

Enabling Multi-scale Science: Mathematical and Computational Modeling

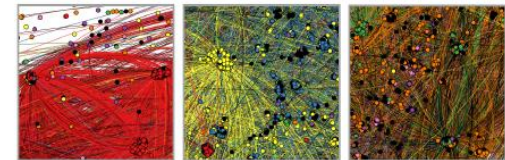
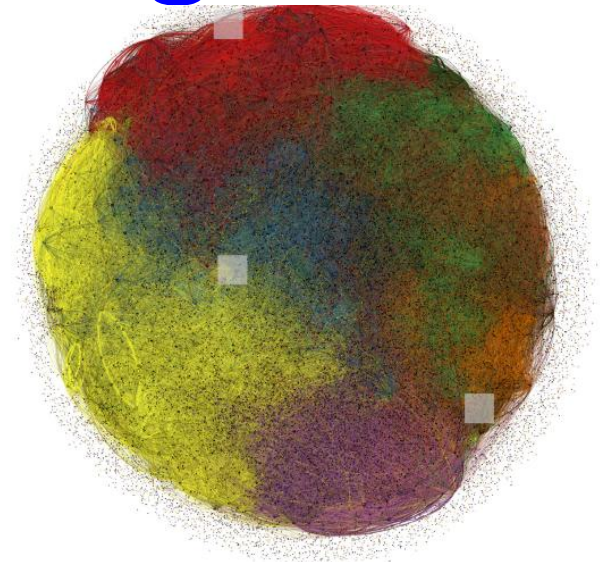
Roberto M. Cesar-Jr

IME – USP

<http://www.ime.usp.br/~cesar/>

eScience-USP

FAPESP – CNPq - Capes



Major knowledge areas:

- Agricultural Sciences
- Biological Sciences
- Exact and Earth Sciences
- Humanities
- Applied Social Sciences
- Health Sciences
- Engineering
- Linguistics, Letters and Arts
- More than one major area

Summary

- Which “scale”?
- Multi-scale HOWTO
- Concluding remarks?

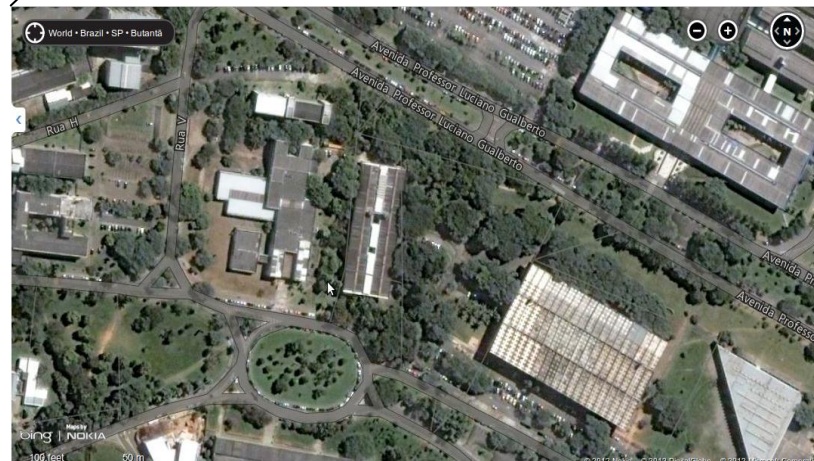
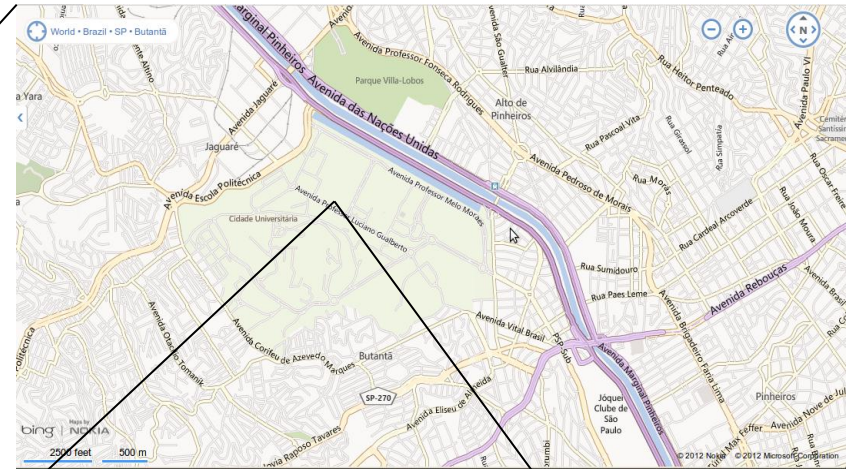
Which “scale”?

