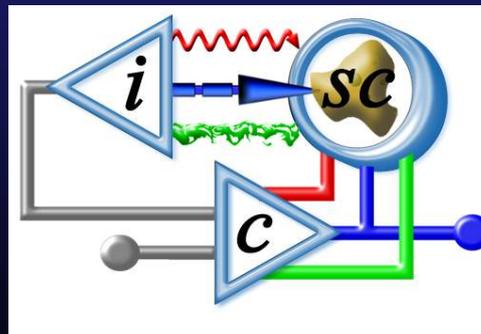


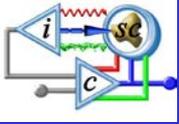
Experimental and Computational Requirements for Post-Genomic Integrative Cellular Physiology

John Wikswa

Instrumenting
and
Controlling

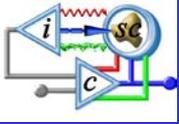


the Single Cell



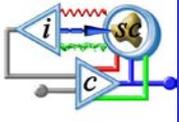
Topics

- The advantages of micro/nanoscale instruments
- Cellular complexity
- The need for closed-loop control
- How to identify early manifestations of disease
 - Modeling
 - Interactive, dynamical analysis
 - Mining dynamics data



Topics

- The advantages of micro/nanoscale instruments
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Reductionism in Science

Thermodynamics

Statistical
mechanics

Molecular/atomic
dynamics

Electrodynamics

Quantum
Chromodynamics

Bulk solids

Devices

Continuum
models

Microscopic
models

Atomic physics

Anatomy

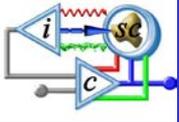
Physiology

Organ

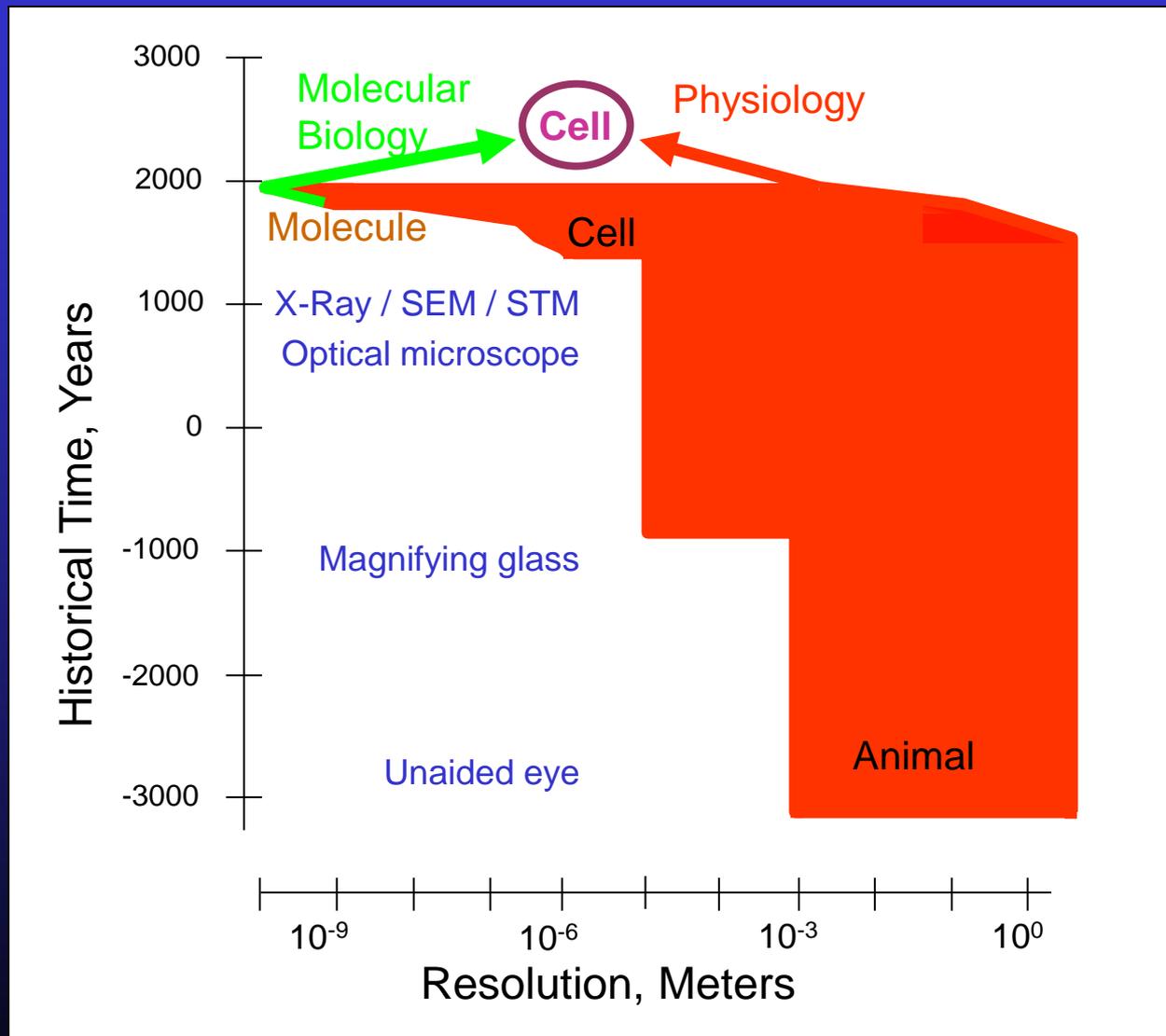
Cell

Protein

Genome



Historical Evolution of Spatial Resolution in Biology and Physiology



- **Genomics**

- Structural genomics

...

- **Proteomics**

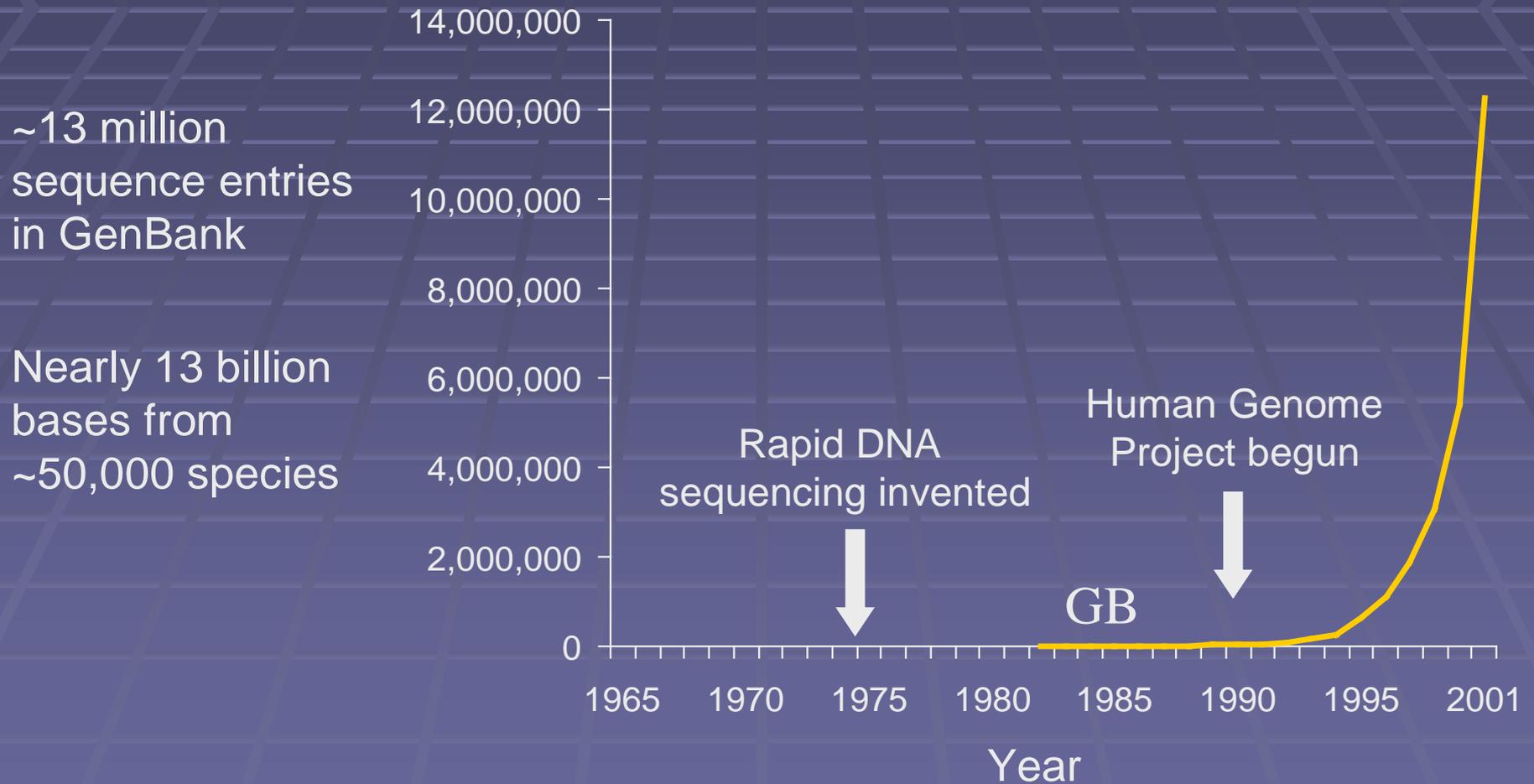
- Structural proteomics

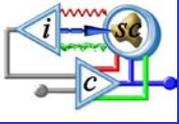
- Functional proteomics

...

- **What is next?**

The rate at which DNA sequences began accumulating was exponential

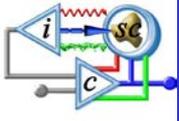




Hypotheses I and II

- I. The explosion in genomic and proteomic knowledge and measurement techniques will revolutionize the early detection of diseases

- II. Much of the potential lies in the clinical implementation of the instrumentation and techniques that provided the scientific foundation for genomics and proteomics



- **Analysis of biofluids**

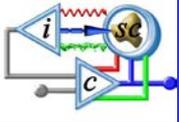
- Molecular profiles that define biological states (Dahl)
- Disposable plastic lab-on-a-chip devices for point-of-care systems (Luke Lee)
- Indwelling biosensors and analyzers (Stephen C. Lee)
- Chemokine and cytokine expression (Barrett Rollins; Philip R. Streeter)
- Gene expression patterns (Carl W. Cotman; Marti Jett)
- Detection of mutant alleles (Helmut Zarbl)
- Protein expression/distribution (Philip R. Streeter; Gordon R. Whiteley)

- **Single-pass analysis of proteins, cells and tissues**

- Detection of small numbers of molecules (Roger Brent)
- Multispectral cellular imaging (David Basiji)
- Protein distribution in tissues (Richard Caprioli)

- **Interactive cellular assays for systems biology**

- Disease/pathogen-induced changes in cells (Christopher Chen)
- Nanoscale sensing of single molecule binding (Michael Roukes)
- Massively Parallel, Multi-Phasic Cellular Biological activity detectors (John Wikswo)



Technologies for Early Disease Detection

- **Analysis of biofluids**

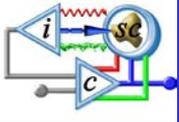
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- **Single-pass analysis of cells and tissues**

- Detection of small numbers of molecules (Roger Brent)
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- **Key Features:**

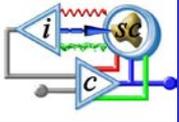
- **Low temporal bandwidth sensing**
 - **Slow events, long measurement intervals or single-pass imaging**
- **Semi-standard, static biochemical analyses**
 - **Feature correlation and pattern recognition**
- **Will benefit directly from advances in genomics and proteomics**
- **May involve significant issues in bioinformatics**
- **Will benefit from Micro/Nano**



Standard Rationale for Micro & Nanoscale Analytical Systems

BioMicroElectroMechanical Systems (BioMEMS)

