Systems biology

A biased perspective



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RheinAhrCampus Remagen (UAS Koblenz)

- Department ofMathematics andTechnology
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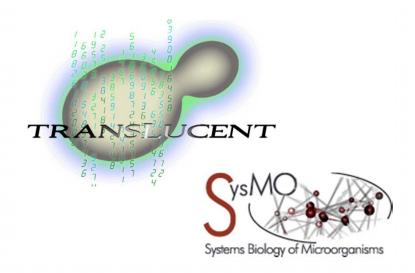
Current research projects (Kschischo)

Cancer systems biology

- in collaboration with Charles
 Swanton and Almut Schulze
 (CRUK London)
- Genetic instability in cancer
- Prediction of drug resistance
- Cancer metabolism

Mathematical modelling of ion homeostasis in yeast (S.c)

Era-Net



http://ptjapps.fz-juelich.de/sysmo

Outline

- I. Why systems biology?
- II. The role of mathematical models
 - Statistical models
 - Mechanistic models
- III. Data management
 - The need for integrated biological and medical data
 - Data standards and data management
- IV. Some links and literature

Systems biology

A paradigm

"Systems biology...is about putting together rather than taking apart, integration rather than reduction. It requires that we develop ways of thinking about integration that are as rigorous as our reductionist programmes, but different....It means changing our philosophy, in the full sense of the term"

Denis Noble (2006). The Music of Life: Biology beyond the genome. Oxford University Press. p21

A way of doing research

 Systems biology circle between experimentation and modelling

The goal

- Make useful predictions
- Guide better understanding

Example:

- Oncotype DX (Breast)
 - Gene signature (21 genes)
 - Predicts **response to chemotherapy** in combination with traditional diagnostic scores like node status, ER status, tumor grade,...
- MammaPrint 70-gene signature

Systems biology and synthetic biology

Synthetic biology:

- Design and fabrication of biological components and systems that do not already exist in the natural world
- Re-design and fabrication of existing biological systems
- Engineer a biological system to produce a certain substance or to fulfill a certain function

Systems biology:

Studies natural systems

The role of mathematical models

Is math useful at all?

Modelling

George Edward Pelham Box:

"Essentially, all models are wrong, but some are useful."

Box, George E. P.; Norman R. Draper (1987). Empirical Model-Building and Response Surfaces. Wiley. pp. 688, p. 424.



Which type of model?

- It depends on the
 - Biological question
 - Data

Statistical models

Mechanistic models

Example 1: Gene expression signatures and statistical models

Biological question:

Which genes can be used for predicting a certain phenotype (e.g. survival or response to therapy)?

Data:

Patient	Gene 1	Gene 2		Gene 10000	Survival	Node	ER+	
1	1.3	7.6		0.9	3	positive	Yes	
2	1.7	1.9		2.1	1	negative	No	
3	3.8	4.2		3.7	censored	positive	Yes	
	•••	•••	•••	•••	•••	•••		

Statistical model

Survival =f(gene1,...,gene1000,node, ER+,...) + noise

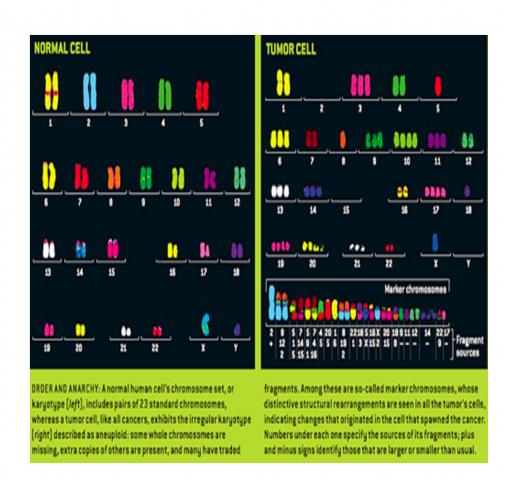
Challenges:

- Small sample size, large number of variables (small n, large p)
- Need an independent training set and a test set

Example 2 from own research: Taxane response signature

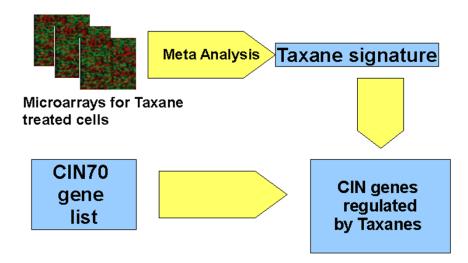
Swanton et al. Proc Natl Acad. Sci.USA, 106, 2009

- Many cancer cells are aneuploid and chromosomally instable (CIN)
- CIN: Increased rate gains/losses
- CIN cells are often more resistant against drugs
- Why?