Which “scale”...

...are we talking about?

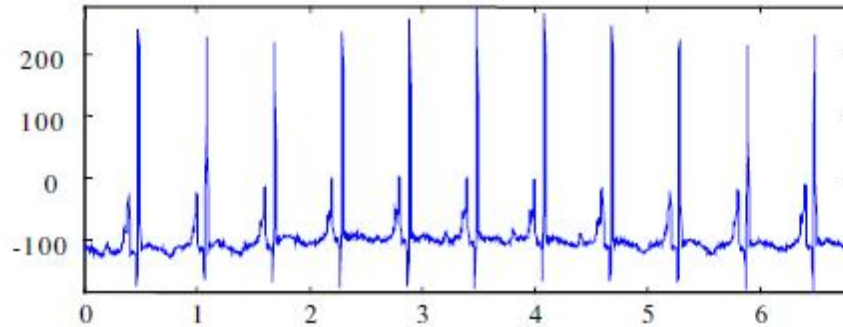
- Spatial
- Temporal
- Conceptual
- ?

Which “scale”...

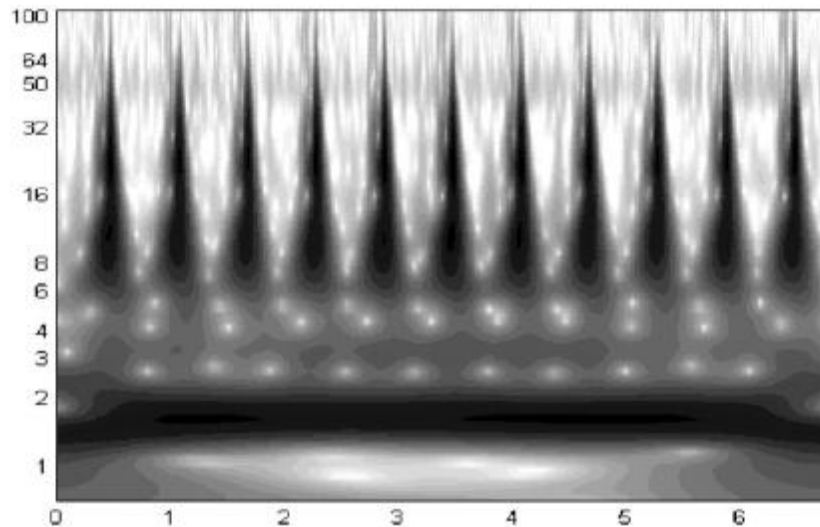


Spatial scales

Which “scale”...



(a)



(b)

Temporal scales

INSTITUTE OF PHYSICS PUBLISHING
Physiol. Meas. 26 (2005) R155–R199

PHYSIOLOGICAL MEASUREMENT
doi:10.1088/0967-3334/26/5/R01

TOPICAL REVIEW

Wavelet transforms and the ECG: a review

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E-mail: p.addison@cardiodigital.com

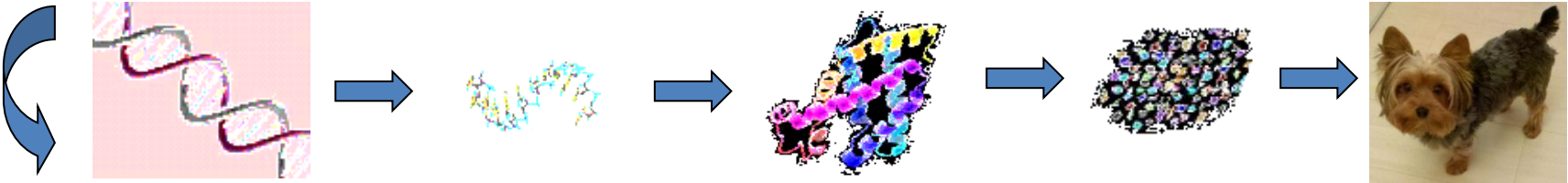
Data-intensive knowledge discovery and systems biology: Conceptual scales

