

Advances in Bioinformatics

2002-2007

Jaak Vilo
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[**http://biit.cs.ut.ee**](http://biit.cs.ut.ee)



Timeline 2002-2007

- 2002 July – move to Estonia (EGeen Inc; EBC)
- 2003 Start teaching at UT
- 2004/09 Docent (0.5) at university
- 2006/01 Senior Researcher
- 2007/12 Professor
- BIIT has now (Jan 2008)
 - 1 postdoc
 - 1 guest lecturer
 - 10 PhD students
 - 10+ students

Year	BSc	MSc
2003	2	0
2004	6	1
2005	9	1
2006	4	3
2007	4	3
Total	25	8

Research Focus

- Algorithms (Data Mining & Bioinformatics)
 - Tools (web based)
 - Databases & information systems
-
- Gene regulation & Systems Biology
 - Cancer; Stem Cells;
 - Microarray & other high-throughput data

Grants and Projects Completed

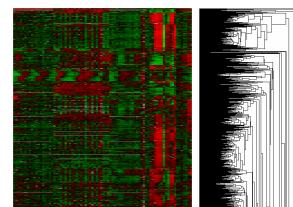
- BiGeR [Estonian Science Foundation](#) ETF5724 (2003-2007) Estonian Biocentre
Eesti Biokeskus, Riba 23b Tartu 51010 Estonia
- DMMA [Estonian Science Foundation](#) ETF5722 (2003-2006)
- "Base funding" (start-up grant for a new research group) from University of Tartu (2005-2006)
- ATD, [Alternative Transcript Diversity](#), EU FP6 STREP (2004-2007) LSHG-CT-2003-503329 Estonian Biocentre
Eesti Biokeskus, Riba 23b Tartu 51010 Estonia
- FunGenES, [Functional Genomics of Embryonic Stem Cells](#): EU FP6 Integrated Project, subcontractor (2006-2007). LSHG-CT-2003-503494 QureTEC
- [Baltic GRID](#) non-funded partner

Current grants and projects

- **COBRED** -- Colon and Breast cancer Diagnostics (2007-2010) EU FP6 STREP, LSHB-CT-2007-037730
- **ENFIN**, Enabling Systems Biology. EU FP6 Network of Excellence (2005-2010) LSHG-CT-2005-518254 **QureTEC**
- **ESNATS**, Embryonic Stem Cell-Based Alternative Testing Strategies. Duration of Project: 5y (2008-2013). Currently under negotiation. **QureTEC**
- Target funding (2006-2011), The methods, environments, and applications for solving large and complex computational problems. ([SF0182712s06](#))
- ETF7437 (2008-2011) Multi-experiment gene expression data matrix analysis (MEM) ([Abstract](#))
- Estonian Language Technology Research Programme: Dictionary informatics (information retrieval) (2005-2008)

Fast Approximate Hierarchical Clustering using Similarity Heuristics

Hierarchical clustering is applied in gene expression data analysis, number of genes can be 20000+



Hierarchical clustering: Each subtree is a cluster.

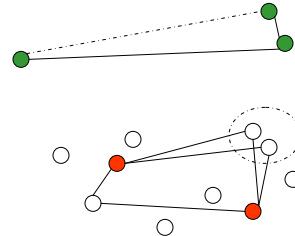


Hierarchy is built by iteratively joining two most similar clusters into a larger one.

Fast Hierarchical Clustering

Avoid calculating all $O(n^2)$ distances:

– Estimate distances



– Use pivots

– Find close objects

– Cluster with partial information

Meelis Kull

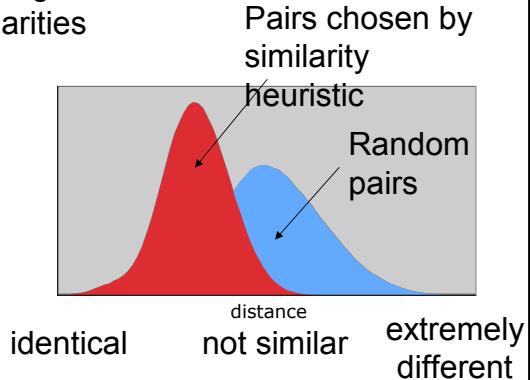


Approximate Hierarchical Clustering

- Full hierarchical clustering calculates similarities of each object with every other object (SLOW)

- Our approximate clustering calculates a small fraction of all similarities

- We have developed heuristics to find pairs of similar objects efficiently



Biological relevance

- Enrichment of (any) biological function in a cluster
- Find all enrichments in full clustering, compare quality

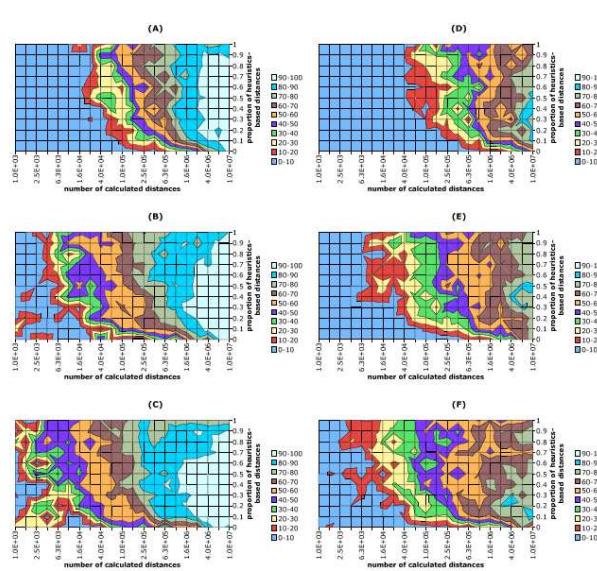
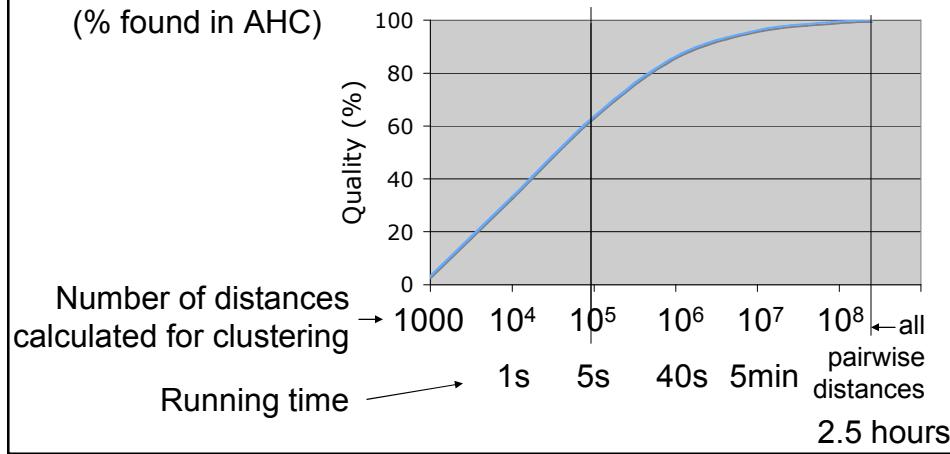
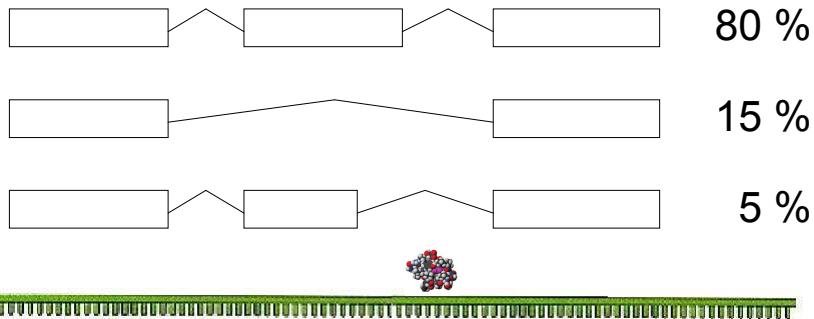
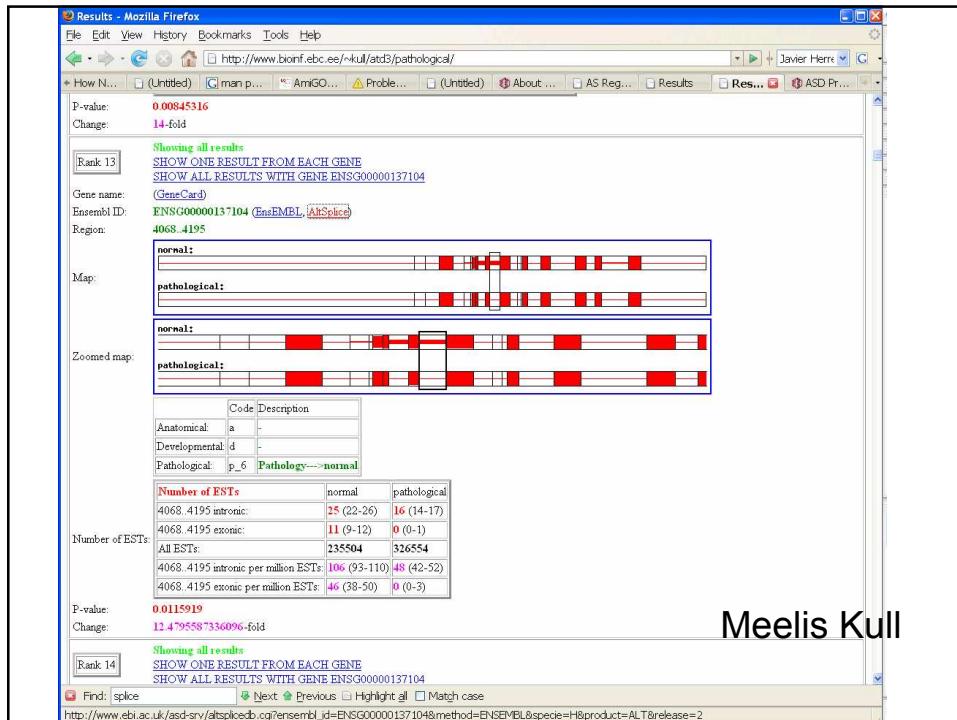