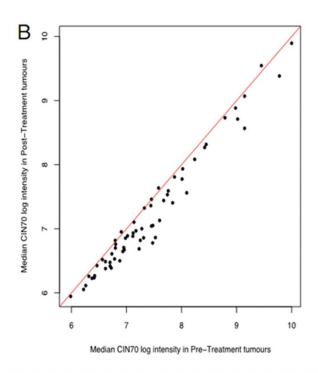


Strategy for finding the gene signature

- Generate a list of genes affected by taxanes (Taxane response gene signature)
- Analyze the relationship of genes in the Taxane response signature to genes involved in CIN
- Use the CIN70 gene signature of genes overexpressed in CIN cells from Carter et al., Nat Genet, (2006)



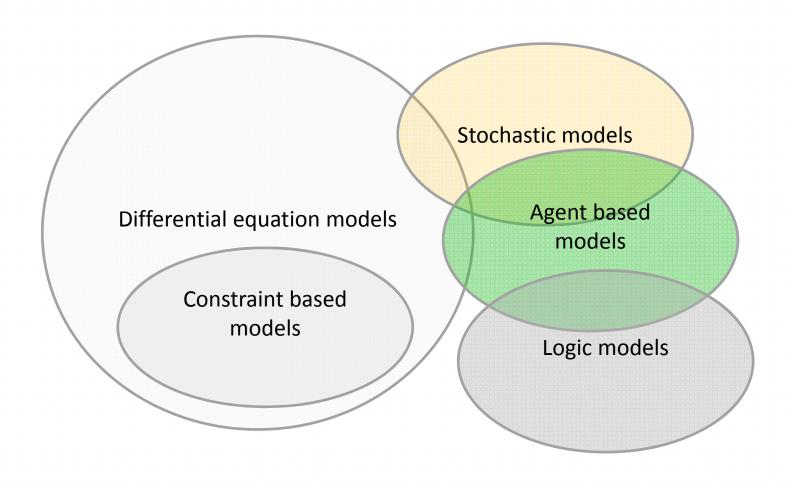
Main results



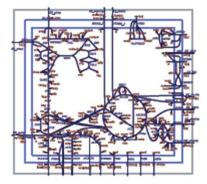
Expression of taxane signature in ovarian carcinomas before and after 3 cycles of paclitaxel treatment (Independent test set!!!)

- Genes overexpressed in CIN cells are downregulated by taxanes
- Genes with
 overexpressed CIN70
 signature are more
 resistant to taxane
 treatment

Some mechanistic models



Deterministic models for reaction networks



$$A \longleftrightarrow B + C$$
 Reaction 1
B + 2C \longrightarrow D Reaction 2

Reaction n

Orth et al. Nat. Biotech, 2010

Ordinary differential equations (ODEs)

Predictions:

Time courses of concentrations

Requirements

- Time course data for many reactants (e.g. proteins)
- Enzyme kinetic data

Applications:

Small reaction networks

Constraint based models (COBRA)

Predictions:

Stationary reaction fluxes (metabolic networks)

Requirements

Constraints on certain reaction rates

Applications:

Genome scale metabolic networks

A nice example for a constraint based model

Network-based prediction of human tissue-specific metabolism

Tomer Shlomi^{1,4}, Moran N Cabili^{1,4}, Markus J Herrgård², Bernhard Ø Palsson² & Eytan Ruppin^{1,3}
Nat Biotech, 2008

Data

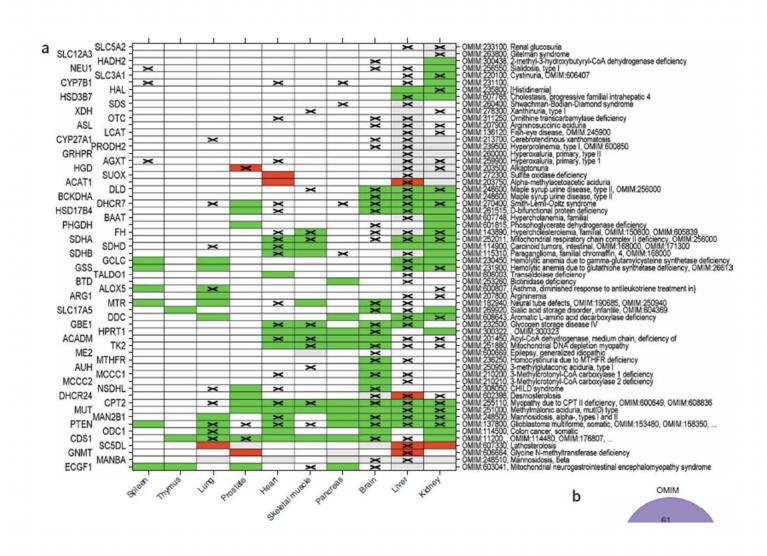
- Reconstructed human metabolic network (Duarte et al. Proc. Natl. Acad. Sci. 2007)
- Gene and protein expression data for different tissue types