Central dogma of biology

Replication

Transcription

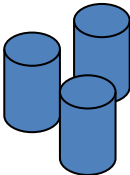
Translation



DNA



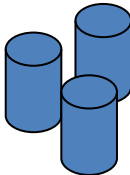
Genomics



mRNA



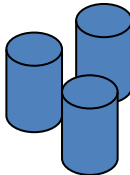
Transcriptmics



Proteins



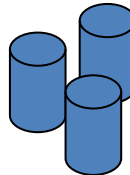
Proteomics



Metabolites



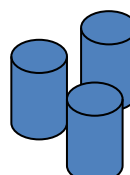
Metabolomics



Organisms



Various analysis



Heterogeneous, complex, distributed databases

Data-intensive knowledge discovery and systems biology

Central dogma of biology

Replication

Transcription

Translation

Metabolites



DNA

mRNA

Proteins

Metabolites

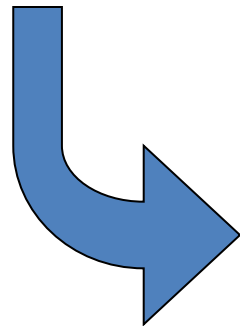
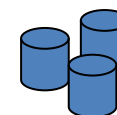
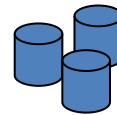
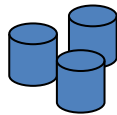
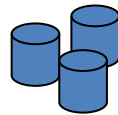
Organisms

Genomics

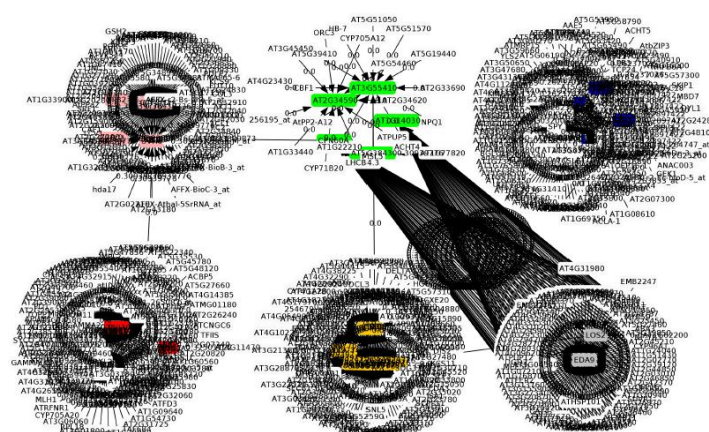
Transcriptmics

Proteomics

Metabolomics



Second order conceptual scales

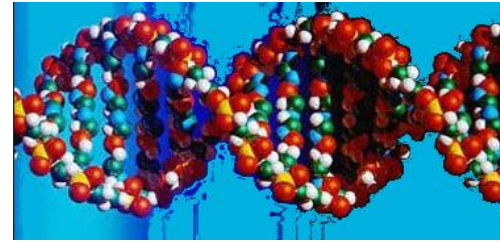


Multi-scale HOWTO

HOWTO

- Problems with or without inherent scales
- Mathematical approaches available (continuous, discrete, multidimensional):
 - Wavelets
 - Pyramids and Resolution
 - Graphs
 -
- Computational methods and structures

