA
?organism3: #$synechocystis_pcc6803
?gene3: #$S6803.ssr2595
```

I.e., A low-light organism that has no ortholog to ?gene is prochlorococcus marinus pcc. 9313. Experiments were performed by Hihara on the organism synechocystis pcc 6803, and a high regulation ratio was discovered in those experiments on gene S6803.ssr2595, which is an ortholog of PMM0817. The annotation for PMM0817 reads: "possible high-light inducible protein".

(Matches the results from: Bhaya, Dufresne, Vaulot, and Grossman: Analysis of the hli gene family in marine and freshwater cyanobacteria. FEMS Letters, 2002, 205(2). PMM0817 is called hli17 in this paper.)

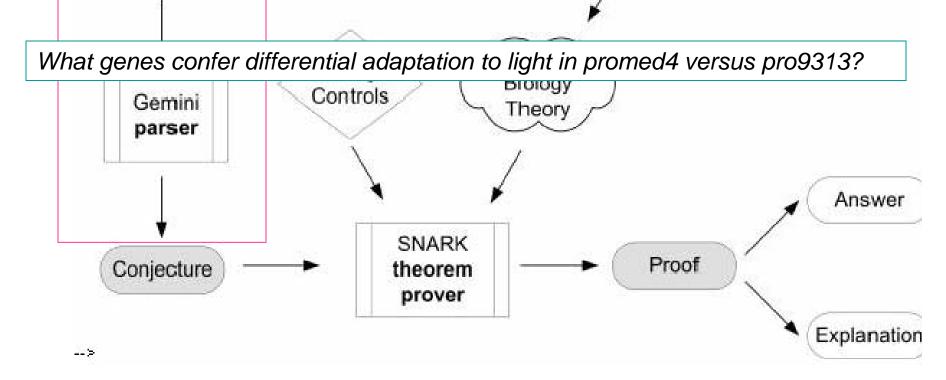
Natural Language Biocomputing

"Does pmm0226 not have an ortholog in mit9313?"

"What is the Hihara mean regulation ratio of pmm0226?"

Data Sources

List the genes that pertain to med4 and that have an ortholog in s6803 that has a hihara ratio greater than 2 and that do not have orthologs in mit9313.



What Biologists Want To Compute

Knowledge Search: What do we know about this Gene, Pathway, System, Organism, ...?Comparison: How are these organisms similar?Model Identification: What models fit this data?Model Analysis: What does this model predict?Annotation: What does this gene do?

Use and Share Results.



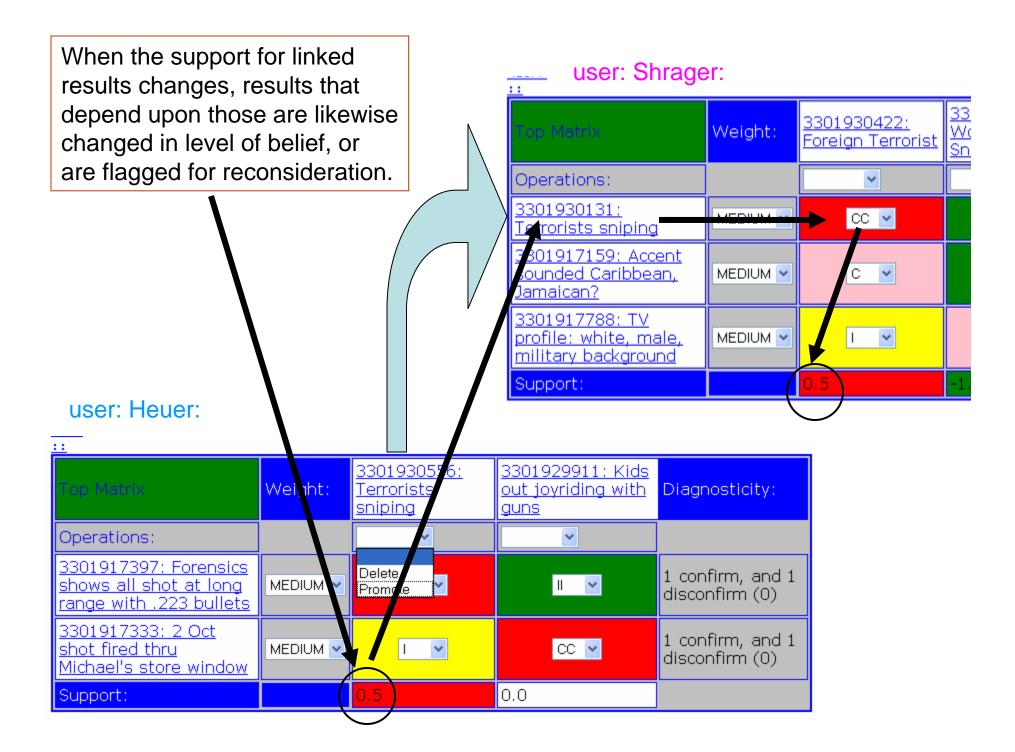
Scientists can "promote" hypotheses as if they were results, and other scientists can import these. The system automatically tracks provenance (code+params, or BioDeducta "explanations") to build a network of support.

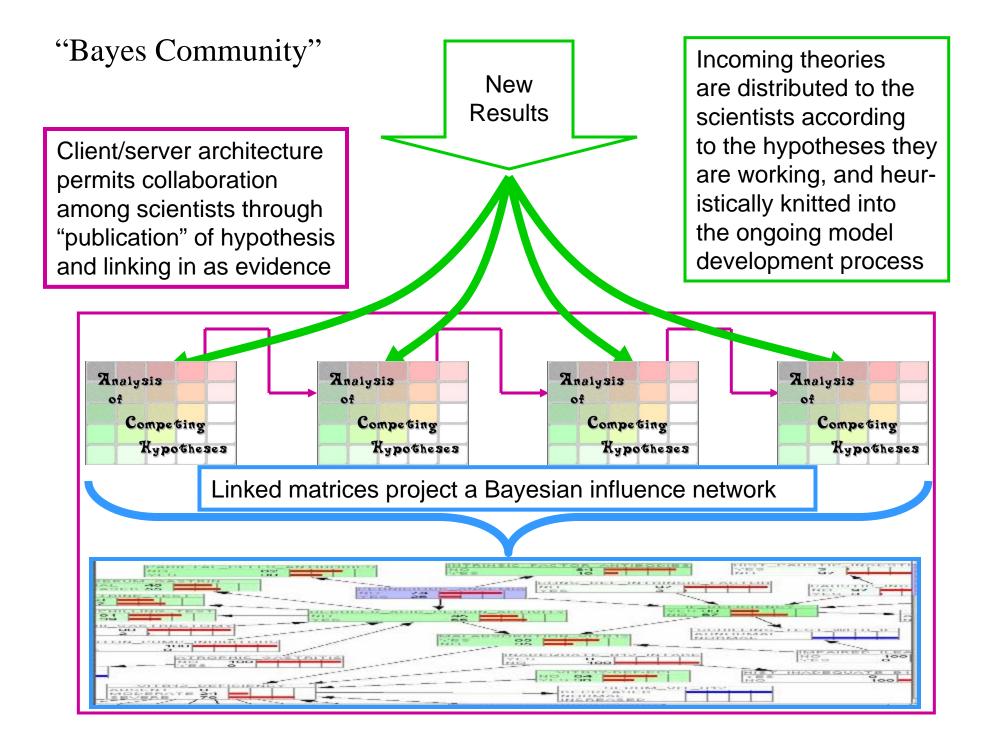
user: Heuer:

11

	user: Shrager:							
\setminus	Top Matrix	Weight:	<u>3301930422:</u> Foreign Terrorist	<u>33</u> W(Sn				
	Operations:		~					
	<u>3301930131:</u> Terrorists sniping	MEDIUM 💌	CC 💌					