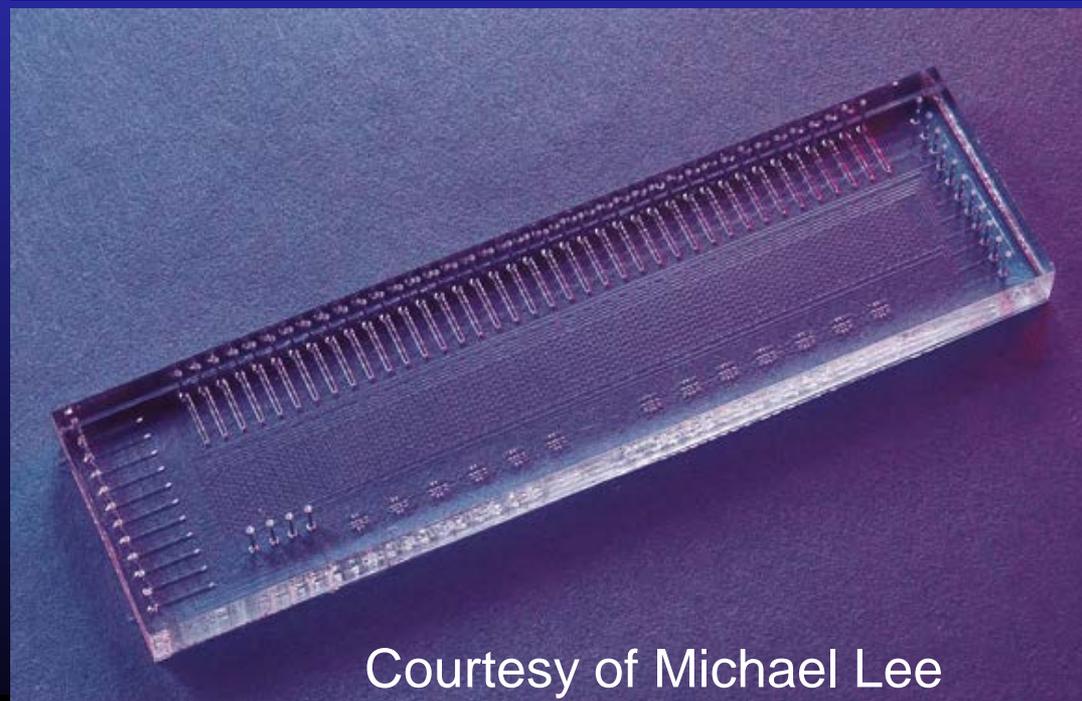
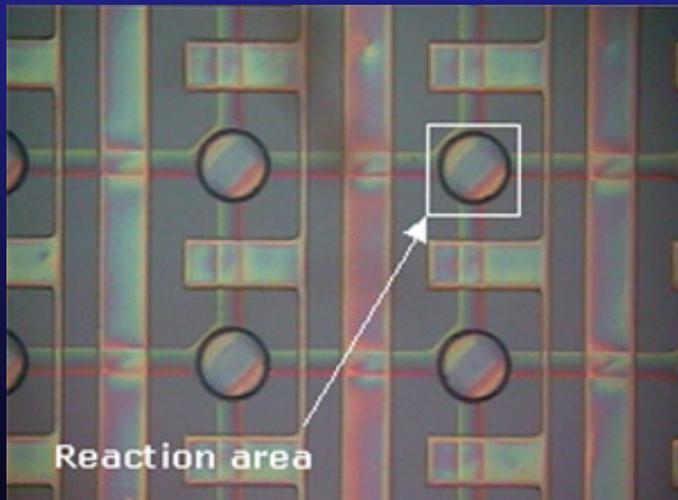
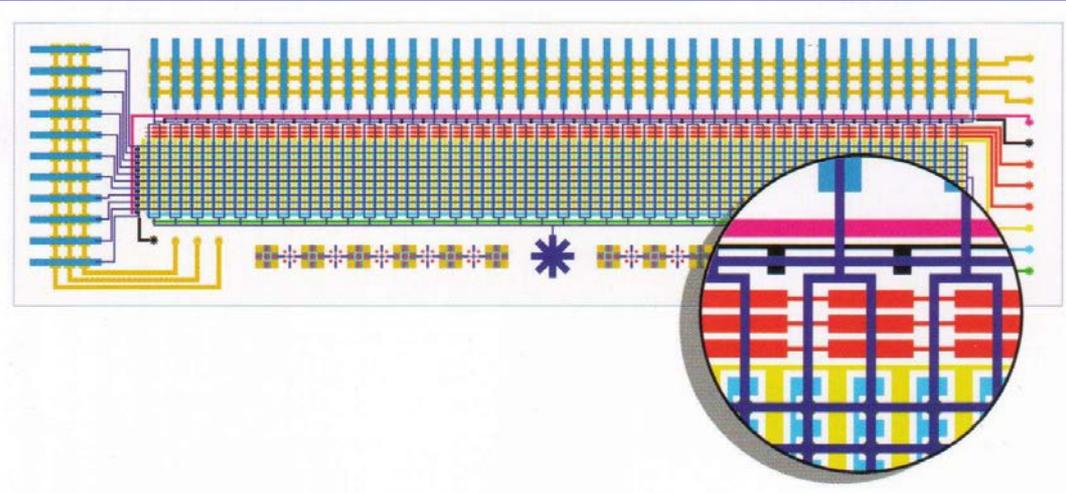
- Low-cost mass production
- Automated analysis
- Reduced instrument footprint
 - Single instruments are very, very small
 - Reduced volumes of analyte and reagents
 - Massively parallel
 - Increased data
 - Lower cost per datum
 - Combinatorics for frontal assault on multivariable systems
- Enabling new physical/chemical properties
 - Single molecule detection
 - Quantum dots



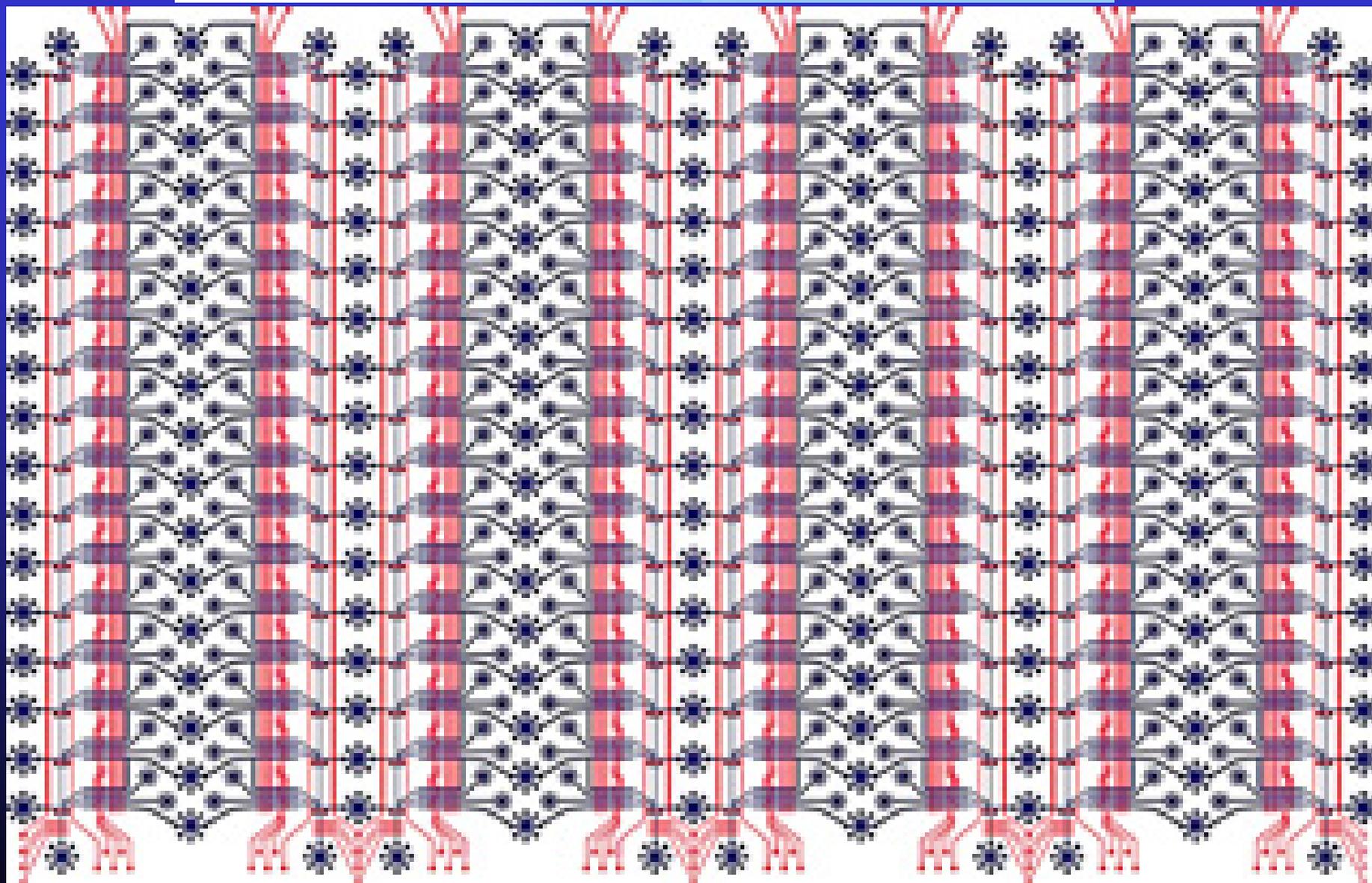
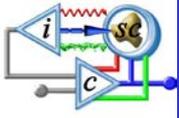
- ~2,000 valves to control