Fig. 4. GO50 and GO25 quality of HappieClust for different numbers of pivots. (A) $q = 5$, GO50; (B) $q = 10$, GO50; (C) $q = 20$, GO50; (D) $q = 5$, GO25; (E) $q = 10$, GO25; (F) $q = 20$, GO25.

Find disease-specific gene variants

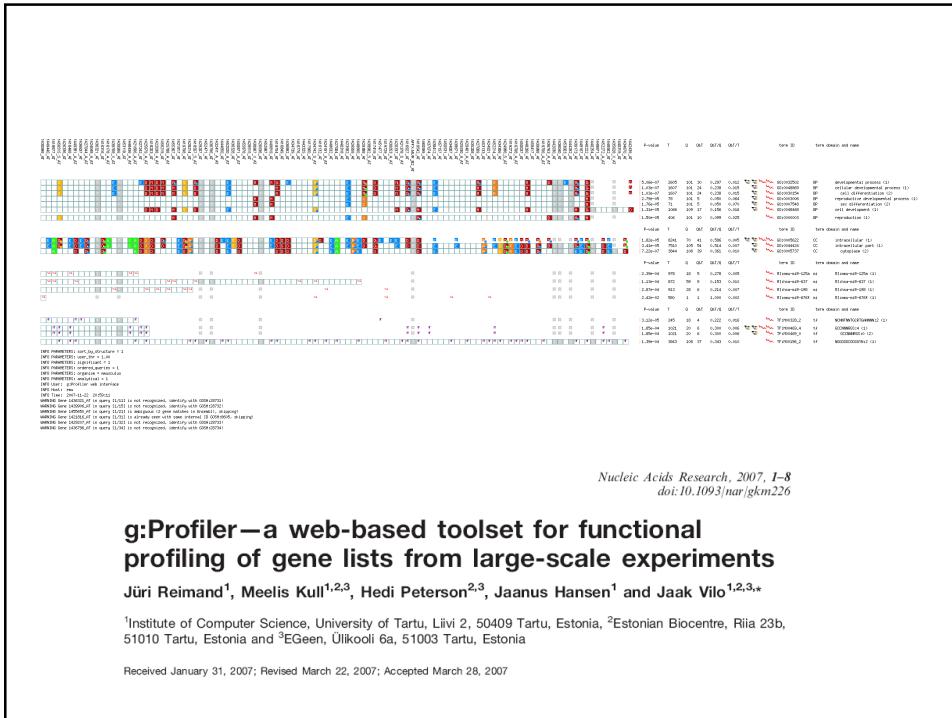


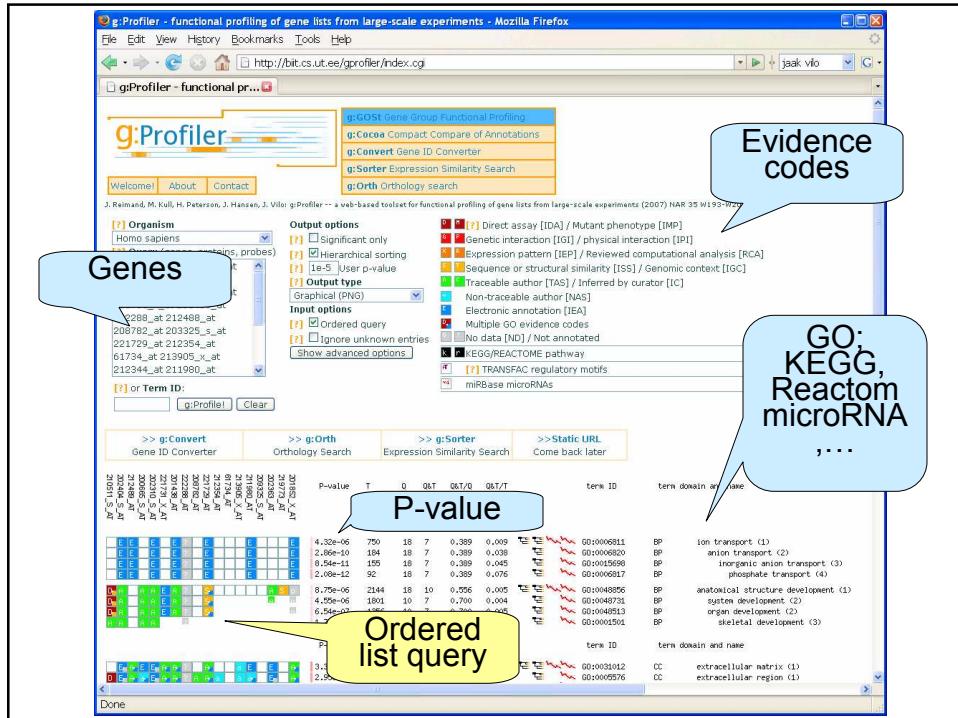
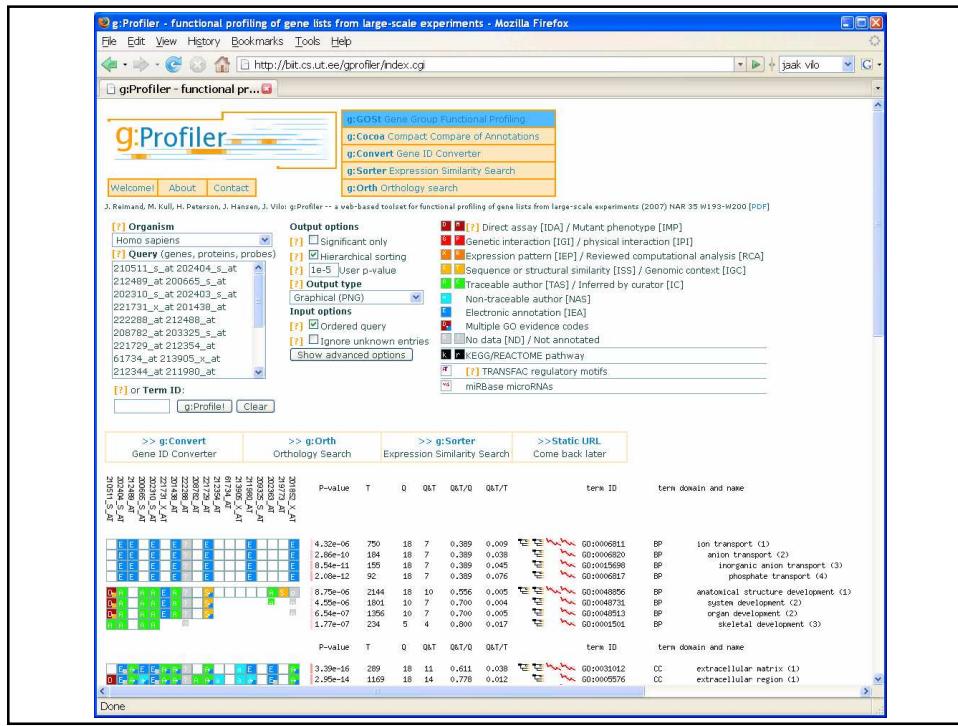
Proteins can affect splicing by taking part in or interacting with the splicing complex