HOWTO

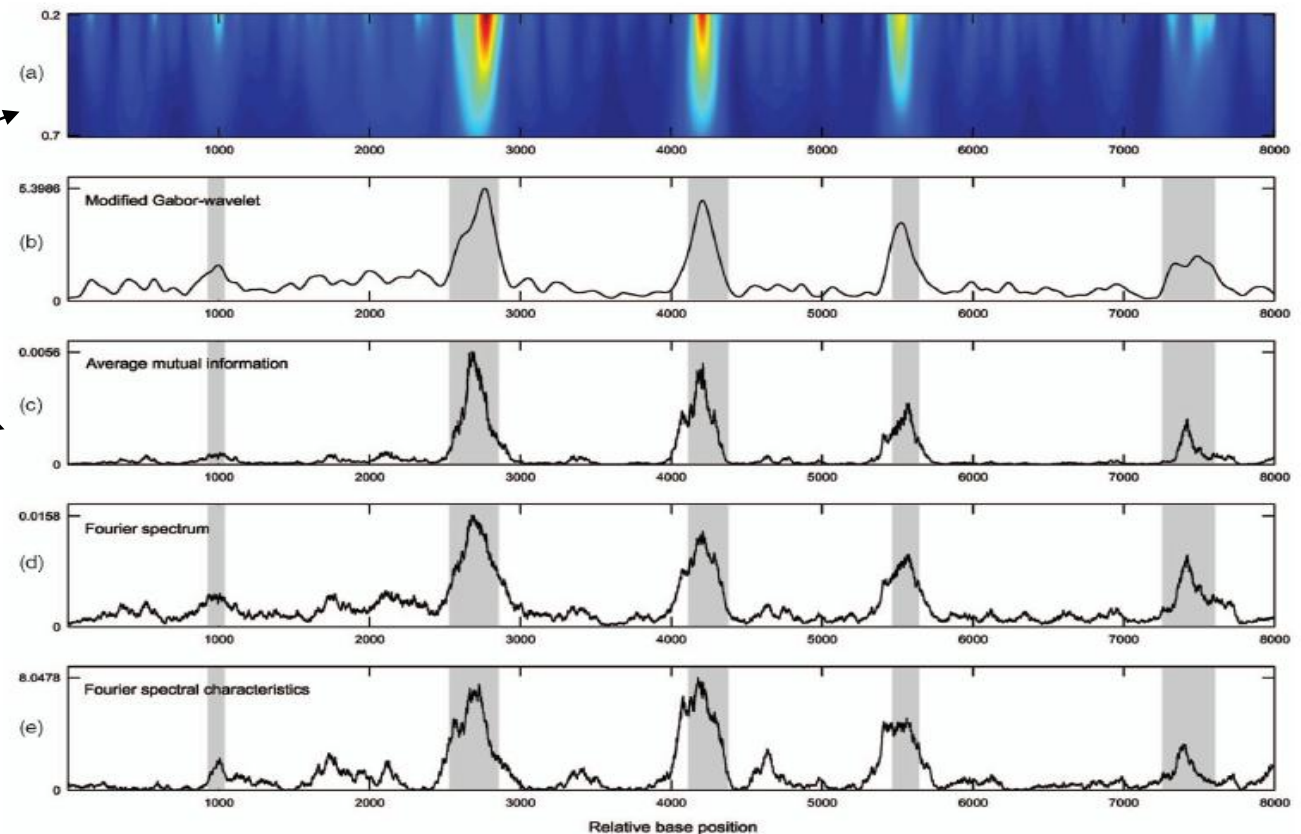


Information:

- coding
- unfolding
- folding

202

IEEE/ACM TRANSACTIONS ON COMPUTATIONAL BIOLOGY AND BIOINFORMATICS, VOL. 5, NO. 2, APRIL-JUNE 2008



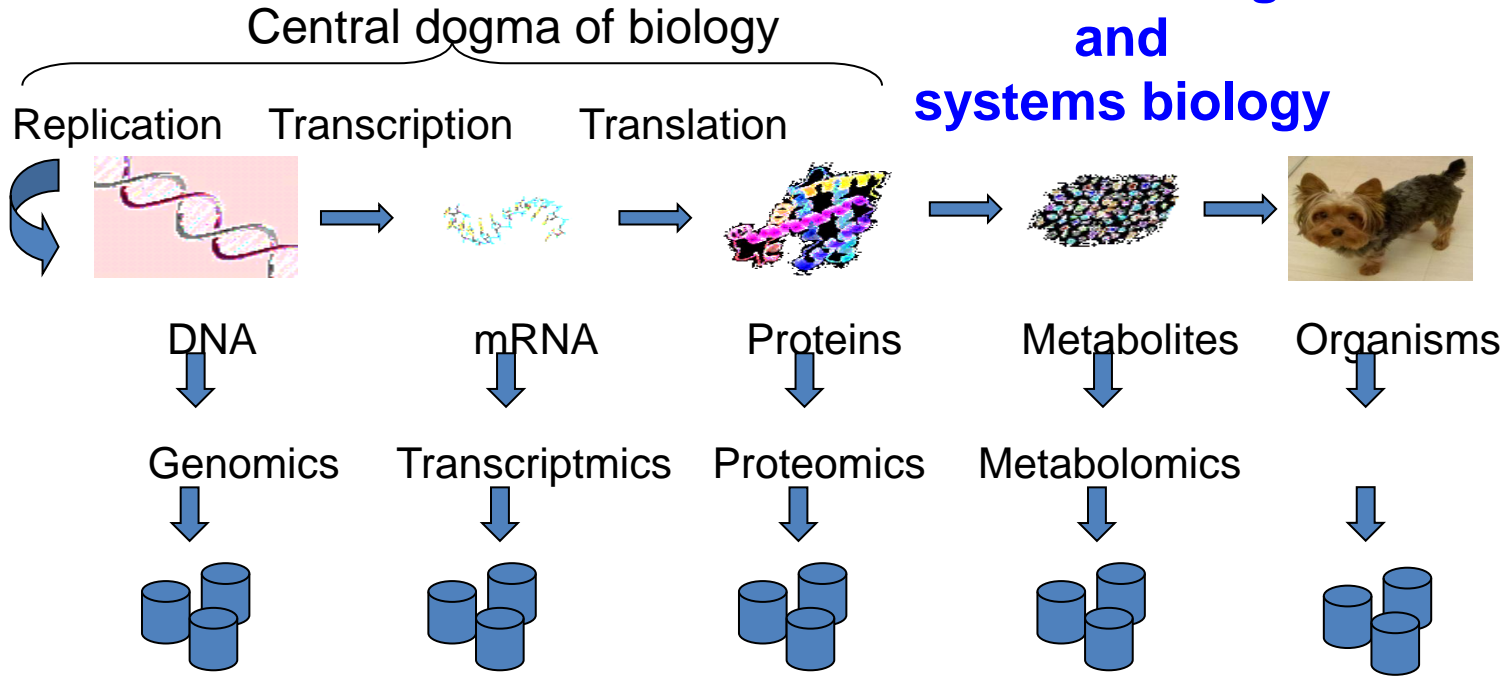
198 IEEE/ACM TRANSACTIONS ON COMPUTATIONAL BIOLOGY AND BIOINFORMATICS, VOL. 5, NO. 2, APRIL-JUNE 2008

Identification of Protein Coding Regions Using the Modified Gabor-Wavelet Transform

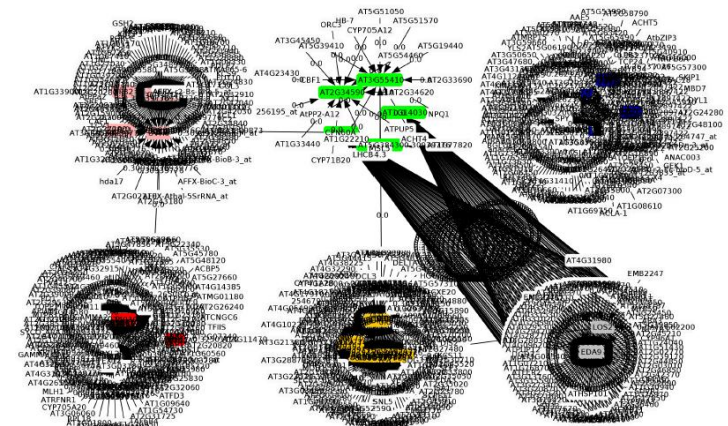
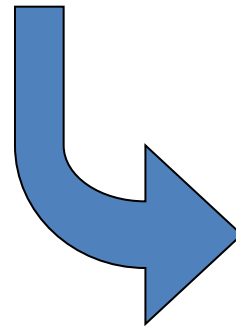
Jesús P. Mena-Chalco, Helaine Carrer, Yossi Zana, and Roberto M. Cesar Jr.

HOWTO

Data-intensive knowledge discovery and systems biology



Second order conceptual scales



HOWTO

Expression of gene i at time t : $x_i[t] \in \{-1, 0, +1\}$

State of the regulatory network at time t : $x[t] = \begin{bmatrix} x_1[t] \\ x_2[t] \\ \cdot \\ \cdot \\ x_n[t] \end{bmatrix}$