Goal:

 Predict and compare tissue specific activity of disease related genes

Comparison of predicted and measured gene activity of disease related genes

Shlomi et al, 2008



Data management

Its a big mess! But it gets better.
Some Examples.

Problems in biological data management and acquisition

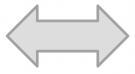
- Heterogeneity and complexity of the data
- Lack of well established data standards
- Link to medical data

Simple example: Meta analysis of breast cancer microarrays

- Used 10 large data sets (more than 1000 patients)
- Only 8 studies report the ER status

My whish list for medical systems biology

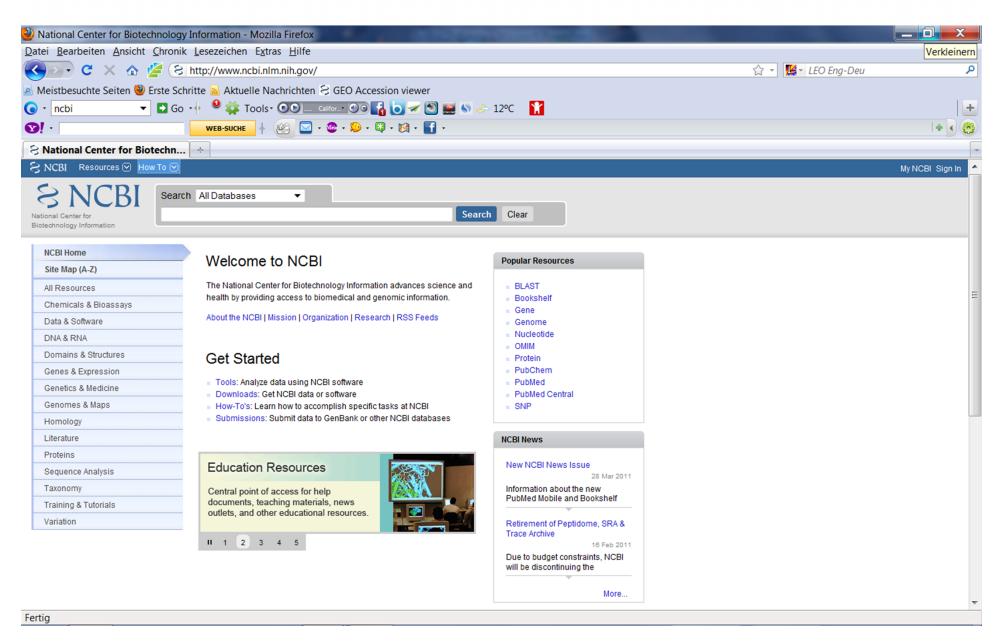
Biological data



Medical data (Patients)

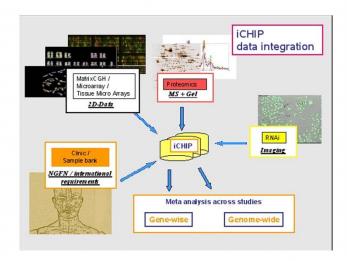
Matching of high throughput data and clinical diagnostics or outcome

NCBI is on the starting blocks



Proprietary data integration activities

- Data warehouses
 - Example: iCHIP
 - www.ichip.de
 - DKFZ, Bioquant, Uni Heidelberg
 - Integrates Affymetrix, cDNA, tissue microarray, array CGH, mass spectrometry, gel electrophoreses, RNAi,...)