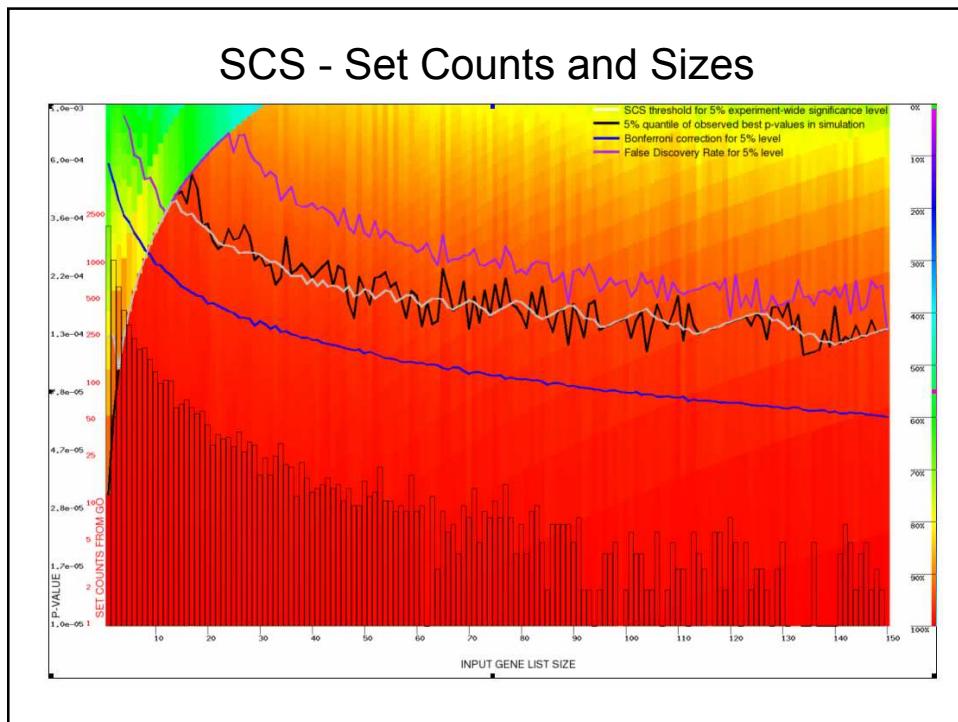
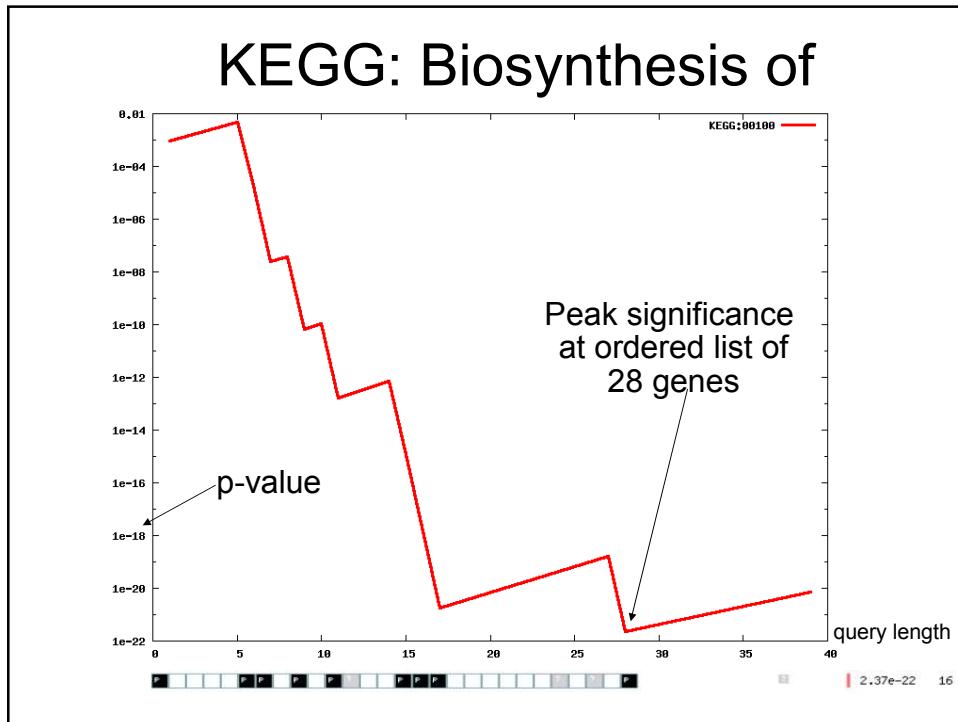


Tools: g:Profiler

- Characterise gene lists
- Manipulate gene ID-s
 - synonyms
 - orthologs
- Fast, rich GUI, public easy free access
- Machine-readable outputs (for integration)