- Reagents
- Samples
- Wash steps

www.fluidigm.com



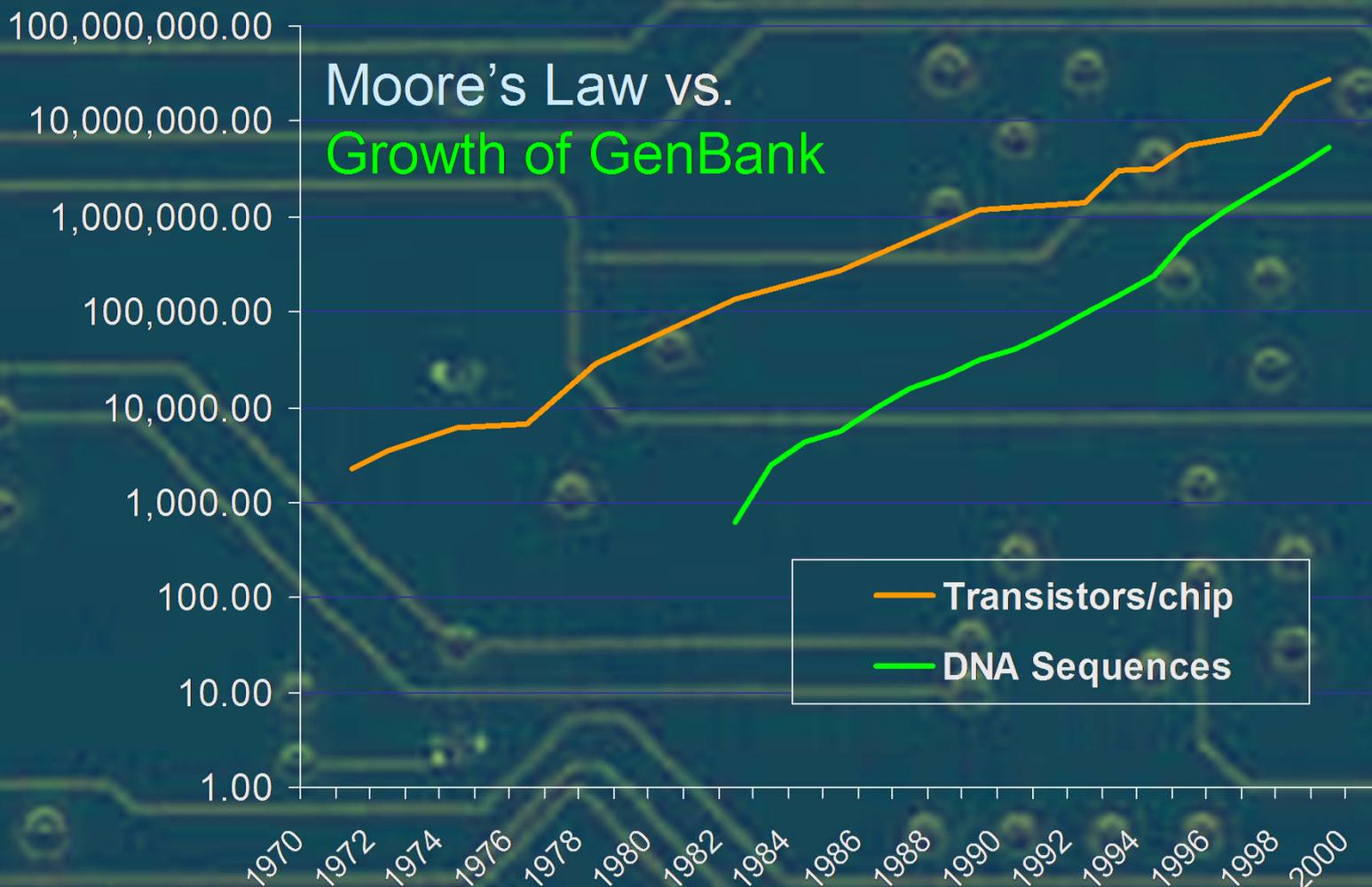
Courtesy of Michael Lee

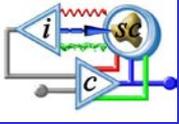


“Anticipated advances in computer speed will be unable to keep up with the growing [DNA] sequence databases and the demand for homology searches of the data.”

**Charles DeLisi, 1988
U.S. Department of Energy**

Luckily, DeLisi's dire prediction has not (yet) come true

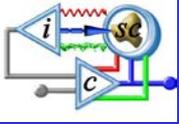




Genomics

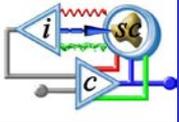
Proteomics

What is next?



Topics

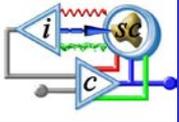
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- Cellular complexity
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Hypotheses III and IV

- III. Historically, dynamical studies of cellular metabolism and signaling pathways have been limited by the bandwidth of laboratory biochemistry

- IV. BioMicroElectroMechanical Systems (BioMEMS) offer promise to extend the measurement bandwidth for both research and clinical diagnosis

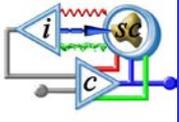


- **Interactive cellular assays for systems biology**

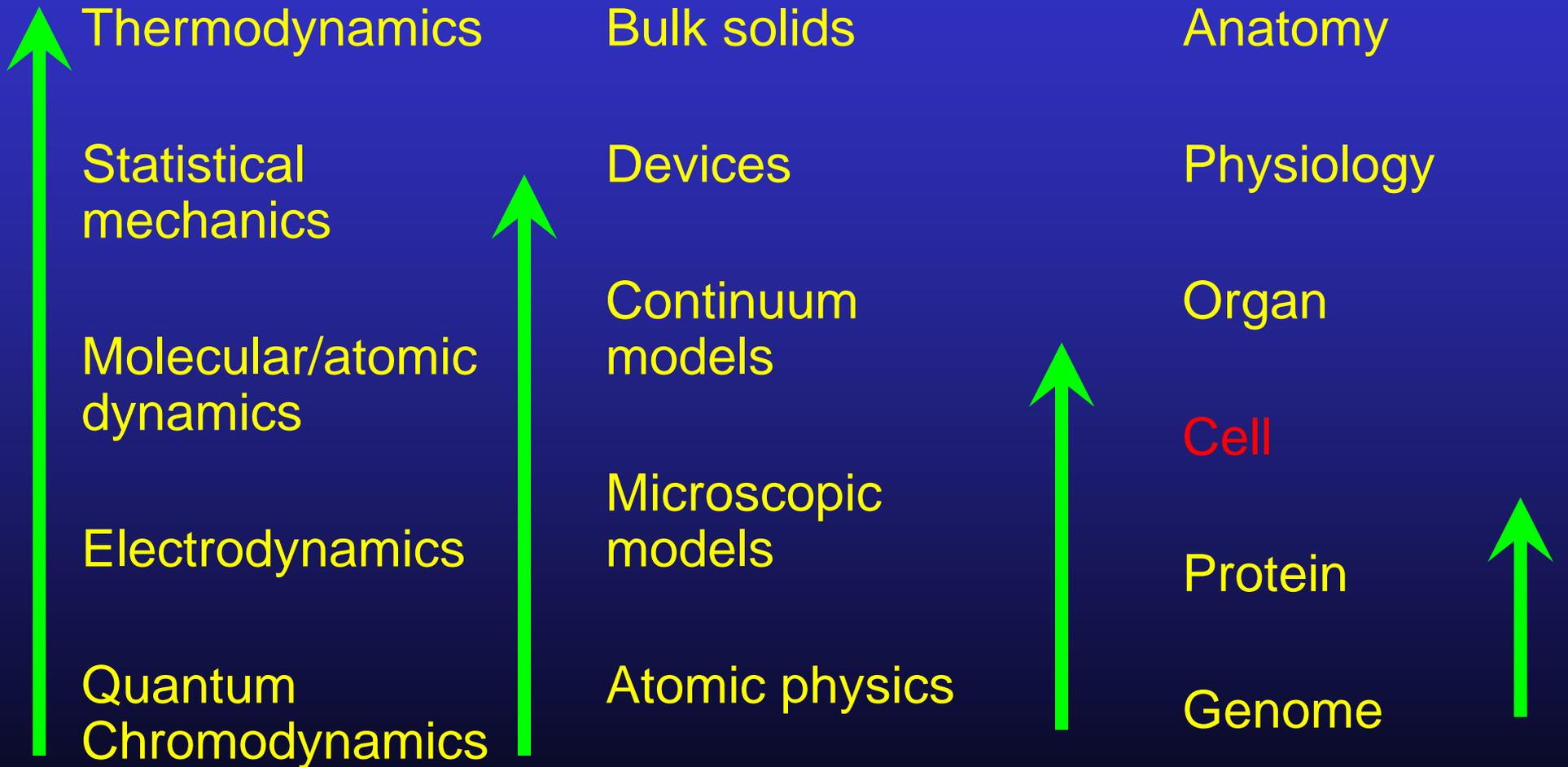
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- Massively Parallel, Multi-Phasic Cellular Biological Activity Detectors (John Wikswo)

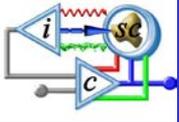
- **Key Features:**

- **More closely related to experimental physiology than classical clinical biochemistry**
- **Can involve rapid sensing of physiological *dynamics***
- **Measurement bandwidth \ll physiological bandwidth**
- **Real-time intervention is REQUIRED to probe the dynamics**
 - **Internal vs. external feedback**
 - **“Bandwidth is everything”**
- **May require models for interpretation of complex interactions**
 - **There may be significant computational constraints to multiscale dynamical models**



Post-Reductionism

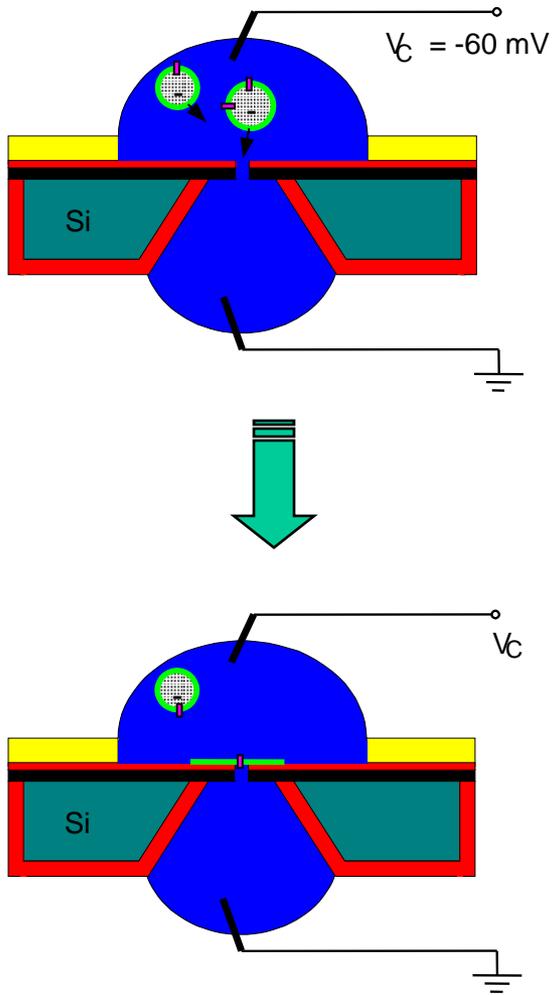




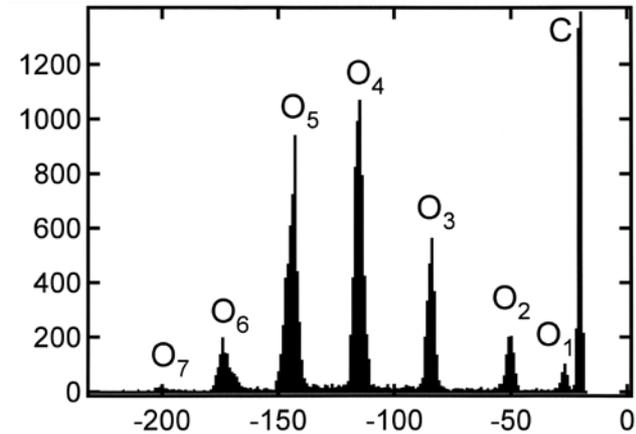
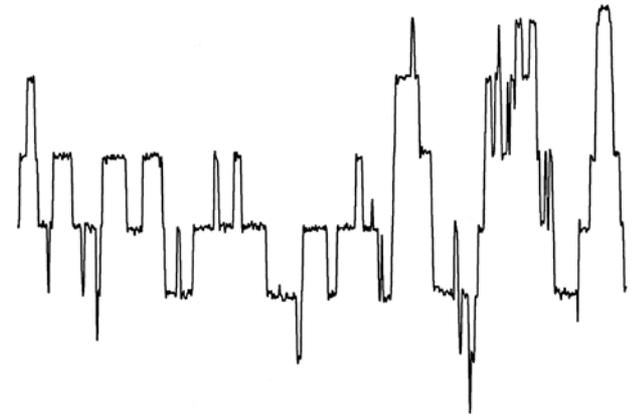
What about dynamic processes?