Network dynamics: $x[t + 1] = \phi(x[t])$

HOWTO

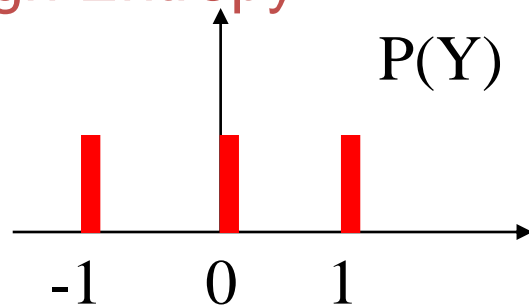
Entropy

$$H(Y) = - \sum_{y \in \{-1,0,1\}} P(y) \log P(y)$$

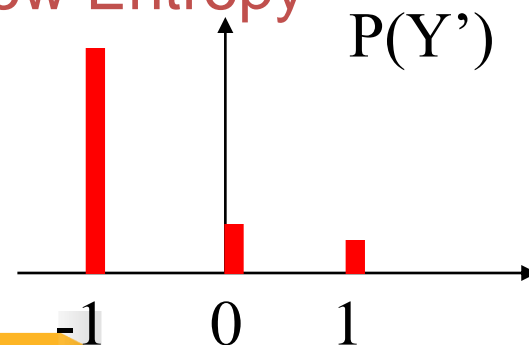
Mean conditional entropy

$$E[H(Y | X)] = - \sum P(X) \sum P(Y | X) \cdot \log(P(Y | X))$$

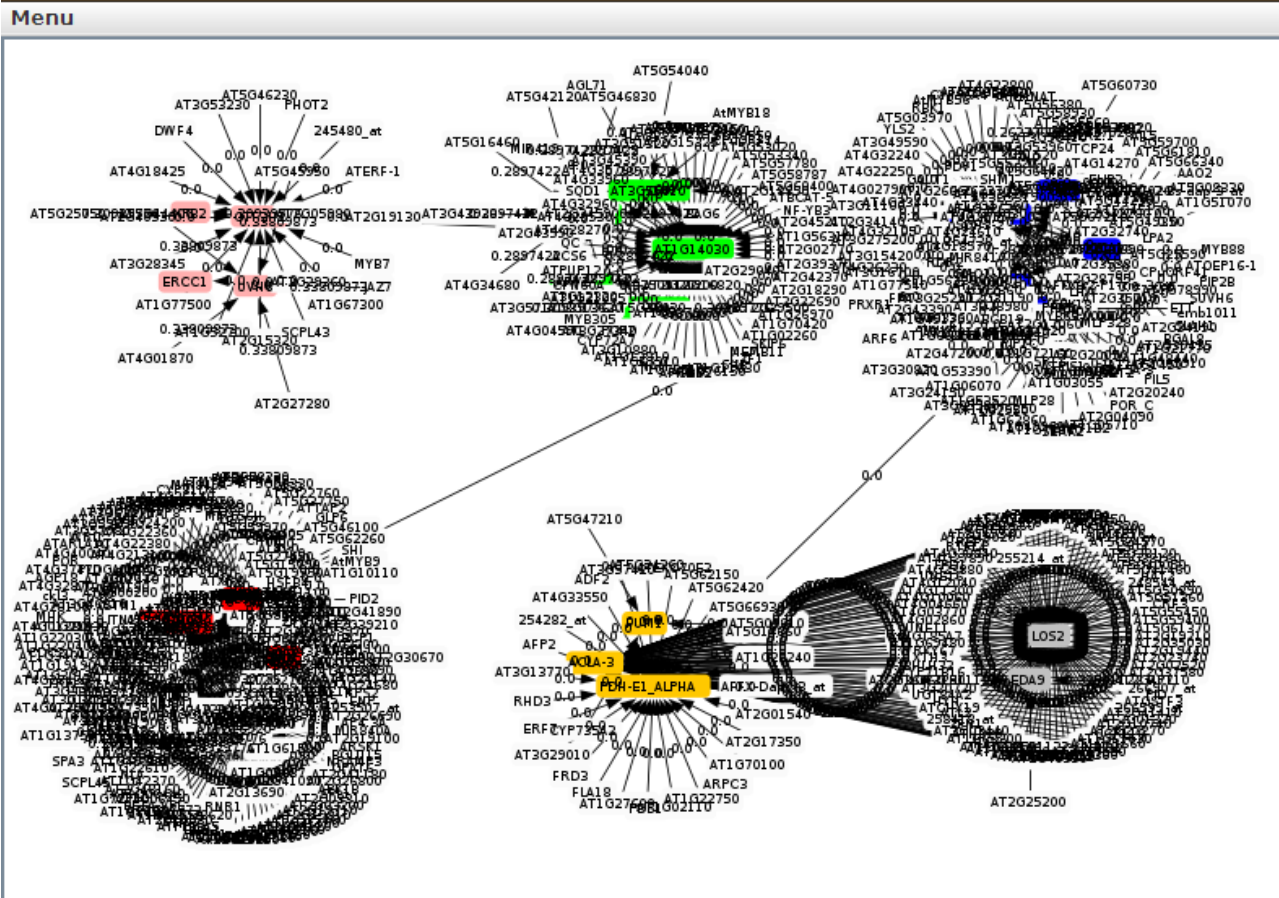
High Entropy



Low Entropy



HOWTO



Gene Description

Gene name: AT1G14030
 Prob Set Name: 262648_at
 Chromosome: 1
 Also known as: F7A19.12; F7A19_12
 Products: large subunit N-methyltransferase, putative
 Function:

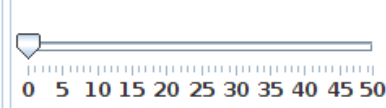
Pathway
 Pathways: fotossintese

Gene Annotation Links

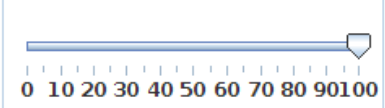
TAIR: [AT1G14030](#)
 TIGR: [AT1G14030](#)
 KEGG: [AT1G14030](#)
 NCBI: [837964](#)
 NCBI-Protein: [NP_172856.1](#)

Description: (InterPro:IPR01192), SET (InterPro:IPR01214), Rubisco LSMT substrate-binding (InterPro:IPR015353) BEST Arabidopsis thaliana protein match is: SET domain-containing protein (TAIR:AT3G07670.1) Has 838 Blast hits to 833 proteins in 135 species: Archae - 0 Bacteria - 0 Metazoa - 242 Fungi - 218 Plants - 233 Viruses - 0 Other Eukaryotes - 145 (source: NCBI BLink)."