27	7	1.76e-11	581		60:0007155	BP	cell adhesion (1)
	3	4.46e-05	23		60:0006775	BP	fat-soluble vitamin metabolic process (1)
	3	2.06e-05	16		60:0006776	BP	vitamin A metabolic process (2)
	7	2	1.44e-05	49	60:0045997	BP	positive regulation of cell differentiation (1)
	13	5	5.92e-06	173	60:0045892	BP	negative regulation of transcription, DNA-dependent (1)
	7		4.21e-06	41	60:0043406	BP	positive regulation of MAPK activity (1)
	42	13	4.60e-08	4145	60:0065097	BP	biological regulation (1)
	42	13	3.56e-07	3834	60:0065079	BP	regulation of biological process (2)
	14	24	4.37e-06	895	60:0048519	BP	negative regulation of biological process (3)
	13	43	7.19e-15	19	60:0065092	BP	developmental process (1)
	12	23	2.48e-04	1733	60:0048509	BP	anatomical structure development (2)
	2	2	3.95e-05	11	60:0048503	BP	anatomical structure morphogenesis (2)
	2	3	3.95e-05	57	60:0001763	BP	morphogenesis of a branching structure (3)
	2	3	2.44e-05	53	60:0048704	BP	branching morphogenesis of a tube (4)
	20	11	3.94e-05	437	60:0032989	BP	cellular structure morphogenesis (3)
	20	11	3.94e-05	437	60:0000902	BP	cell morphogenesis (4)
	5	14	2.95e-07	185	60:0048646	BP	anatomical structure formation (2)
	19		3.93e-08	252	60:0065093	BP	regulation of developmental process (2)
	13	35	8.39e-14	1937	60:0007275	BP	multicellular organismal development (1)
	5	11	4.54e-05	398	60:00009790	BP	embryonic development (2)
	5	9	3.24e-06	189	60:00007389	BP	pattern specification process (2)
	7		2.39e-06	139	60:0048502	BP	regionalization (3)
	5	11	3.24e-06	69	60:0000979	BP	regionalization, anterior pattern formation (4)
	5	11	3.74e-06	144	60:0003295	BP	tube development (2)
	11	27	1.95e-11	1491	60:0048731	BP	system development (2)
	6	24	3.42e-10	1202	60:0048513	BP	organ development (3)
	6	16	1.72e-08	207	60:0001944	BP	vasculature development (4)
	6	16	1.43e-08	204	60:0001568	BP	blood vessel development (5)
	7	14	8.25e-08	441	60:0009887	BP	organ morphogenesis (4)
	5	13	3.24e-08	177	60:0048514	BP	blood vessel morphogenesis (5)
	11	10	3.15e-06	139	60:00001525	BP	angiogenesis (6)
	19	23	5.05e-08	1607	60:0048869	BP	cellular developmental process (1)
	19	23	5.05e-08	1607	60:00001514	BP	cell differentiation (2)
	41	40	3.12e-08	3490	60:0048523	BP	regulation of cellular process (1)
	6	15	6.23e-06	836	60:00003996	BP	regulation of cellular process (2)
	5	15	6.23e-07	78	60:00003996	BP	regulatory developmental process (1)
	5	15	5.82e-06	71	60:0007548	BP	sex differentiation (2)
	14	15	5.72e-06	1066	60:0048468	BP	cell development (1)
	7	18	3.91e-06	226	60:0007167	BP	enzyme linked receptor protein signaling pathway (1)
	12		7.64e-06	151	60:0007169	BP	transmembrane receptor protein tyrosine kinase signaling pathway (2)
	24	6	7.26e-11	647	60:0002376	BP	immune system process (1)
	13	6	4.08e-06	370	60:0006952	BP	defense response (1)
	2	14	2.22e-07	336	60:0042224	BP	response to chemical stimulus (1)
	12		1.29e-07	226	60:0001775	BP	cell activation (1)
	14		3.39e-06	210	60:0045329	BP	leukocyte activation (2)
	9	20	5.47e-06	455	60:0040025	BP	response to external stimulus (1)
	22		1.27e-06	280	60:0007610	BP	behavior (1)
	22		6.57e-07	177	60:0007626	BP	locomotor behavior (2)
	4	11	2.37e-10	101	60:0042330	BP	toxic (3)
	4	11	2.37e-10	101	60:0006935	BP	chemotaxis (4)
	15	5	2.34e-07	412	60:0006955	BP	immune response (1)
	15	5	1.58e-07	277	60:0009611	BP	response to wounding (1)

Data Analysis Environments

- FunGenES consortium – data analysis environment
- ~10 labs produced 150+ conditions (3-5x)
 - Affymetrix Gene Chips (22,000 probesets; ~30MB file each)
 - Normalise, extract data for analysis
 - study, analyse, visualise, ...
 - compare
- Clustering, visualisation, searching, etc.

FunGenES project @ Tartu - Mozilla Firefox

File Edit View History Bookmarks Tools Help

http://bit.cs.ut.ee/fungenes/

FunGenES project @ Tartu FunGenES article supplement...

FunGenES

Functional genomics in Embryonic Stem Cells

g:Profiler

g:Profiler
g:Orth
g:Convert

Visualize the gene list

Heatmapper
URLMAP

KEGG pathway animations

KEGG animations

Supplementary for common publication

Database
Clusterings
Individual datasets
Global datasets

Expression waves

Similarity cutoff 0.8
Similarity cutoff 0.85

FunGenES project data analysis

g:Profiler

g:Profiler
g:Orth
g:Convert

Tools for functional analysis of gene sets, converting gene identifiers and finding orthologs..

Visualize the gene list

Heatmapper

Tool that visualizes the expression of genes over all FunGenes datasets.

Expression waves

Description Methods

Similarity cutoff 0.8
Similarity cutoff 0.85

Expression clusters of up or down regulated genes during ES cell differentiation and their corresponding mirror image clusters.

KEGG pathway animations

KEGG animations

FunGenes profiling data organized as animated gene expression changes in KEGG pathways.

Supplementary for the article

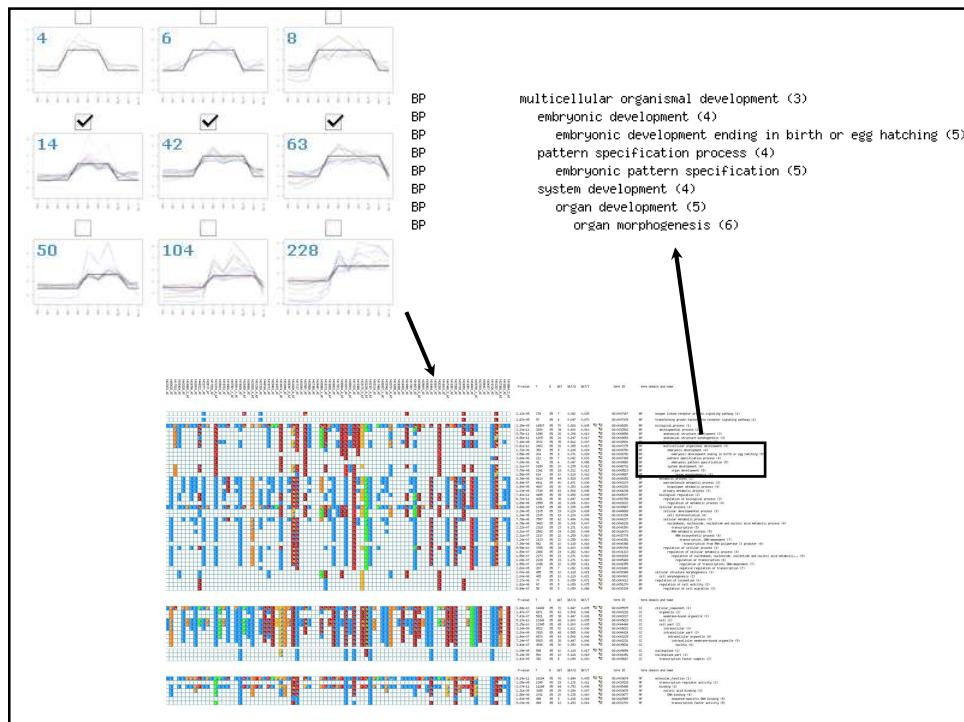
Database

Supporting website for common publication.

Clusterings

Clusterings of individual datasets
Clusterings of global datasets
Clusterings of the FunGenES data. Individual datasets and global combinations of those.

Find: Next Previous Highlight all



Regulators for ES gene clusters

DELETED

FunGenES

- Analysed data for 4-5 groups; others used web
- 4 people visited Estonia (for a week) to analyse their data
- Consortium data – public analysis environment
- Couple of leads in functional validation

Tools: KEGGanim

- Animate large-scale mRNA, proteomics, metabolomics data on KEGG pathways
- Create visualisations
 - animations
 - freeze panels
- Manipulate private data

The screenshot shows the KEGGanim software interface. At the top, there's a menu bar with options like Find in page, Find next, Voice, Author mode, Show images, Fit to width, and a zoom level of 70%. Below the menu is a toolbar with buttons for DATASET, PATHWAY, and ANIMATE. The main window is divided into several sections:

- DATASET:** A section for selecting an existing high-throughput dataset or managing/uploading own datasets using RDEDM.
- PATHWAY:** A section for selecting a KEGG pathway to animate, with a dropdown menu showing available pathways for the current dataset.
- ANIMATE:** A section for creating fixed images from animations, with options for Conditioned and Unconditioned animations.
- Animation filters:** Options for Pathway component animation, Conditioned animation, and Unconditioned animation.
- View animation:** A preview area showing a metabolic pathway diagram for "D-ALANINE METABOLISM". The diagram includes various enzymes, substrates, and products, with some components highlighted in red. A legend at the bottom left identifies these colors: blue for Enzyme, green for Substrate, red for Product, and grey for Inhibitor.