- Physiology is *dynamic*
 - Cell cycle
 - Developmental differentiation
 - Growth
 - Voltage- and ligand-gates ion channels
 - Propagating waves
 - Signaling cascades
 - Closed-loop feedback and control

Cytion Planar Patch Clamp



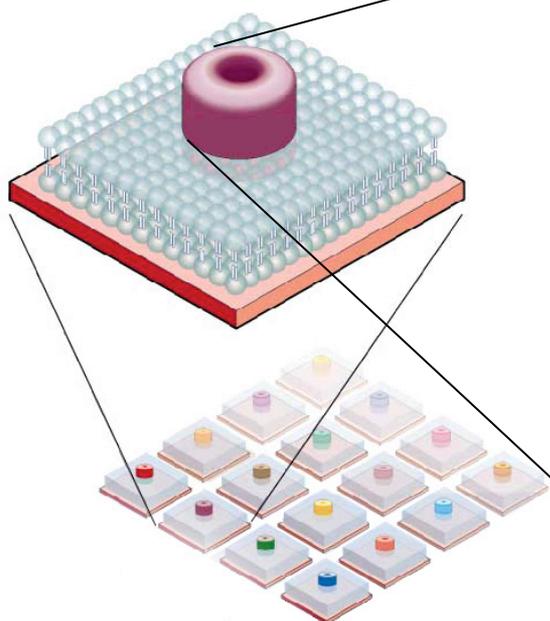
Alamethicin with its typical activation (up to 7 conductance states)



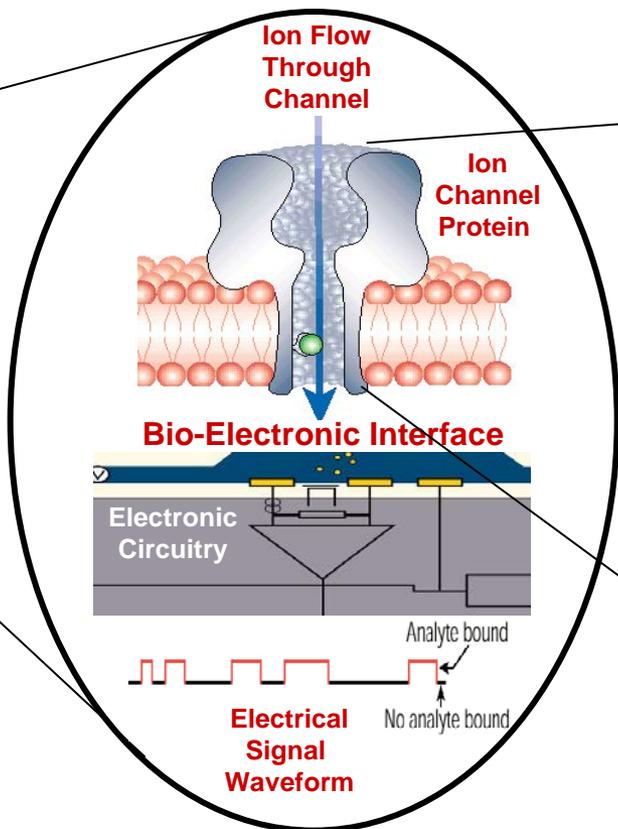
$V = +60 \text{ mV} \rightarrow E > 12\,000 \text{ V/m} !!$



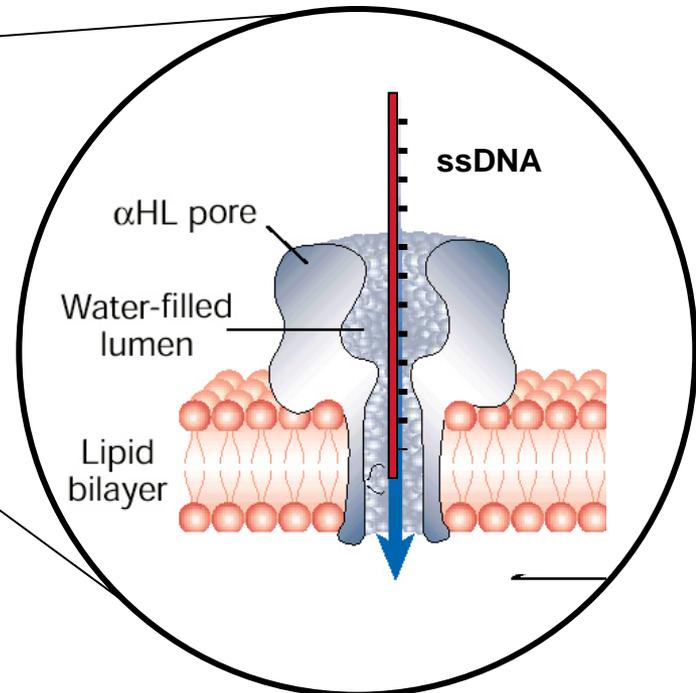
Array of Ion Channels



Array Platform

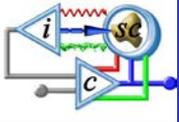


Single Device Architecture



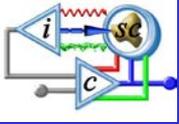
Molecular Scale Control/Precision

- Direct, Real Time Molecular Sensor/Reader
- Sensors, Switches, Amplifiers, Filters, Power Generators,
- Demonstrate High Speed DNA Read-out for Applications such as DNA Computing, Bio-Sensing, ...



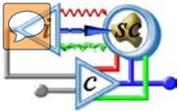
Physical and Biological Time Constants, Seconds

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Heat transfer (forced convection)	10 ³ - 10 ⁴
Cell proliferation, DNA replication	10 ² - 10 ⁴
Response to environmental changes (temperature, oxygen)	10 ³ - 10 ⁴
Messenger RNA synthesis	10 ³ - 10 ⁴
Translocation of substances into cells (active transport)	10 ¹ - 10 ³
Protein synthesis	10 ¹ - 10 ²
Allosteric control of enzyme action	1
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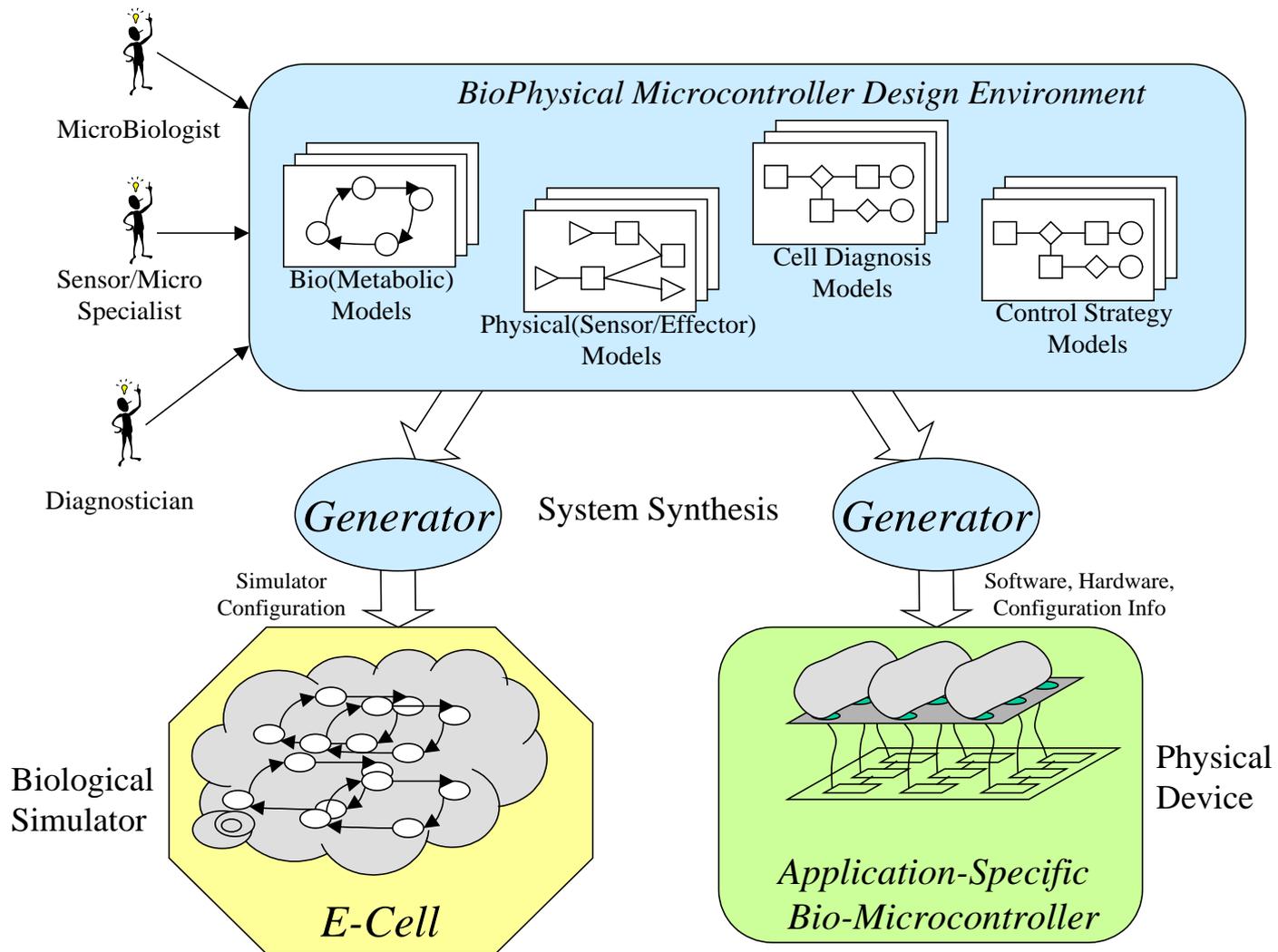


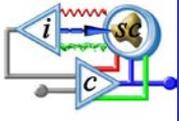
The Systems Physiology Challenge

- Use experimental measurements, numerical simulations, and knowledge of the genome and proteome to unravel the complex, multiscale interactions and dynamics in normal physiology, toxic exposures, and disease
 - Metabolic networks
 - Intracellular and extracellular signaling
 - Gene expression
 - Protein interactions
 - Cell-cell interactions
 - Active transport
 - Development, growth, aging, death

