## Multiscale and Rare Events in Physiology





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## "From Brain to Behavior" is a hard-to-define problem!



Different Types of Hierarchy: organizational and spatial (temporal will be ignored for now):

- \* Organizational (defined by specialization, role). Examples: social, ecological.
- \* Spatial (defined by features, lengths). Examples: cities, continents.

Physiological systems (e.g. animal body) is a combination of the two:

\* cells can form organs, systems with specialized components (renal, circulatory).





COURTESY: Power of 10 (Eames, YouTube)

## **Example from Brain-machine Interfaces (BMIs):**

BMI systems with two components (Carmena, IEEE Spectrum, March 2012).

Two electrophysiological sources of information:

- \* high-frequency signals (single unit recordings).
- \* low-frequency signals (local field potentials).

How do these get fused together into a coherent control signal?

\* multiscale problem, much mutual and independent information embedded in both scales



#### Scale (hierarchical level) Linking

Baeurle, S.A. (2009). Multiscale modeling of polymer materials using field-theoretic methodologies: a survey about recent developments. Journal of Mathematical Chemistry, 46, 363-426.

\* using a single set of model parameters to describe data from multiple scales.

\* multigrid techniques sometimes used for well-defined problems.



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How do we link gene expression to cellular behavior? Cellular behavior to organismal behavior? Using a common currency?





## **Computational-based approaches**

| <b>Physiomic Modeling</b><br>SBML, and FieldML:  | using CellML   | _,     |
|--|--|--------|
| Physiome Organs Tissues  | Cells  |        |
| Signaling Metabolic<br>pathways Metabolic<br>pathways ATP<br>Ugand binding, ATP<br>Proteins<br>cytokines Proteome<br>Transcriptome, me   | Cell cycle, motility, contraction, adhesion,<br>secretion, sensory, transport<br>Carbohydrates<br>and lipids |        |
| Genome   | Nature Reviews   Molecular Cell Biology  |        |
| (13)rease represent<br>(13) rease<br>(13) rease<br>(13) rease<br>(13) rease<br>(13) rease<br>(14) rease<br>(15) reas | Models are<br>combined using<br>ontologies (e.g.<br>Bio PAX).  | )<br>] |
| Image: sector  | Challenge:<br>complex models<br>from separately-<br>validated parts.   | -      |

## **Computational-based approaches**



## **Trophic Model**



Exchange of energy and information between scales (see Alicea, Hierarchies of Biocomplexity: modeling life's energetic complexity. arXiv:0810.4547):

#### TOP-DOWN:

- \* constraint-based (information) interactions between scales.
- \* enforces trophic dependency (food web, complex dynamics).

### **BOTTOM-UP:**

- \* resource-based (energetic) interactions between scales.
- \* trophic relationship (discount between scales).

### PREDATOR-PREY-LIKE INTERACTIONS:

- \* coevolution (interdependence).
- \* extended to other systems (not explicitly consumptive).

#### Multiscale Decision-making Models (autonomous agents):

Wernz, C. and Deshmukh, A. (2010). Multiscale Decision-Making: Bridging Organizational Scales in Systems with Distributed Decision-Makers, European Journal of Operational Research, 202, 828-840.

#### **Hierarchical Interaction of Agents:**

\* behaviors coupled (e.g. short-term to long-term, local-to-global).

Hierarchical Production Planning (Hax and Meal, 1975):

\* higher levels "constrain" lower levels (organizational hierarchy).

\* top-down and bottom-up interactions can be modeled as a two player game.

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Examples of control within and between hierarchical levels in the brain:

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Cell populations A and B are countering each others' feedforward signals.

\* populations counter each other (if signals are matched).

Brain Region A has taken on the role of coordinator in the network:

\* becomes an autoregulatory loop.

Figure 1. Frontiers in Behavioral Neuroscience, 4(28), 1-9 (2010).



Figure 3. Hormones and Behavior, 59(3), 399–406 (2011).

#### Consequences of modeling averages and extremes:

Extremely local scale: intracellular millieu, neurons.

\* **example:** behaviors can vary widely between cells in a population, result in a coherent macro-state (population vector coding).

Extreme averaging: model of brain regions, brain states.

\* **example:** a large number of electrophysiological, biochemical parameter values will result in an "emotion".

Will a "mean field model" work for scale linking? Average behavior at one scale may result from fluxes at another scale, different mechanisms at different scales.

\* **example:** noise in gene expression can trigger changes in cellular state.

# Cellular Reprogramming is a Rare Event (in conjunction with Dr. Steven Suhr)

#### Direct Reprogramming is a rare event:

1) cryptic populations: 1:10<sup>6</sup> cells, small number of cell can expand (genetic drift-like).

2) efficiencies (infection): 0.0002 to 29%.

3) number of genes required to "reprogram": 4 out of 29,000 (human).



COURTESY: Stem Cell School (http://stemcellschool.com/)



Figure 1, Stadfeld, M. et.al, Cell Stem Cell, 2, 230-240, (2008).



# Temporal Hierarchies (e.g. slow kinetics of reprogramming) vs.

Scope (when processes occur across spatial, organizational scales).





Babu, Bio-Inspired Computing and Communication LNCS 5151, 162-171 (2008).

Scope (not spatial scale *per se*, but hierarchical):

\* expression of single gene can lead to a cascade.

\* a cascade produces a gene expression network.

## Direct Reprogramming as "Bursts" and "Phases"

"Bursty" behavior: large fluctuations randomly distributed in time (stochastic).

"Phasic" behavior: states which require major changes to initiate transitions.