On the right side of the interface, there is a citation:

biit.cs.ut.ee/KEGGanim
Adler et al
Bioinformatics, 2007

Below the citation, there is a descriptive text:

Overlay HT data over KEGG pathways

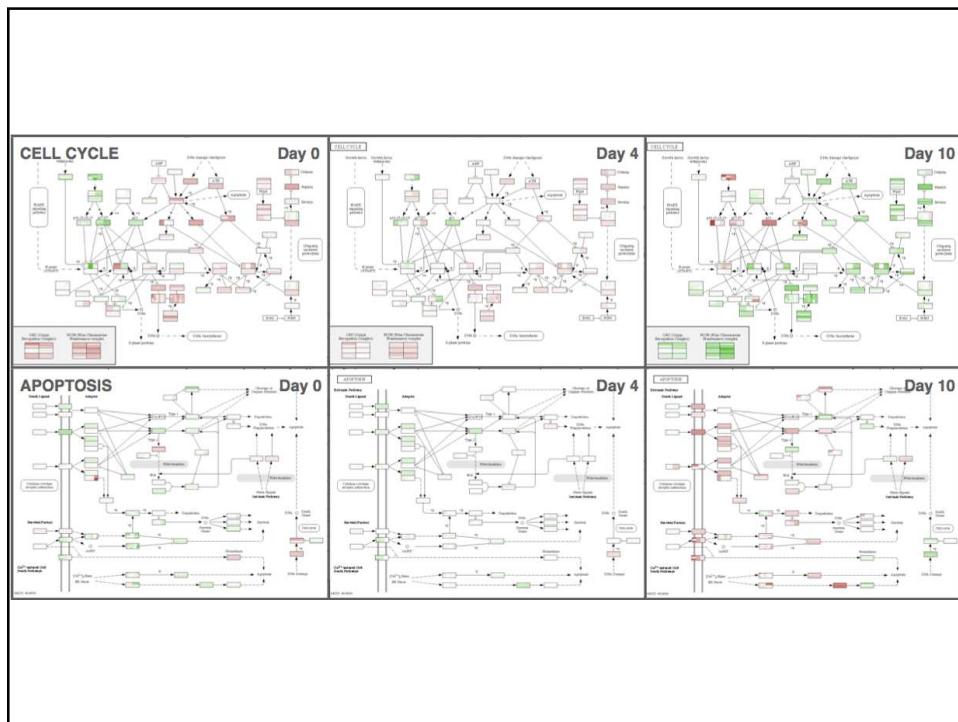
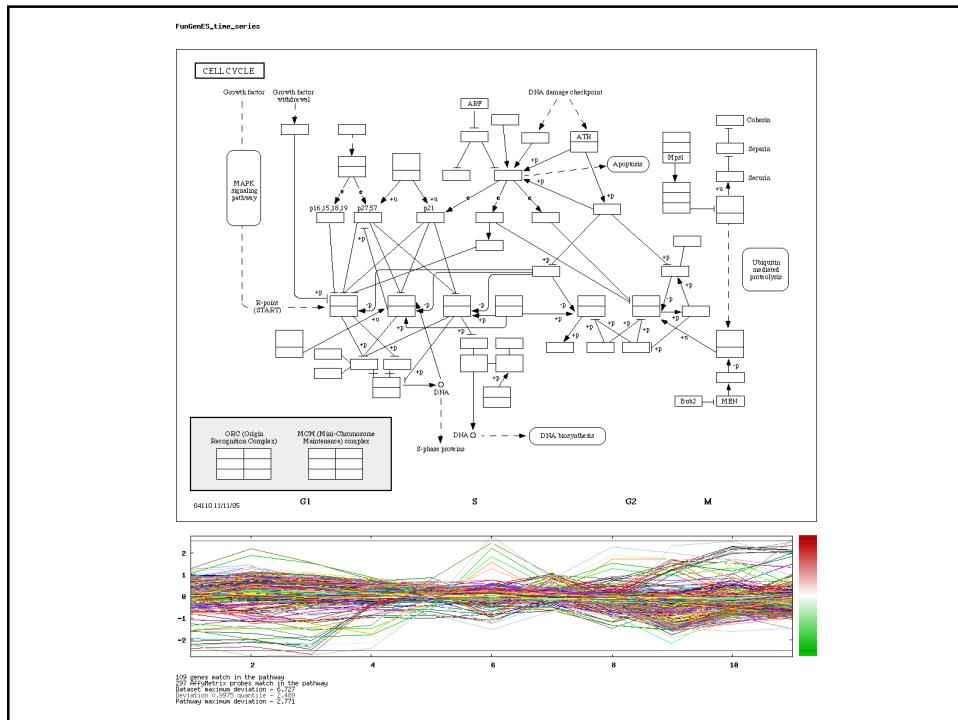
- Animate
- “Freeze panes” (cinefilm)

At the bottom right, there is a copyright notice:

BIOINFORMATICS
Vol. 23 no. 00 2007
Pages 1–2

KEGGanim: pathway animations for high-throughput data
Pirill Adler ^a*, Jüri Reimand ^b, Jürgen Jänes ^b, Raivo Kolde ^c, Hedi Peterson ^{ac}, Jaak Vilo ^{ab†}

^aEstonian Biocentre, Riia 23b, Tartu, Estonia ^bUniversity of Tartu, Institute of Computer Science, Livi 2, Tartu, Estonia ^c QureTec Inc. Ülikooli 6a, Tartu, Estonia

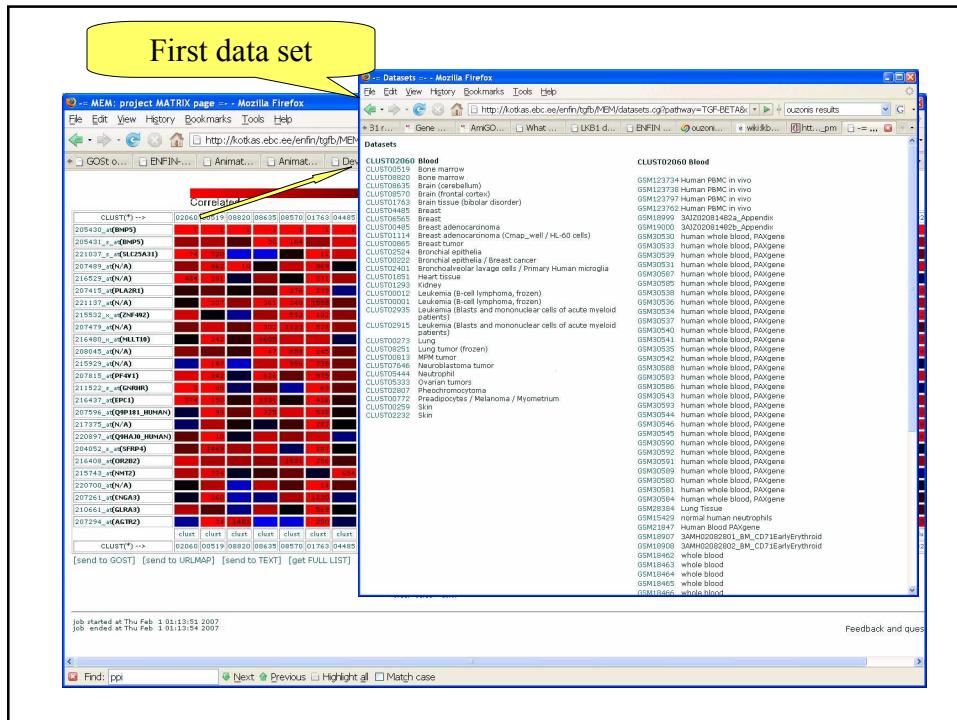
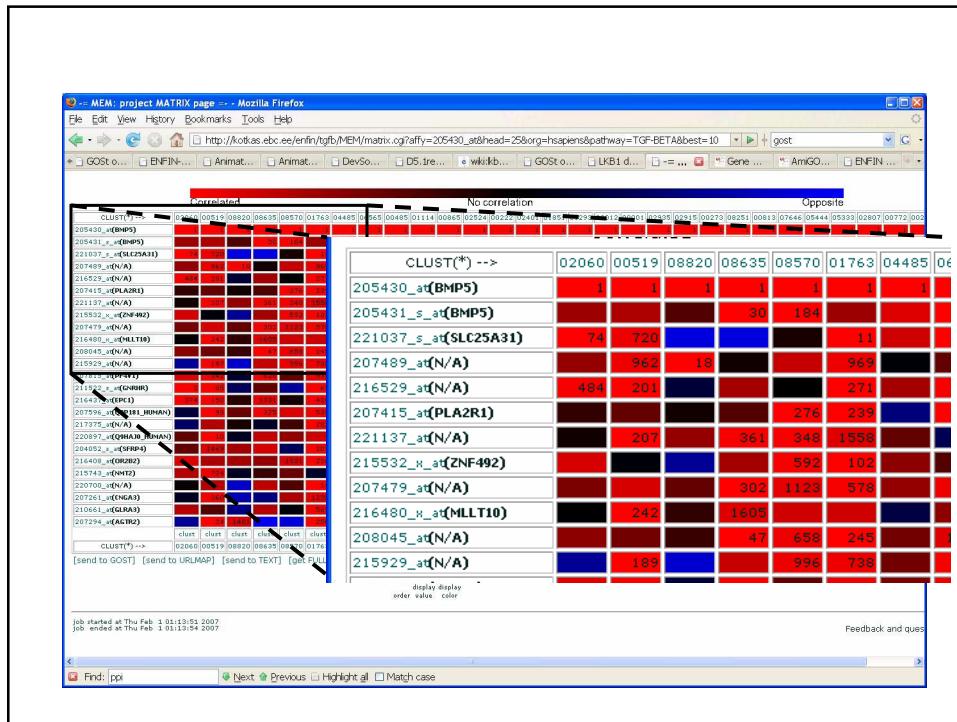