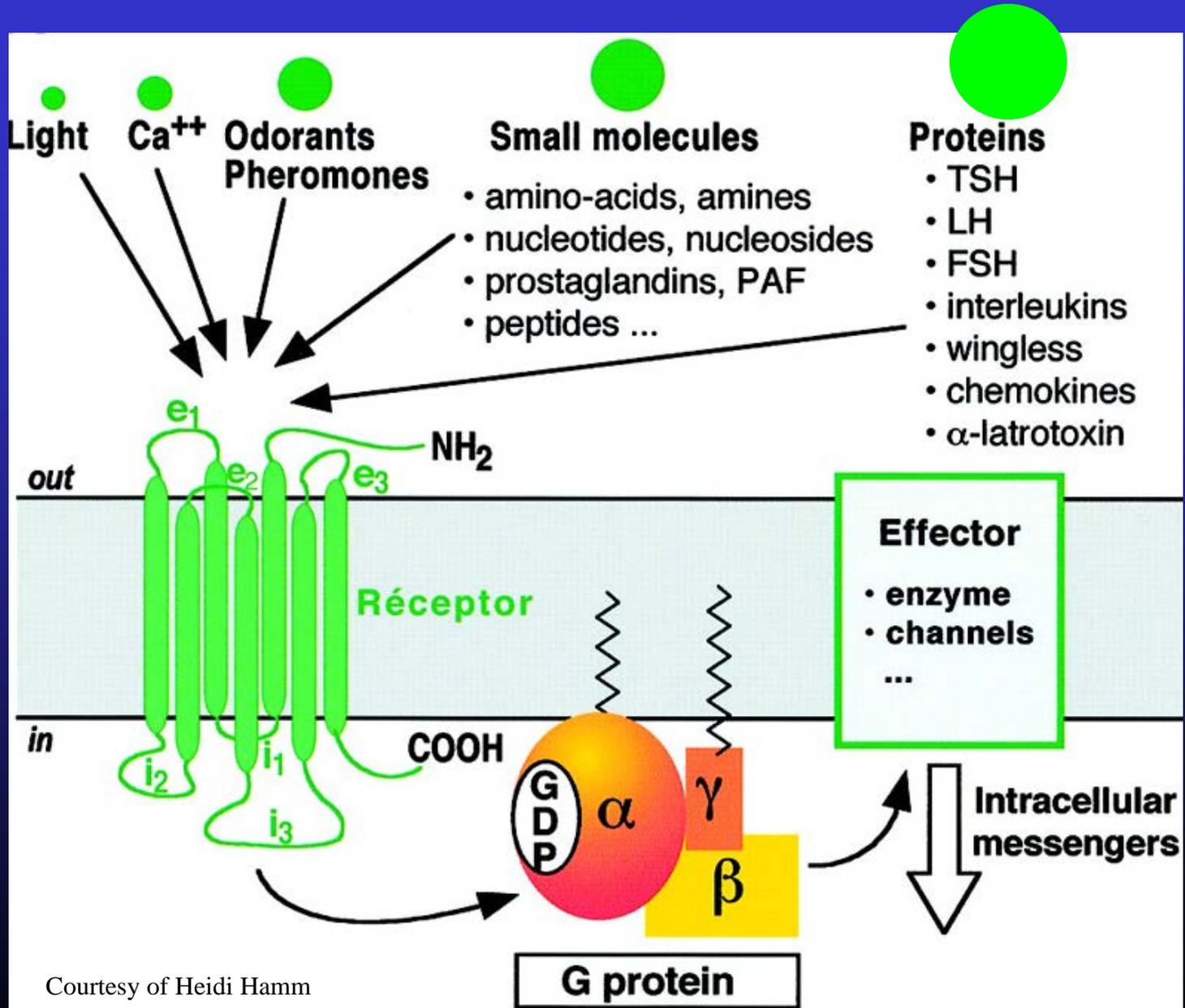


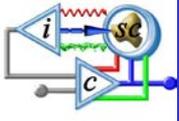
Biological Modeling and Analysis



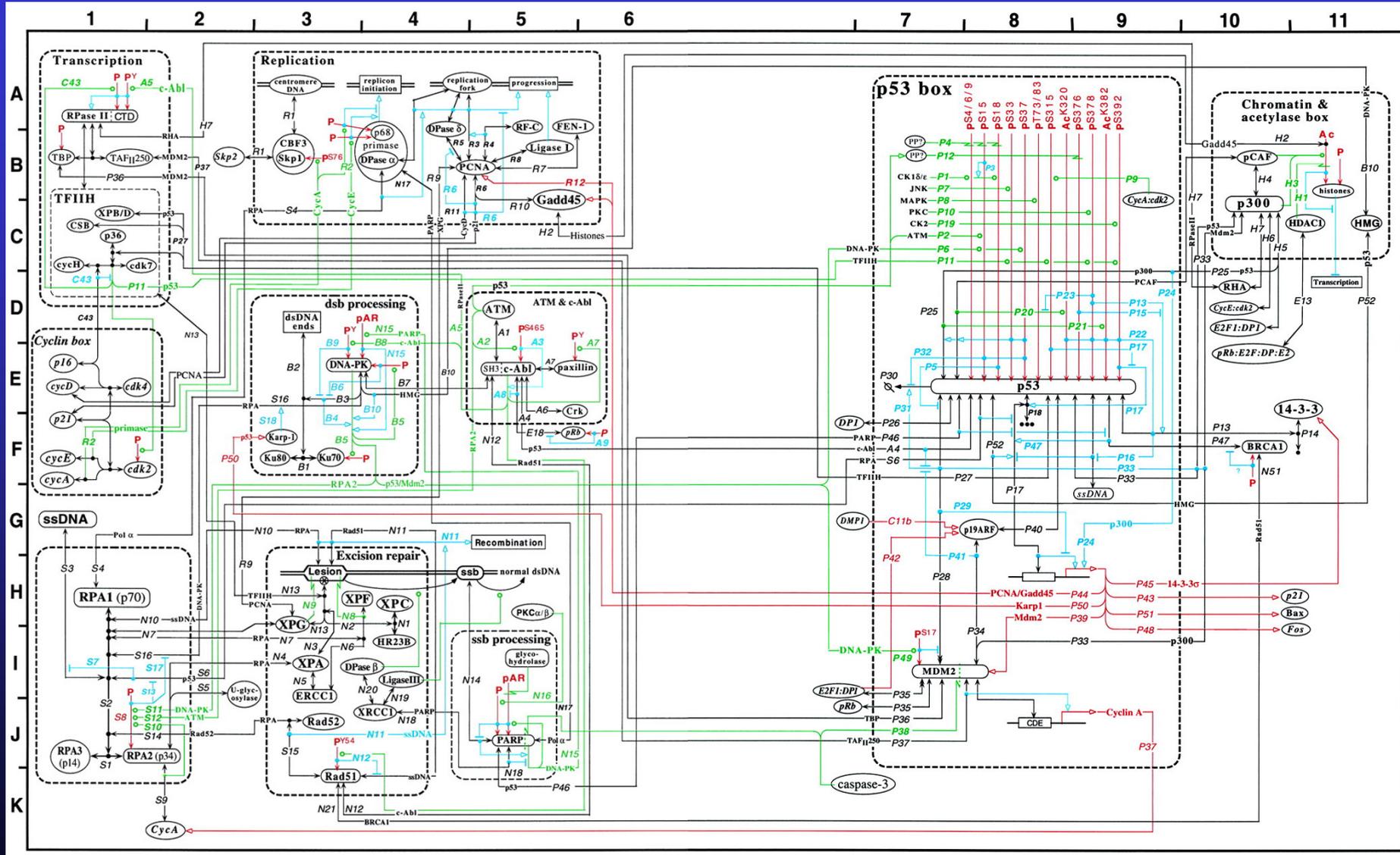


G-Protein Coupled Receptors

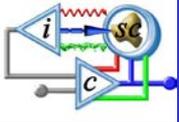




Molecular Interaction Map: DNA Repair

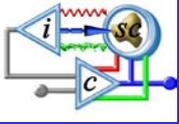


KW Kohn, "Molecular Interaction Map of the Mammalian Cell Cycle Control and DNA Repair Systems," *Mol. Biol. of the Cell*, 10: 2703-2734 (1999)



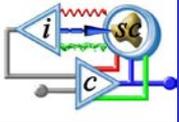
The Catch

- Modeling of a single mammalian cell may require 100,000 variables and equations
 - Cell-cell interactions are critical to system function
 - 10^9 interacting cells in some organs
 - Models may be leibnitz-class
 - *The data don't yet exist to drive the models!*
 - Hence we need to experiment...
- *1 leibnitz = 1 mole of PDEs ~ 1 etaFLOPS-year



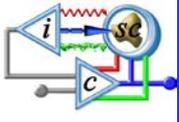
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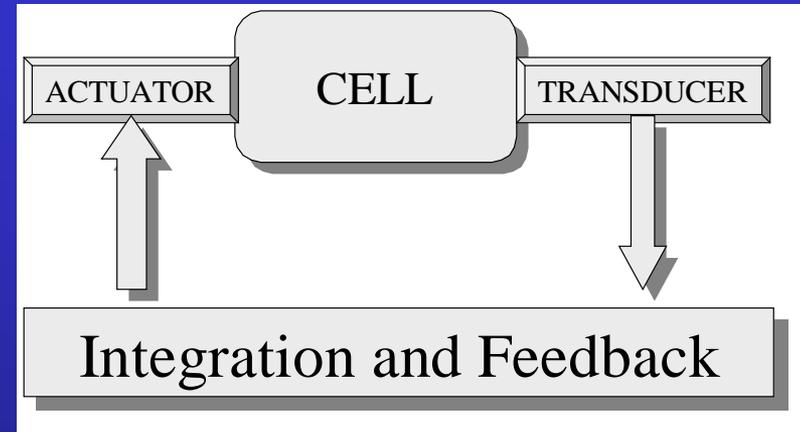
The Experimental Problem

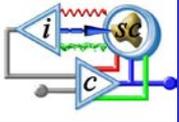
- **Most chemical and metabolic sensors and actuators**
 - Are too slow to track biochemical events at the cellular level
 - Are made one at a time
- **Biological systems contain extensive closed-loop, multilevel, feedback and control**
 - Simple, single-step observations cannot discern how control is distributed through the system.
 - Closed-loop metabolic control is today possible only at the animal and organ level, e.g., glucose clamp
 - Chemical control is limited by diffusion, stirring, uncaging rates, or the time required to move a cell from one medium to another
- **Post-genomic physiology needs multiparameter, wide-bandwidth cellular metabolic and signaling sensing and control**



What do we need?

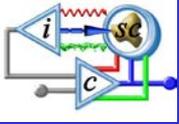
- Simultaneous, fast sensors (transducers) that detect a of changes within outside the cell
- Actuators that control the microenvironment within and outside the cell
- Openers for the internal feedback loops
- System algorithms and models that allow you to close and **stabilize** the external feedback loop
- ...





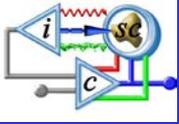
The Challenge: Instrument and Control the Cell

- Develop the tools and techniques for integrative, post-genomic **cellular** biology
 - Genes
 - Proteins
 - Metabolic and signaling pathways
 - **Instruments**
 - **Models**
 - **Wide-bandwidth dynamic control theory for cellular systems**
- **How do normal and diseased cells *function*?**



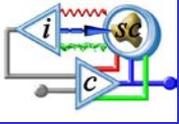
Instrumenting the Single Cell

- **Arrays of instrumented single or multiple cells:** Rapid, sensitive, and accurate differential diagnosis of cellular pathophysiology
- **Cellular dynamics:** Discrimination between causal and secondary events
- **Functional biopsy:** Determine the state of specific physiological pathways and mechanisms affected by an as-yet undetected disease, and thus define a prophylaxis or therapy.
- **Artificial, minimal cells:** engineered to serve as dedicated, configurable, robust on-chip biosensors.
“Quantitative physiology at the speed of life,” *C. Kovac*



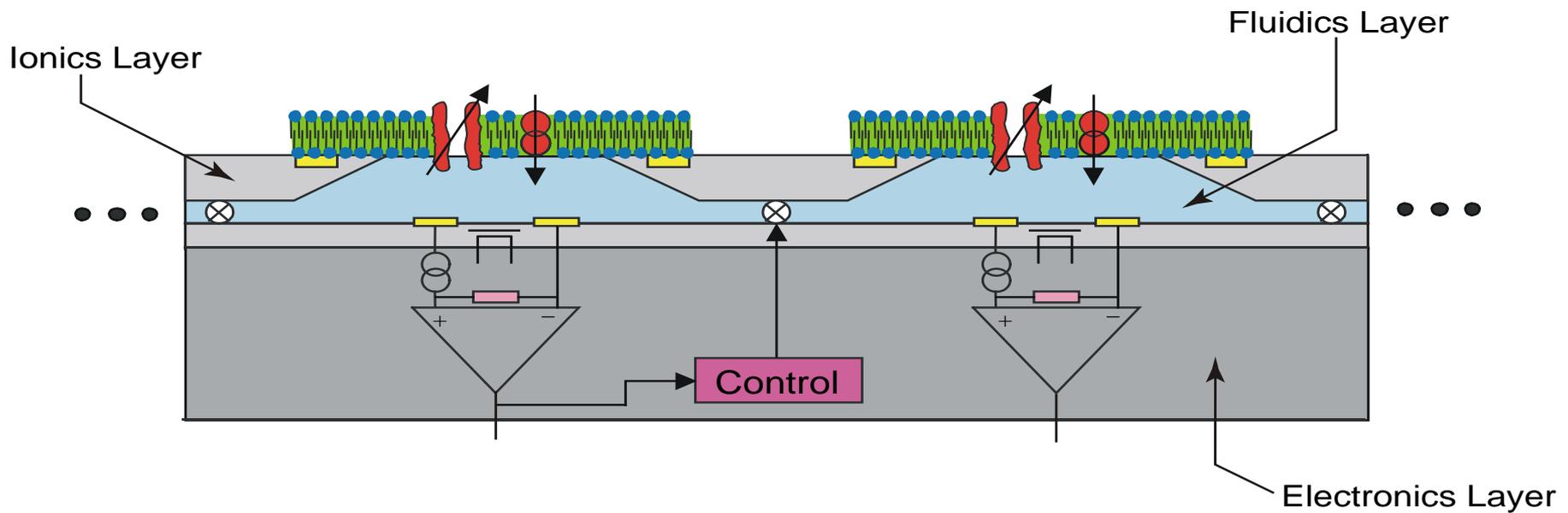
Possible Approaches

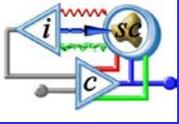
- A biological cell or molecule inserted into a microinstrument, e.g., a single-cell spectrophotometer or a whole-cell patch clamp
- A nanoinstrument inserted into the cell/molecule, e.g., caged ATP
- Combine the two approaches to form an FAST integrated, closed-loop bio/nano/micro system