www.ichip.de

Minimal information data standards

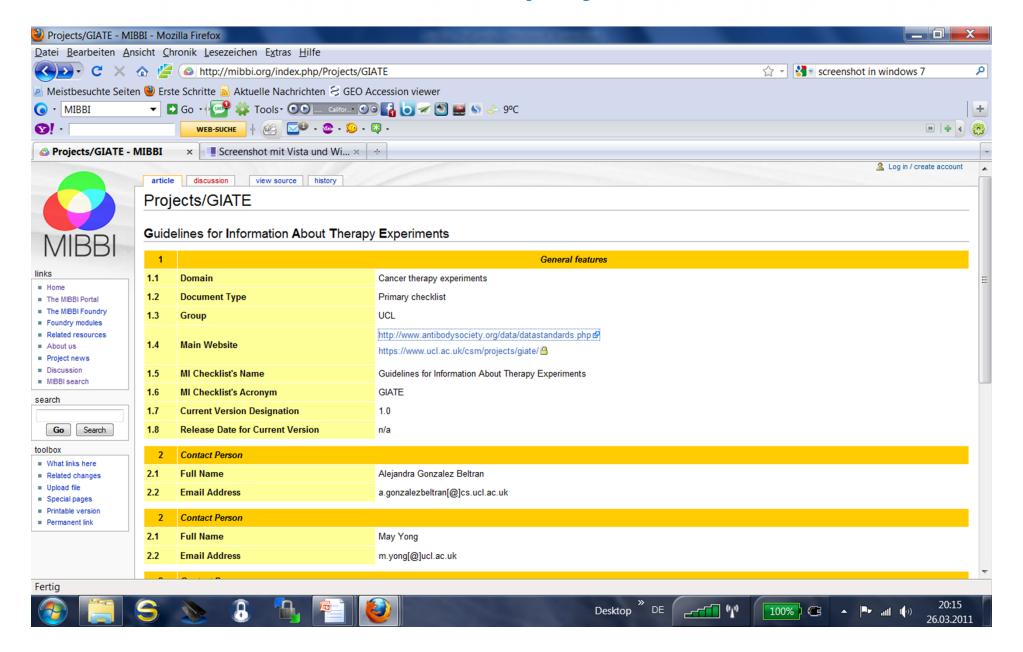
- Started withe MIAME (Minimal Information About a Microarray Experiment)
- Other minimal information standards followed and were integrated in the MIBBI project



Project website: http://mibbi.org/

32 projects committed to date including: MIAME (microarrays), MIAPE (proteomics), CIMR (metabolomics) MIGS, MINSEQE & MINIMESS (genomics, sequencing) MIGen & MIQAS (genotyping), MIARE (RNAi), MISFISHIE (in situ)

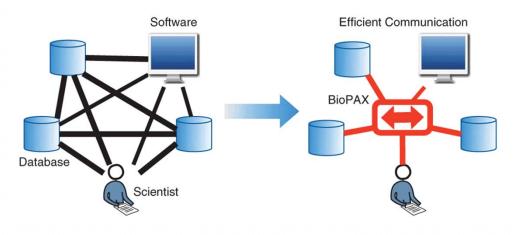
A MIBBI project



BioPAX

Demir et al. Nature Biotechnology 28, 935-942 (2010)

- is a standard language for the integration, exchange,
 visualization and analysis of biological pathway data
- is coordinated with other pathway standards e.g.
 SBML and CellML



BioPAX Level 3 covers metabolic pathways, molecular interactions, signaling pathways, gene regulation and genetic interactions.

Data management systems in systems biology

Spreadsheets

Template spreadsheets, e.g. ISA-TAB (http://isatab.sourceforge.net/)