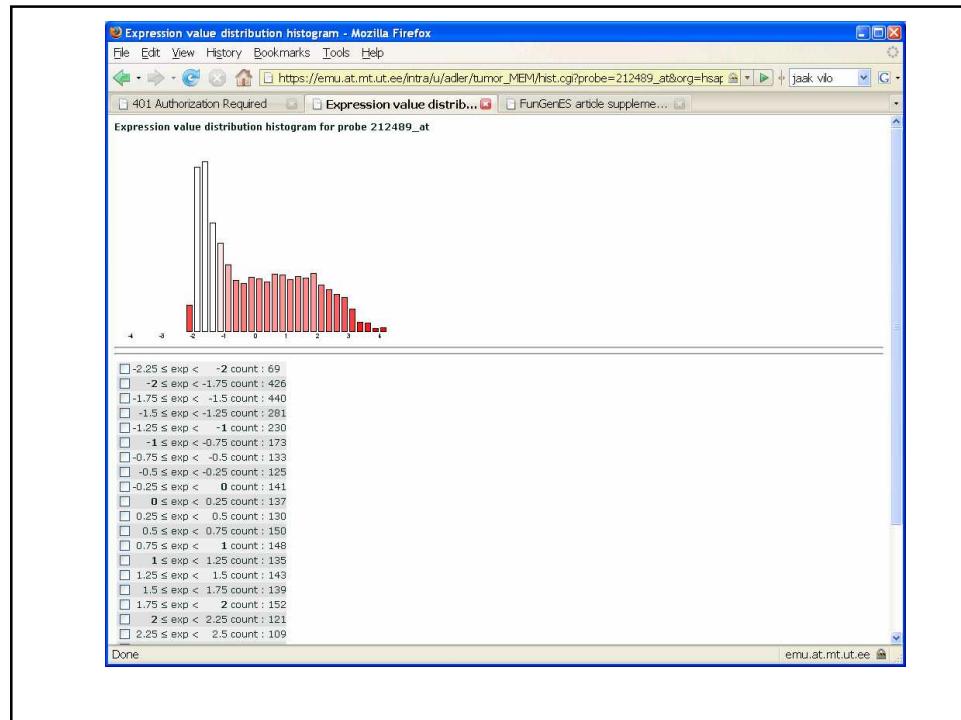
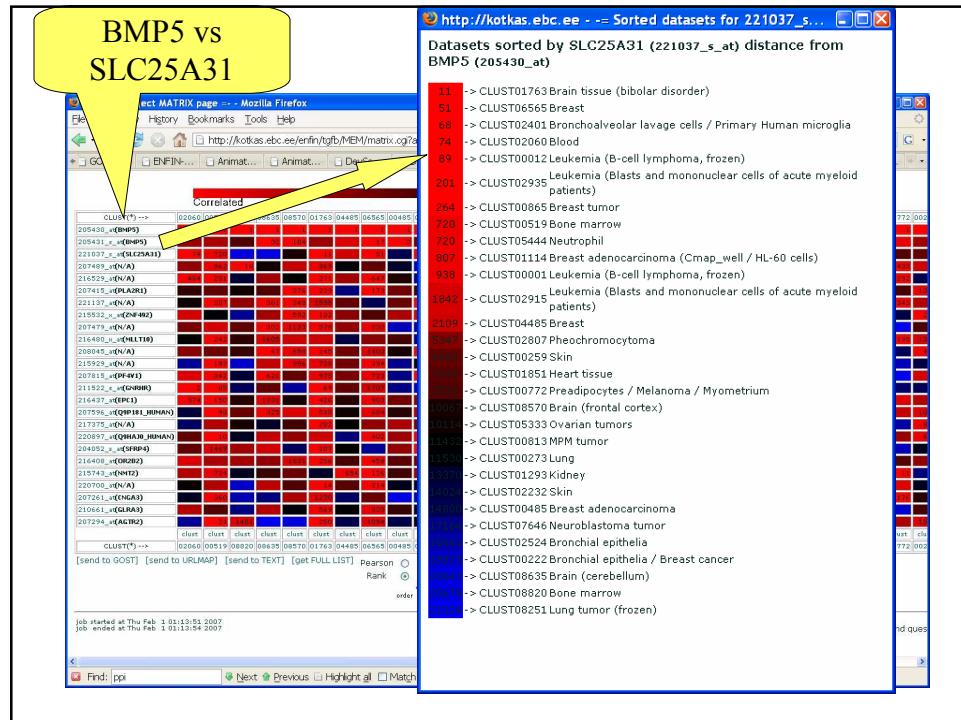
More large-scale experimental data

- Gene expression – thousands of experiments characterising 20K+ genes
- Protein-Protein interactions (complexes, signal transduction, ...)
- Protein-DNA interactions
- proteomics, metabolomics, genetics, ...

MEM – Multiple Experiment Matrix
Co-expression of TGF β gene(s) across multiple datasets





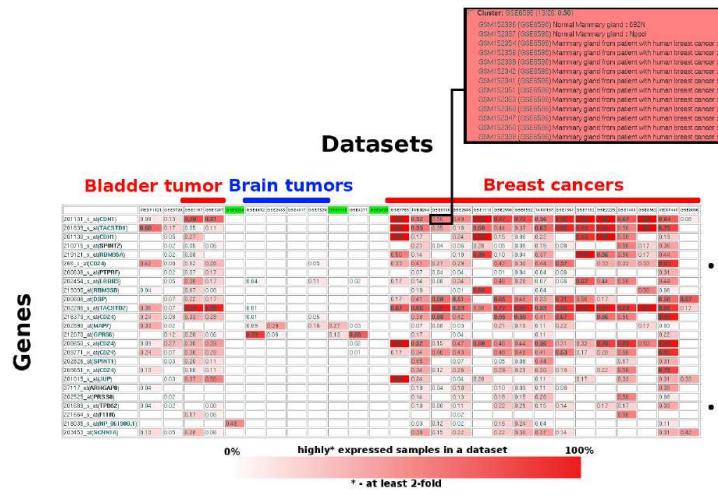


MEM goals

- Query across hundreds of datasets simultaneously
- Characterise gene expression across all datasets
- Study in detail all genes within one pathway
- Find new genes possibly linked to the given pathway
- Identify relevant “conditions” for gene activity
- Priit Adler; Raivo Kolde; Hedi Peterson