MicroBottle

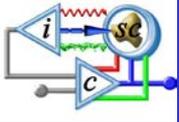
- Goal – utilize proven gigaOhm seals to biological membranes
- Result – high-speed microfluidics and silicon microelectronics can be placed “inside” a living cell





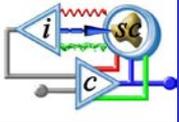
Hypotheses V and VI

- V. Great advances in physiology have been made through opening physiological feedback loops and applying external control
- Frank-Starling cardiovascular regulation
 - Glucose/insulin regulation
 - Hodgkin-Huxley model of the nerve action potential
- VI. There will exist a class of diseases or susceptibilities to drugs or toxins that can be diagnosed through altered cellular dynamics



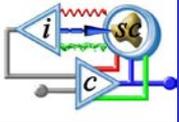
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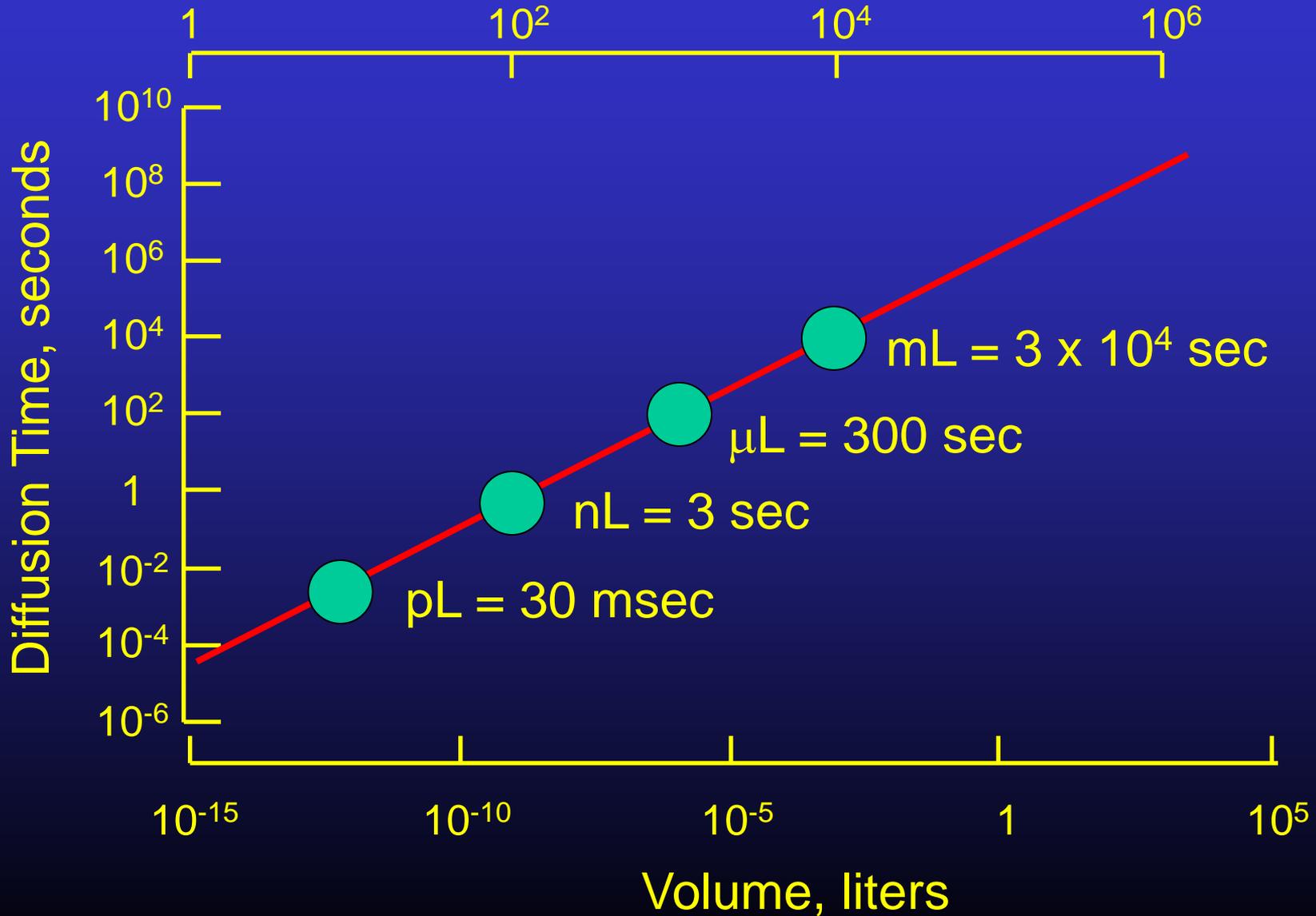
A Key Rationale for Micro & Nanoscale Analytical Systems

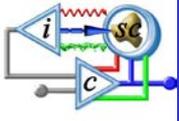
- Wide measurement bandwidth, *i.e.*, good response to high frequencies, is required to track *fast* cellular events
- Stable control of fast systems requires high bandwidth
- Small is the best way to beat the time for diffusional mixing in large-scale assays
- Small lets one look at individual cellular events rather than ensemble averages



Lactate Diffusion Times

Linear Dimension, microns

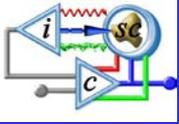




What do we gain by small and fast?

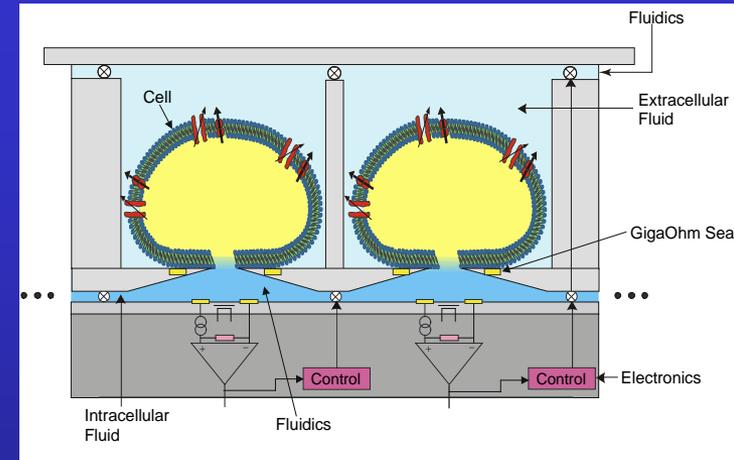
- Electrochemical sensitivity scale-invariant; frequency response improves as size is decreased
- Decreased mixing times for mass and heat transfer
- Reduced reagent volumes for rapid injection
- Many nanocultures within a single device
- Monitor known, small ($N=1?$) number of cells in each nanoculture
- Array of NanoBioReactors, in parallel, in series, and with redundancy for high-content screening

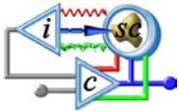
Fast, small, and many by moving from milliliters and microliters to nano and picoliters!



Chemical Clamp

- **Sensors:** Advanced micro and nanosensors can quantify the extracellular and intra-cellular environments with unprecedented temporal resolution
- **Actuators:** Microfluidics can control extracellular and intracellular concentrations of key chemicals with millisecond-response picoliter pumps
- **Openers:** RNAi, genetic knockouts, and blockers will allow opening of the internal feedback loop
- **Controllers:** It will be possible to create high-speed extracellular and intracellular chemical clamps functionally equivalent to voltage clamp for V_m

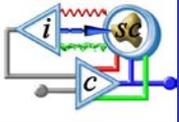




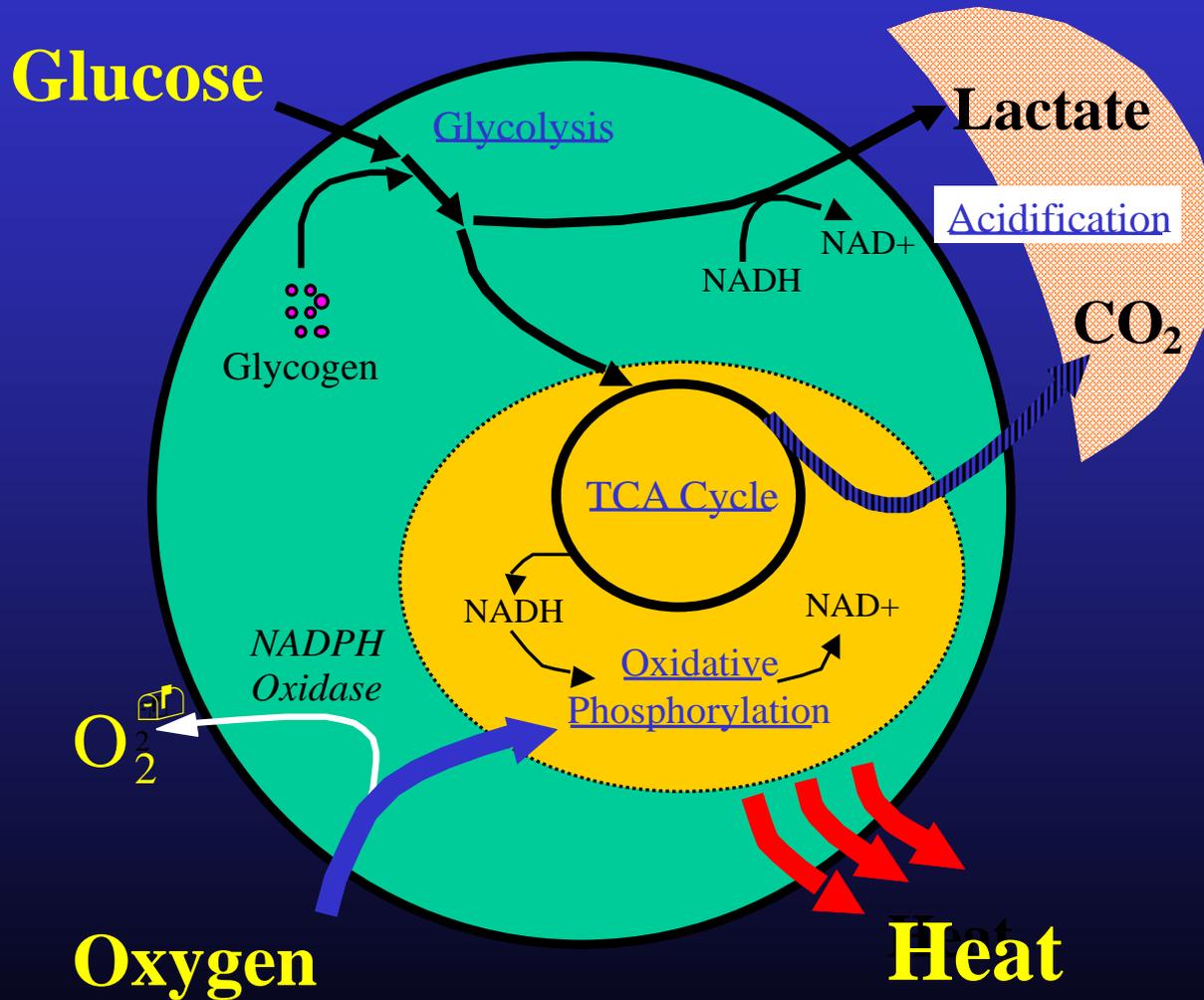
High-Content Toxicology Screening Using Massively Parallel, Multi-Phasic Cellular Biological Activity Detector (MP²-CBAD)