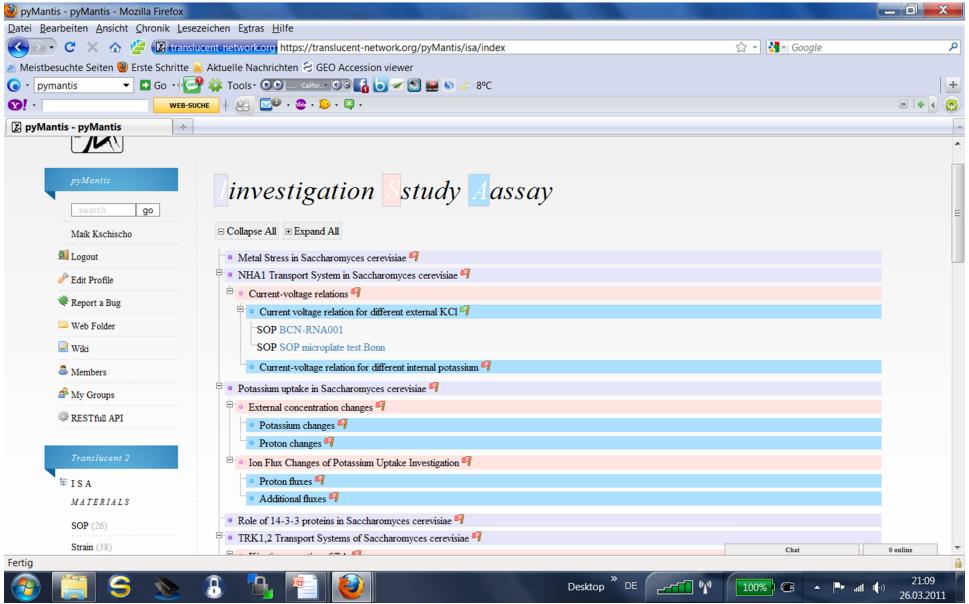
Web-based document sharing tools

- Groupware software (e.g. eGroupware) or more specialized tools (e.g. DaMaSys, pyMantis)
- Exchange of spreadsheeds, SOPS, meta data, ...

Workflow systems based on web services

Construct and run an analysis workflow on the grid

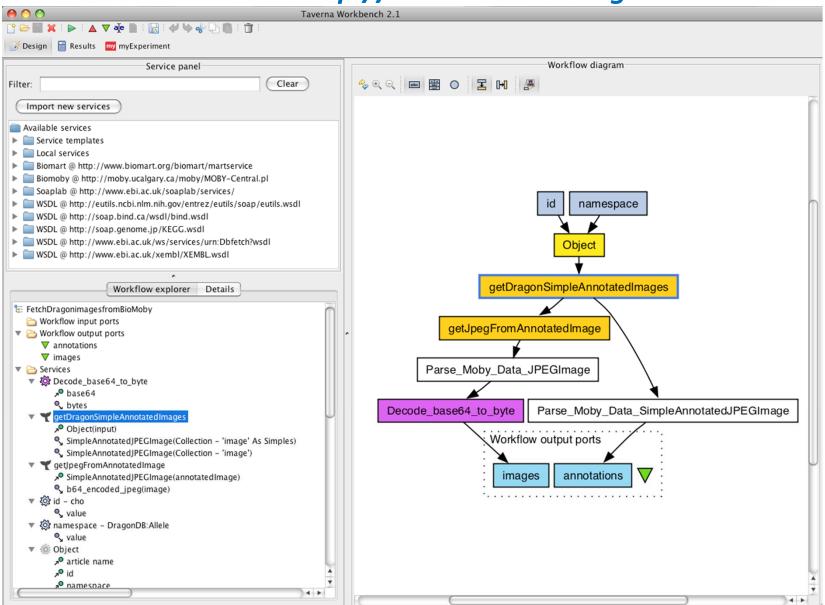
A web based document sharing tool: pyMantis (Falco Krause, HUB, SysMO-Translucent)



Taverna work flow system

http://www.taverna.org.uk

Courtesy: Katy Wolstencroft



Organisations and institutions

Many institutions and organisations, only good starting points

National:

- Helmholtz-Allianz-Systembiologie
 www.helmholtz.de/systembiologie
- FORSYSwww.forsys.net
- Portal for systems biology research in Germany

www.systembiologie.de

International:

Systems Biology portal www.systemsbiology.org

My key questions?

- How to integrate biological data (genomic, proteomic, *omic) with medical data?
- Maintenance of data bases?
- How can systems biology contribute to translational medicine?

Journals and conferences

Journals

- Molecular systems biology
- BMC systems biology
- IET Systems Biology
- Bioinformatics

and many other biology journals including

- Nature Biotechnology
- PNAS
- Journal of Biological Chemistry
- **-**

Conferences

- International Conference on Systems Biology (ICSB)
- Conference on Constraint-based Reconstruction and Analysis
- International Congress on Molecular Systems Biology
- Data Integration in the Life Sciences
- **.**..

Selected Literature

Reviews and Books:

- 1. Barnes, D.J. and Chu, D. "Introduction to Modeling for Biosciences", Springer, 2010.
- 2. Klipp, E., Liebermeister, L., Wierling, C., Kowald, A., Lehrach, H. & Herwig, R. Systems Biology. A Textbook. Wiley-Blackwell, Weinheim, 2009.
- 3. Sauer, U. et al.. "Getting Closer to the Whole Picture". *Science* **316**, 2007.
- 4. Way, J.C. and Silver, P.A. "Systems engineering without an engineer: Why we need systems biology: Essays and Commentaries" Complexity Complex Systems Engineering 13, 2007.

Data Management:

- Lambrix, P. and Kemp, G.J.L. (Eds.): Lecture Notes in Computer Science
 6254 Springer, 2010.
- 2. Mayer, G. Data management in systems biology 1: Overview and bibliography. arXiv:0908.0411v3 [cs.DB].