	<u>3301917159: Accent</u> <u>sounded Caribbean,</u> Jamaican?	MEDIUM 💌	C 💌					
	<u>3301917788: TV</u> profile: white, male, military background		I 💌					
	Support:		0.5	-1.				

Top Matrix	Weight:	<u>3301930556:</u> <u>Terrorists</u> <u>sniping</u>	<u>3301929911: Kids</u> out joyriding with guns	Diagnosticity:
Operations:		~	~	
<u>3301917397: Forensics</u> shows all shot at long range with .223 bullets		Delete Promote	11 💌	1 confirm, and 1 disconfirm (0)
<u>3301917333: 2 Oct</u> <u>shot fired thru</u> <u>Michael's store window</u>		I 💌	CC 💌	1 confirm, and 1 disconfirm (0)
Support:		0.5	0.0	





Goal: Enable biologists to carry out novel, complex, knowledge-based computations themselves.

Approach: Make complex biocomputing easier for biologists.

How?

Provide a uniform programming interface... Using a simple, interactive, paradigm... To a programmable data/knowledge base... With all the relevant data/knowledge preloaded... And all the relevant tools (incl. advanced ones)... And intelligent semi-automatic programming tools... In a biological community... All through the web. Goal: Enable biologists to carry out novel, complex, knowledge-based computations themselves.

How: KnowOS/BioBike/BioDeducta/CACHE

Who?

Primarily: JP Massar, Mike Travers, Jeff Elhai, Richard Waldinger, & John K. Myers

With: Bob Haxo, Andrew Pohorille, Mark Slupesky, Mark Stickel, The labs of Devaki Bhaya, Pat Langley & Arthur Grossman, Numerous students.

Funding: NASA, NSF, ONR, ARDA, & sweat equity

Goal: Enable biologists to carry out novel, complex, knowledge-based computations themselves.

How: KnowOS/BioBike/BioDeducta/CACHE

Where?

www.biobike.org, <u>www.knowos.org</u>, biolingua.sourceforge.net Massar, et al. (2005) Bioinformatics, 21(20)

Also:

Fedoroff, et al. (2006) The Scientist, 19(11) Travers, et al. (2005) ILC (KnowOS) Shrager, et al. (2002) PSB Shrager, (in press) J. Hist. and Phil. of Science Shrager, et al. (in press) PLoSOne (BioDeducta)

KnowOS Computational Architecture

Web Interactivity Layer							
	CACHE Distributed BioBike Biological Othe Analytical Framework				er Apps.		
Allegro CL Environment				Snark			
Knowledge Frame System					Theorem Prover		
AllegroCache OODB							
Data Adapters							
Local DBs (e.g., Relational)	Star	ndard Domain-Specific To	ools		Remote DBs		

BioBike v. Bio{PERL|Python|Java|...}

- Local Knowledge Warehousing (in memory or local databases).
- Knowledge Integrated through a Frame System.
- Intended to be programmed by biologists themselves.
- Tools and commonly used KBs are locally pre-integrated.
- Complete Web-based programming environment.

- Data accessed remotely or in random local files.
- Data integration usually haphazard (per application).
- Intended to be programmed by engineers.
- Tools and required KBs must be hand installed.
- Piecemeal local programming tools.

BioBike v. BioPerl (in The SEED)

```
      SEED Version:
      Challenge problem:

      for i in `pegs $1`
      Find 100 bp of sequence upstream from a set of orthologs for all genes in an organism and align them.

      do
      (echo "$i"; echo "$i" | similar_to 1.0e-50 | is_prokaryotic | head -n

      40 )
      | upstream upstream=100 plus=10 | tr -d A-Z >

      "Output-intergenic.$1/$i.fasta"
      cd Output-intergenic.$1; clustalw -infile=$i.fasta -align > /dev/null cd ...

      echo $i
      done
      (by Rick Stevens, co-developer of The Seed)
```

BioLingua-Lite version:

```
(FOR-EACH gene IN (GENES-OF Npun)
AS orthologs = (ORTHOLOGS-OF gene)
AS upstream-seqs = (SEQUENCES-UPSTREAM-OF orthologs LENGTH 100)
COLLECT (ALIGNMENT-OF upstream-seqs))
(by Jeff Elhai, developer of BioLite)
```