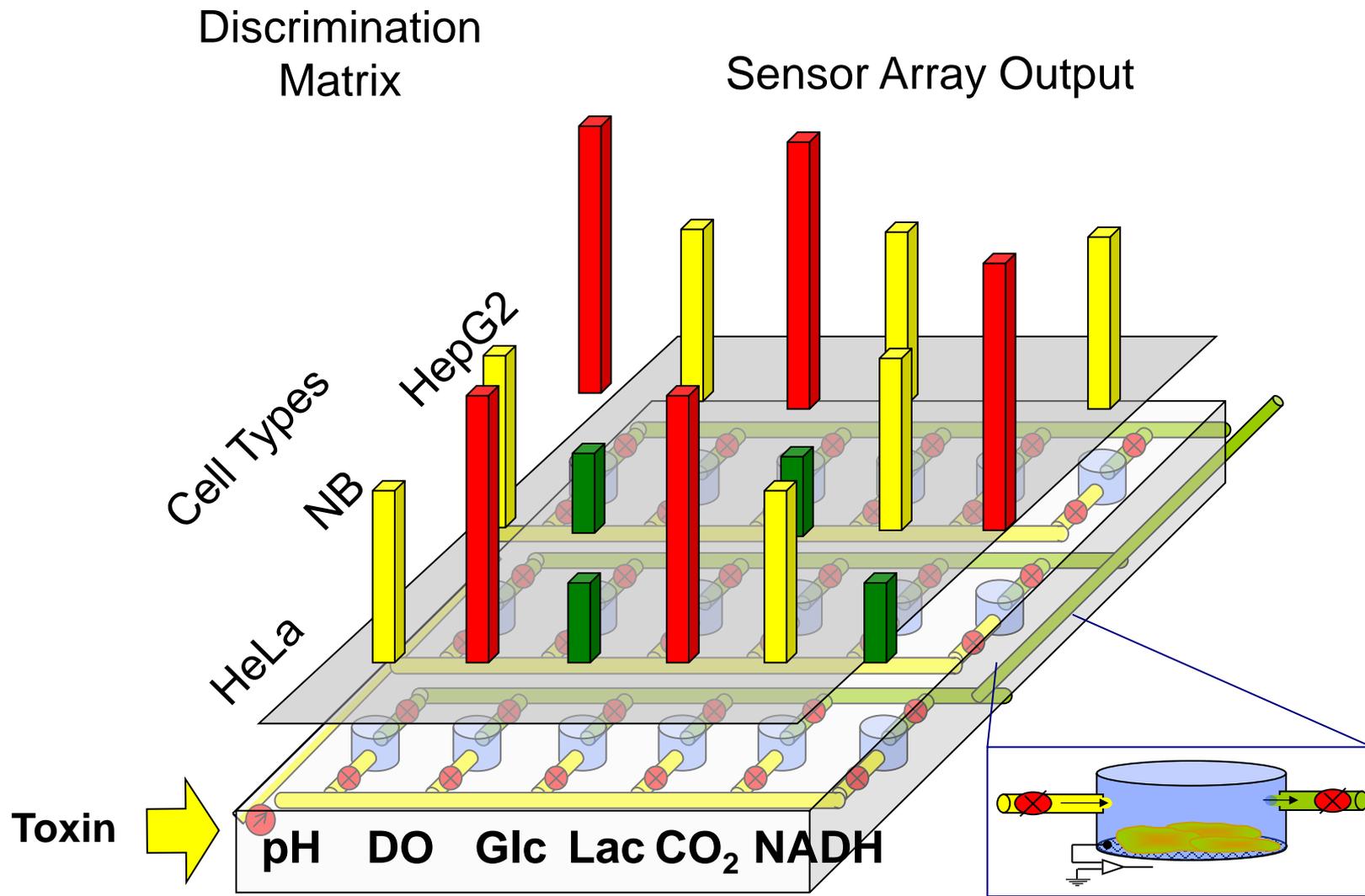
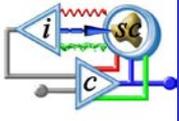
Vanderbilt University

*Departments of Biomedical Engineering, Chemical
Engineering, Chemistry, Mechanical Engineering,
Molecular Physiology & Biophysics, Physics & Astronomy*

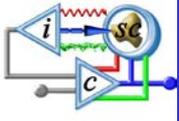


Cell Metabolism

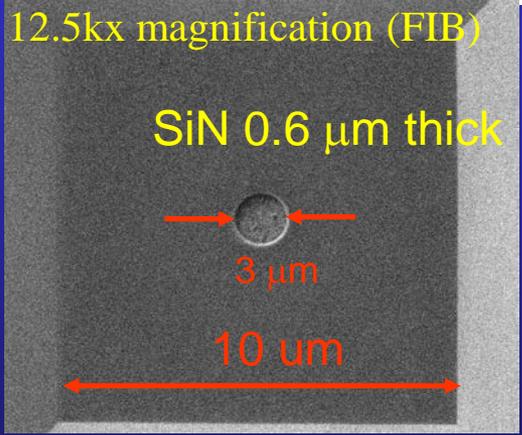
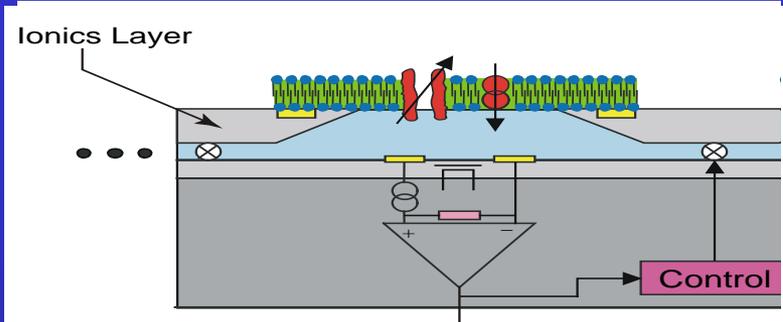




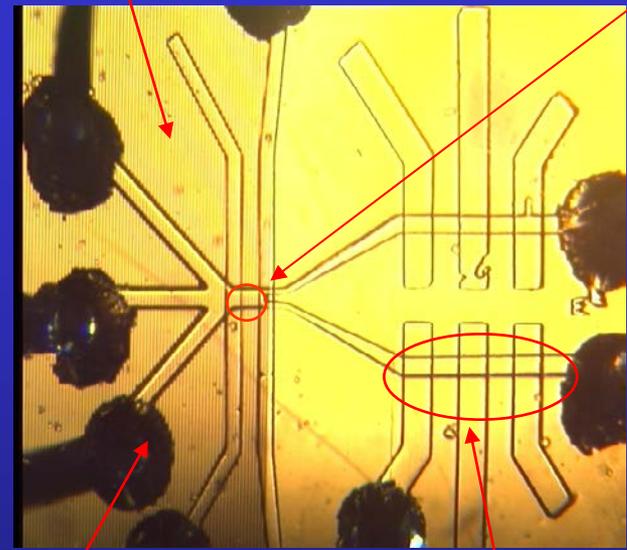
NanoPhysiometer



Vanderbilt Instrumenting the Single Cell



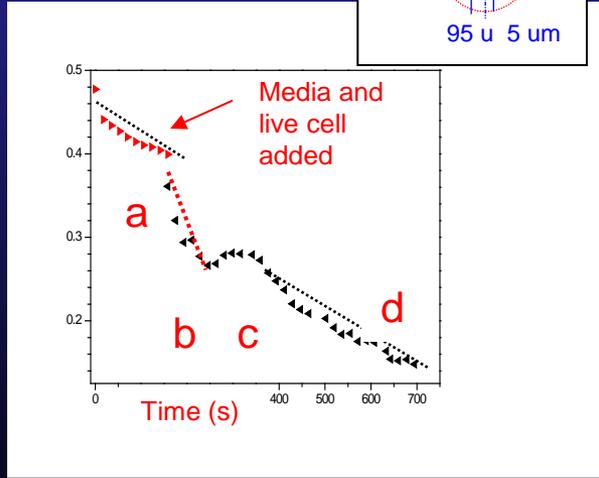
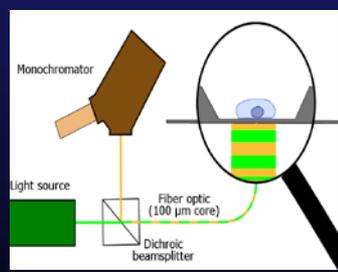
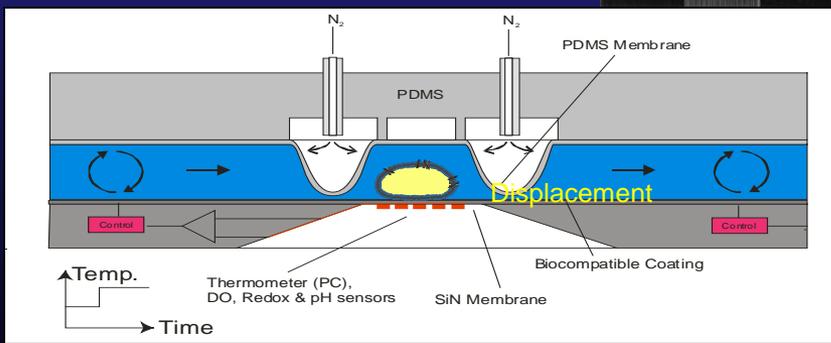
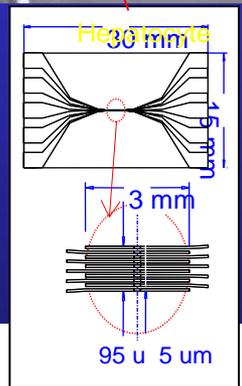
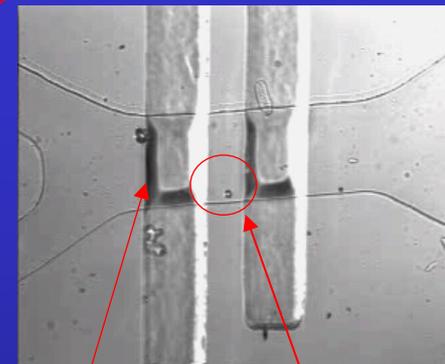
Interdigitated Array Electrodes (IME)



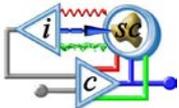
Waste Channel

Valves - Peristaltic Pump

Sensing volume (0.25 nL)



Advanced Technology for next generation CBW Biosensors



Coupled Modeling of Cell and Environment

- Convective-diffusive transport of analytes by a 3D time-dependent flow
- Cell boundary conditions controlled by dynamic metabolism model
- Computational model built with CFD-ACE+ (CFDRC)

Electrochemical Sensors:

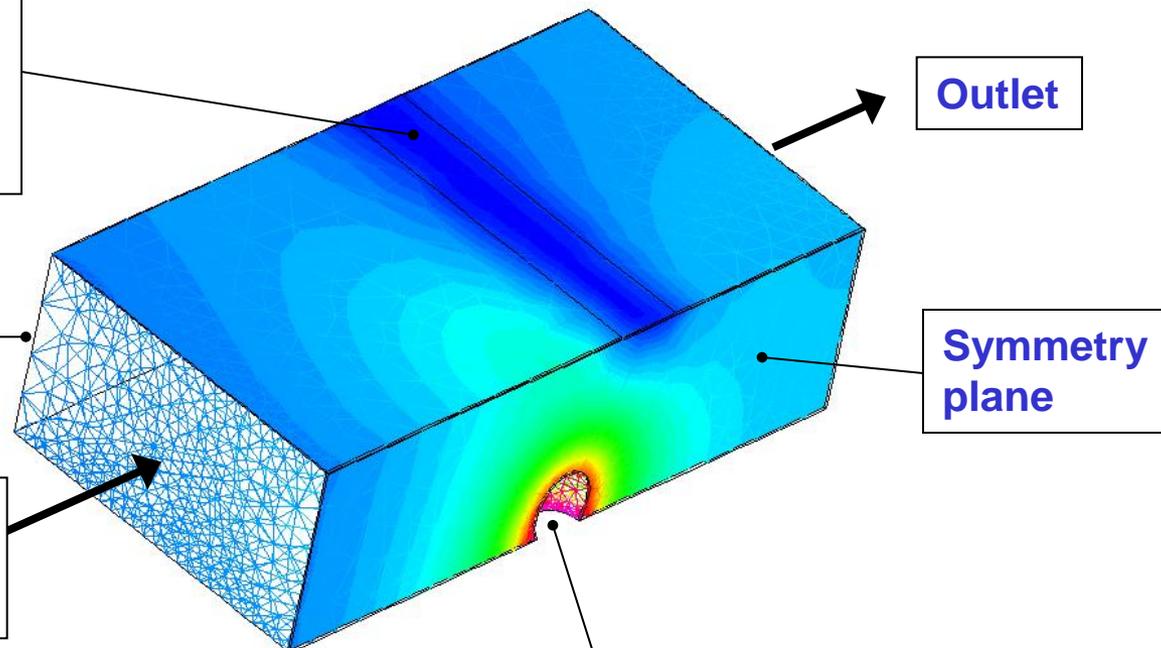
- Zero concentration at surface
- Sensor signal proportional to concentration gradient at surface
- Customizable location, geometry