Frequencia dos Preditores

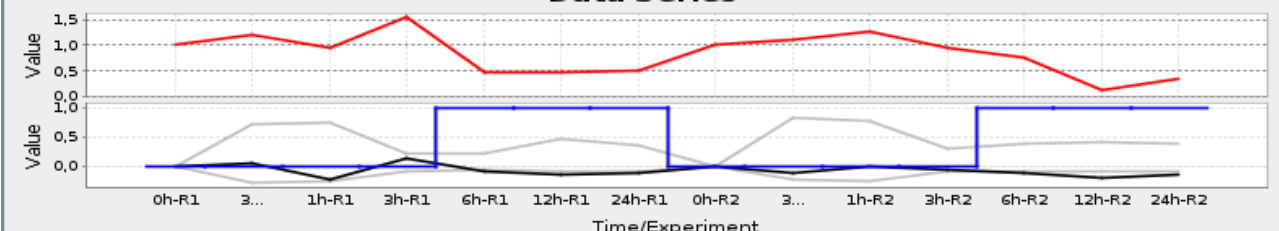


Valor de Entropia



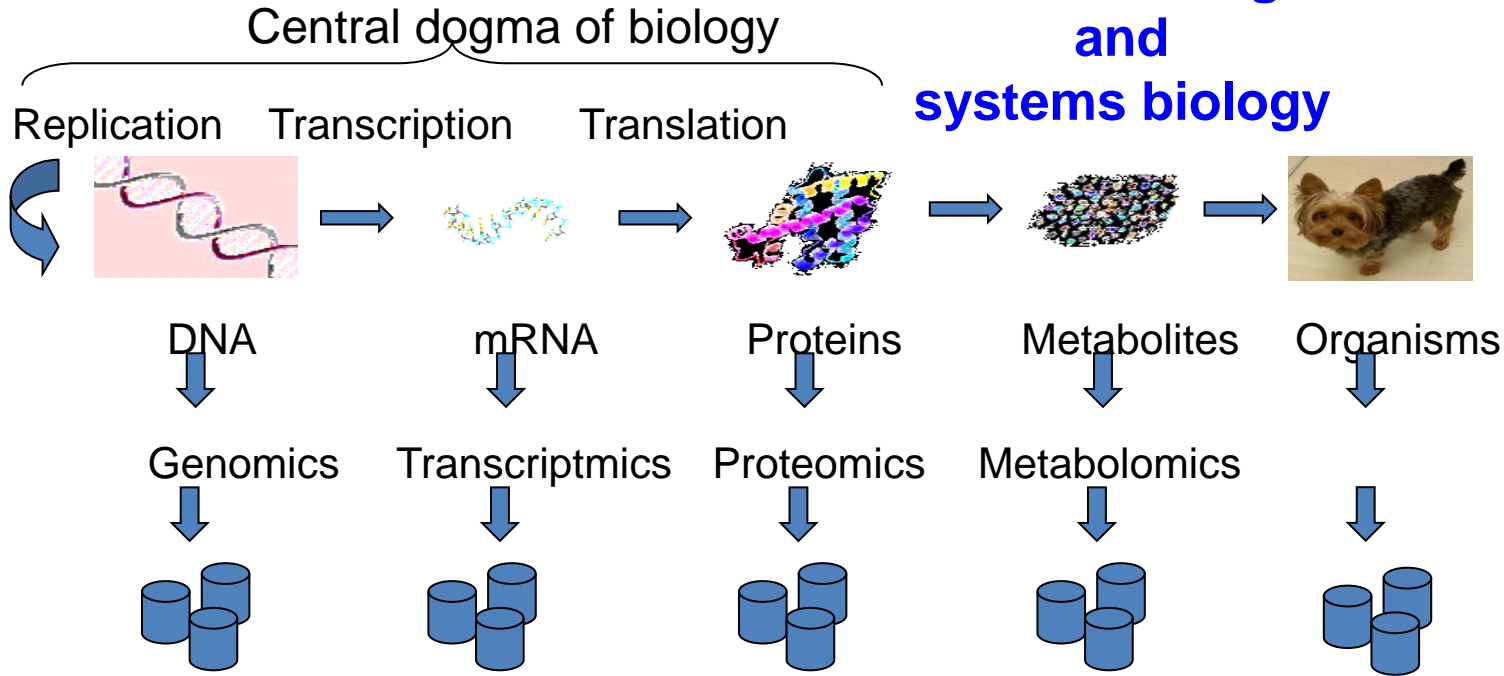
LEGENDA:
 Arestas (ligaç...Entropia, 0 == nao houve erro.
 Sinal Temporal: Vermelho == Perfil de Expressão Original.
 padrão).
 Azul == Perfil de Expressão Quantizado (0 ou 1, ou negativo) dividido por 1,5.

Data Series

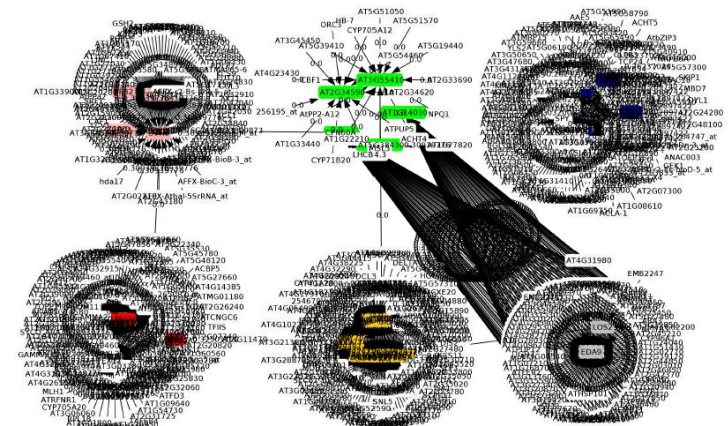
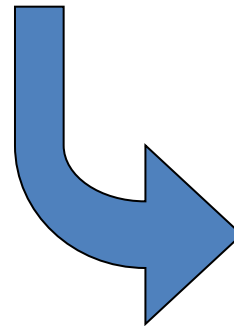


HOWTO

Data-intensive knowledge discovery and systems biology



Mappings between second order
conceptual scales



Concluding remarks

HOWTO

- Different “types” of scales
- Problems with inherent scales
- Unfolding and folding the scales
- Mathematical models
- Computational models and data-structures
- Software

Multi-scale for eScience Approaches

- Multi-scale as a way to cope with complexity
- Multiple scales for exploratory data analysis, browsing data, grasping initial understanding,...
- Data integration: mathematical and data models
- Network matching, searching, comparison, motifs