MEM - applications - global expression distribution

Oncogene characterisation



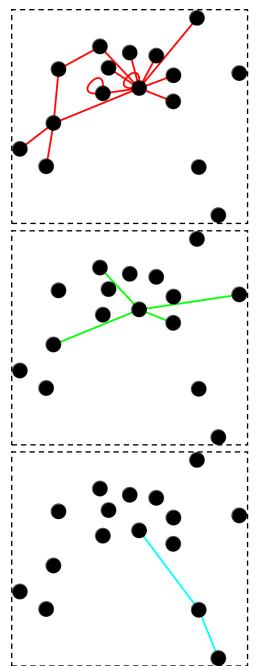
Hedi Peterson

MEM - global expression analysis tool

GraphWeb: mining biological networks for submodules with functional significance

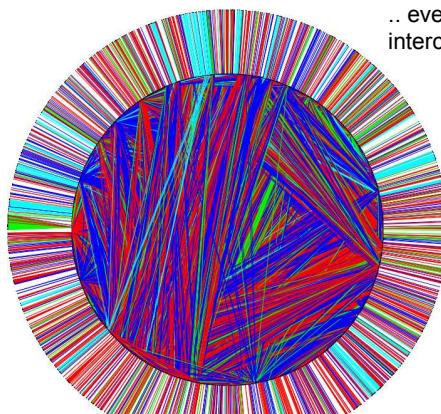
- Genes as nodes
- -omics define edges

- | | |
|---|--------------------------------|
|  | — expression correlation |
|  | — protein-protein interactions |
|  | — literature co-occurrence |
|  | — regulation |
|  | — binding site discovery |
|  | |



Data as graphs

.. everything is interconnected

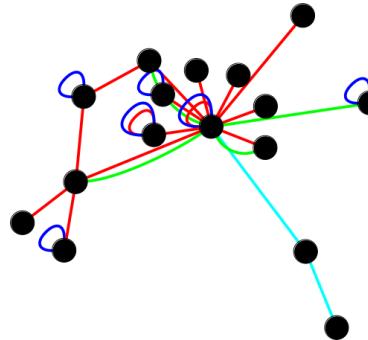


Public datasets for *H.sapiens*

- ◆ IntAct: Protein interactions (PPI), 18773 interactions
- ◆ IntAct: PPI via orthologs from IntAct, 6705 interactions
- ◆ MEM: gene expression similarity over 89 tumor datasets, 46286 interactions
- ◆ Transfac: gene regulation data, 5183 interactions

Gene modules

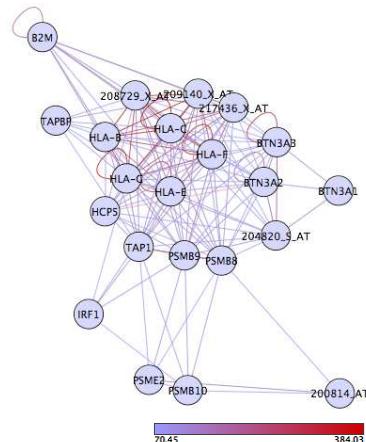
- Integrate data sources as graph *layers*
- Find well-connected subgraphs
- Combine evidence to infer knowledge about regulation and function



GO: cell cycle, regulation, growth.
KEGG: Alzheimer's disease

Weighing the evidence I

- Edges are not born equal
 - e.g. stronger vs weaker correlation
- Assign *local* weights to rank edges within a layer
- Look for *heavy* subgraphs

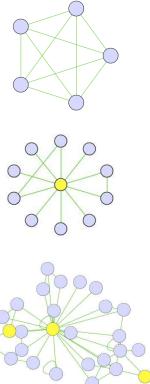


Expression similarity search across 89 human tumor-related datasets (MEM, Adler et al, *in prep.*)

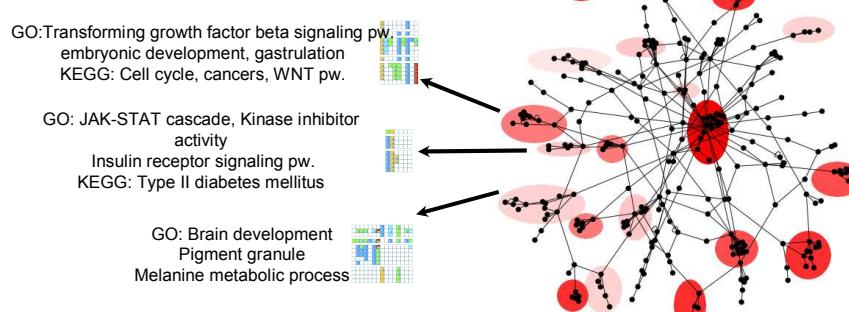
GO: immune system, proteasome. Reactome: cell cycle, DNA replication, HIV infection

Finding the modules

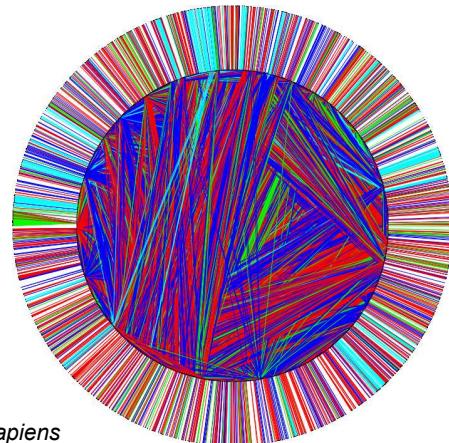
- **Cliques**
 - Fully connected graphs ~ protein complexes
- **Hubs**
 - Highly connected nodes ~ transcriptional regulators
- **Sets of neighbors**
 - Specific genes of interest + near neighbors
- **Graph clustering**
 - MCL: Markov clustering (*van Dongen, 2000*), betweenness centrality clustering



Module evaluation



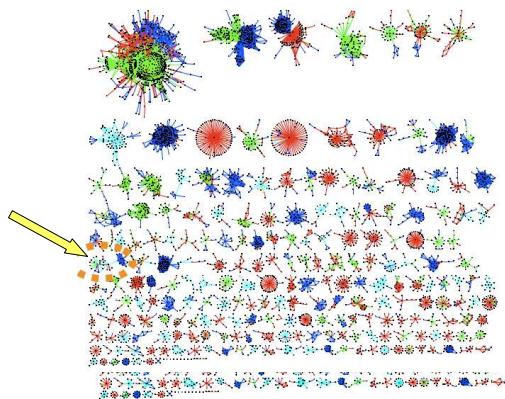
Finding the modules



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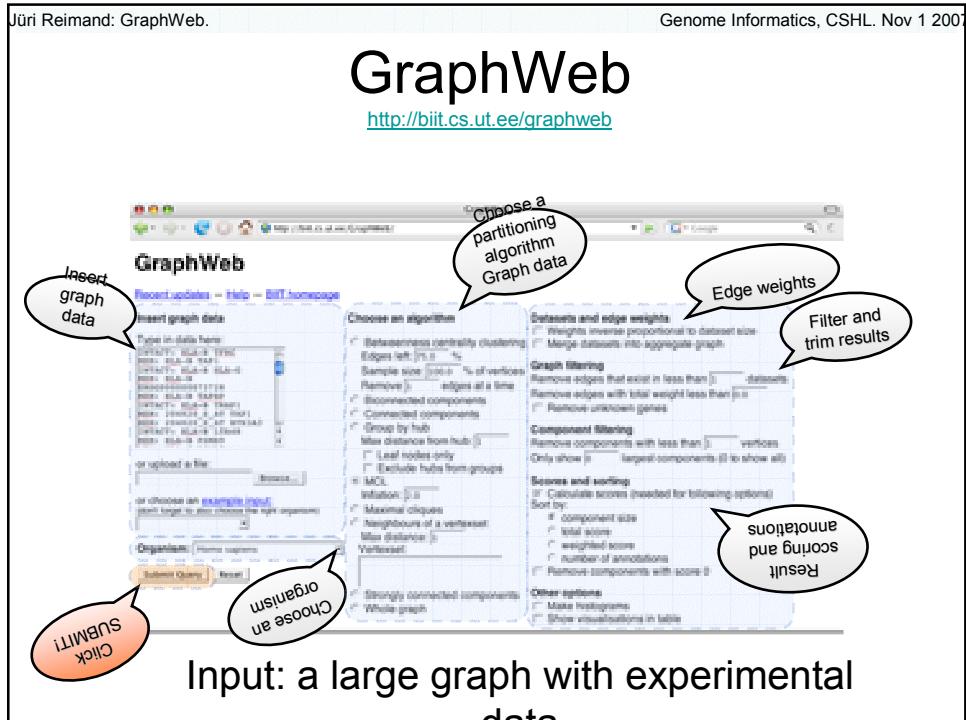
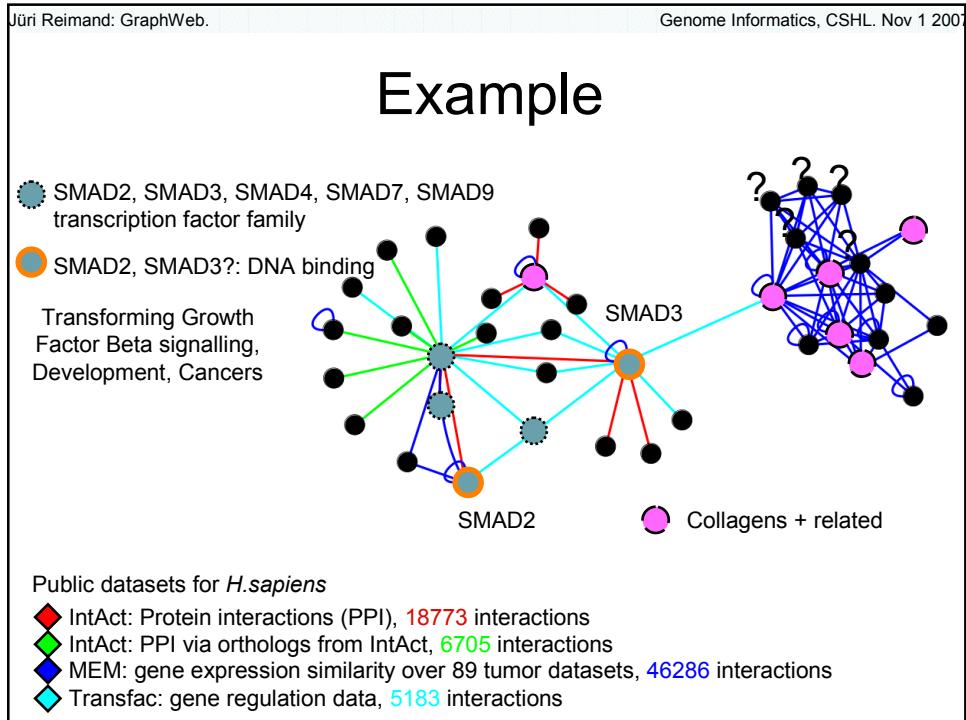
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Finding the modules



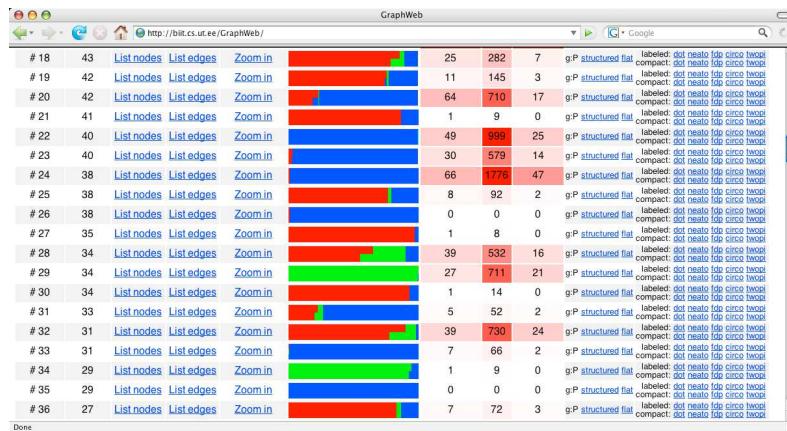
Public datasets for *H.sapiens*

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GraphWeb

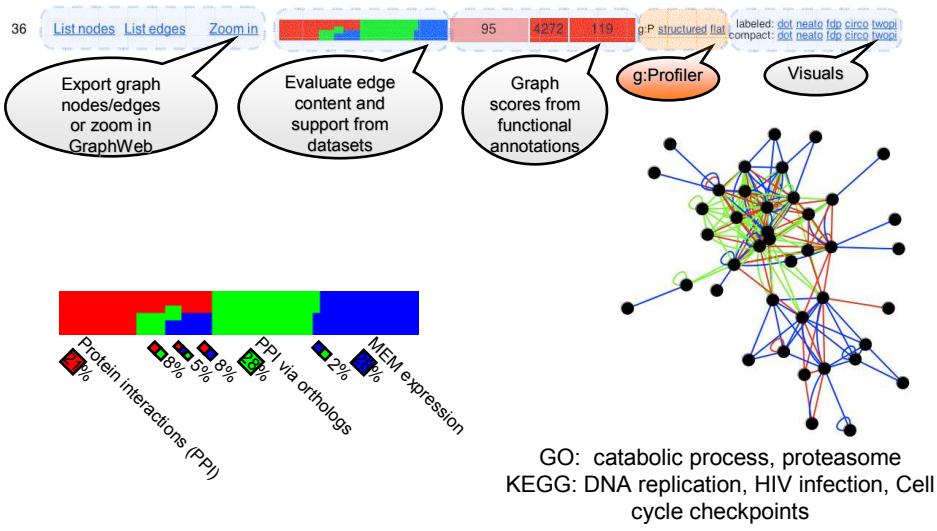
<http://biit.cs.ut.ee/graphweb>



Output: a list of tightly connected gene modules

GraphWeb

<http://biit.cs.ut.ee/graphweb>



microRNA - discovery

- Alexander Stark, Pouya Kheradpour, **Leopold Parts**, Julius Brennecke, Emily Hodges, Gregory J. Hannon, and Manolis Kellis. Systematic discovery and characterization of fly microRNAs using 12 Drosophila genomes. *Genome Research*, 2007
- Alexander Stark, Michael F. Lin, Pouya Kheradpour, Jakob S. Pedersen, **Leopold Parts**, et. al. Discovery of functional elements in 12 fly genomes using evolutionary signatures. *Nature* **450**, 219-232 (8 November 2007)
- Drosophila 12 Genomes Consortium. Evolution of genes and genomes on the Drosophila phylogeny. *Nature* , 2007

Next 5 years

- Databases and analysis of human health
 - Colon & Breast cancer; disease relapse
 - mRNA, proteomics, metabolomics data
 - Estonian Genome Project
 - DB of 10's of thousands of patients with ~1000 attributes worth of health and lifestyle profiles
 - ES cell based toxicology profiling for new drug candidates
 - Disease/gene associations

Next 5 years

- Data query and visualisation methods
 - MEM, PATMATCH, ...
- Data mining
 - Motif discovery (SPEXS, Trie*Tools, ...)
 - Gene regulation modeling
 - Phenotype, Genotype, Expression, PPI, ChIP-chip, ... data joint analysis
- Data analysis environments
- Analysis of data

Anno 2007 (BIIT and Quretec)



Institute of Computer Science

- ★ Software Engineering (Prof. Marlon Dumas)
 - High-Performance (distributed) computing
(Prof. Eero Vainikko)
 - Language Technology (Prof. Mare Koit)
- ★ Programming Languages (Prof. Varmo Vene)
 - Cryptography (Prof. Ahto Buldas)
- ★ Bioinformatics and DM (Prof. Jaak Vilo)
 - 2 Target funding projects (HPC and LT)
- ★ new appointments in Nov & Dec 2007