Channel Walls:

- Impermeable or permeable

Inlet Flow:

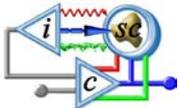
- Pressure driven or electrokinetic
- Specified analyte concentrations



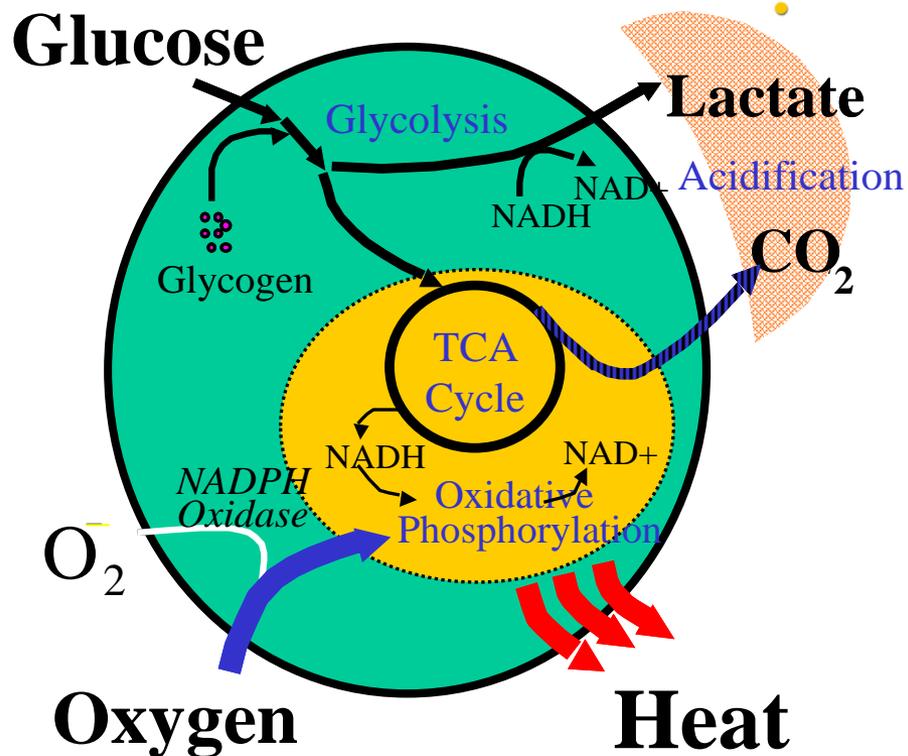
Single Cell Model:

- Membrane shape coupled to flow
- Membrane fluxes specified according to environment and dynamic metabolism model

Mark Stremmer and Steven Yu,
Mechanical Engineering



The Challenge: Convert Steady-State Metabolic Flux Balances to Dynamic Metabolic Network Responses



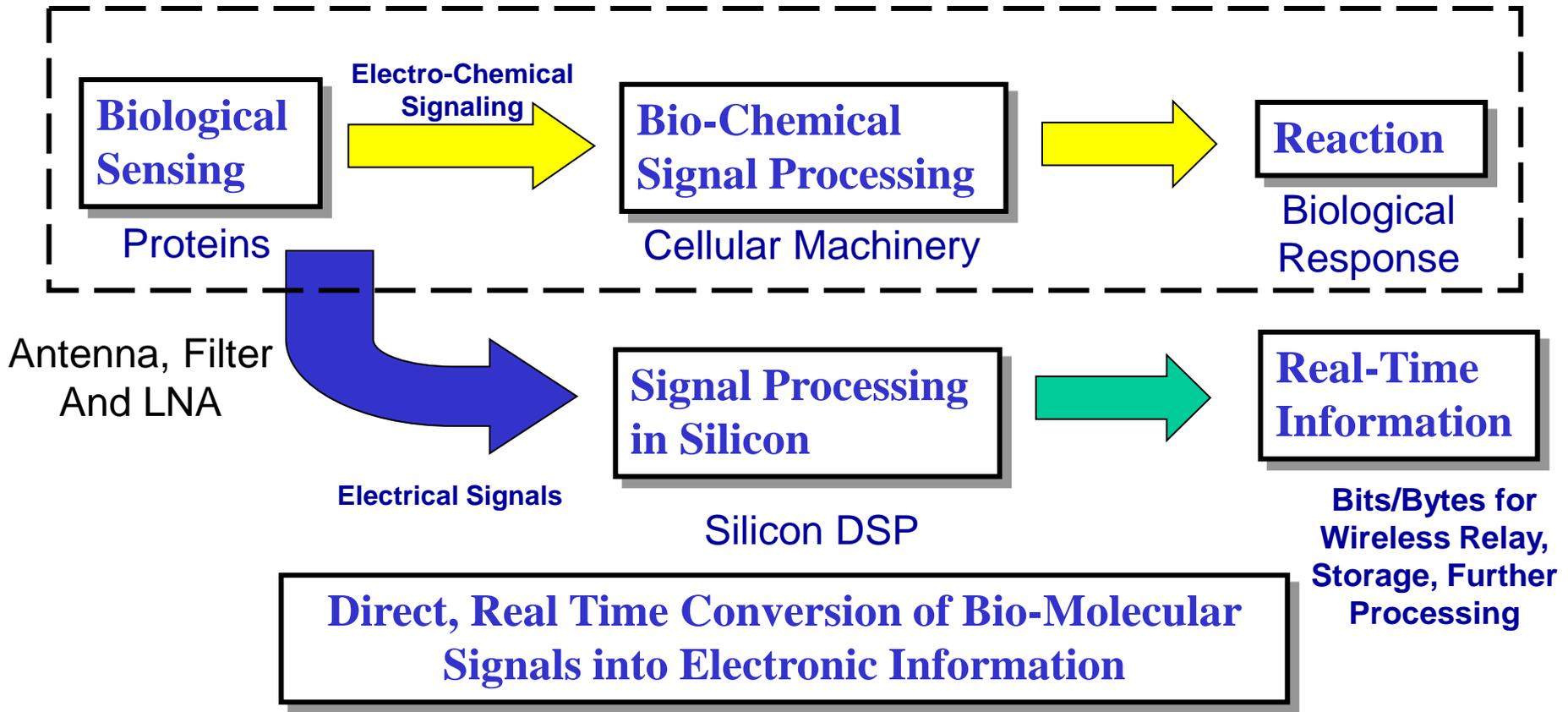
Glucose + 2 ADP + 2 NAD⁺	→	2 Pyruvate + 2 ATP + 2 NADH
Pyruvate + NADH	→	Lactate + NAD⁺
Pyruvate + CoA + FAD + GDP + 3 NAD⁺ + NAD(P)⁺	→	3 CO₂ + FADH₂ + GTP + 3 NADH + NAD(P)H
0.5 O₂ + 3 ADP + NADH	→	3 ATP + NAD⁺
0.5 O₂ + 2 ADP + FADH₂	→	2 ATP + FAD

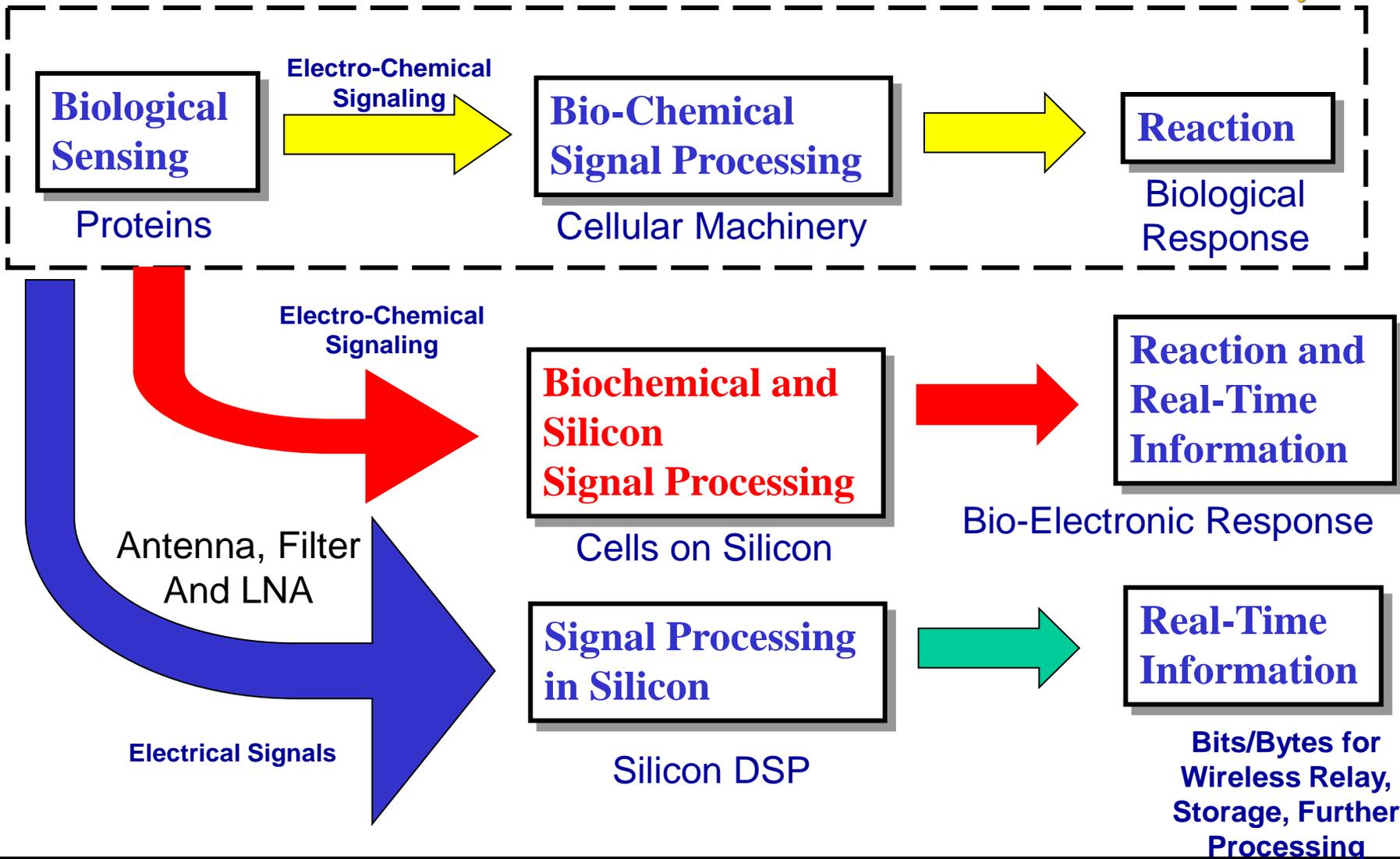
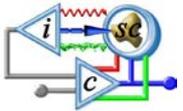


Devices/Systems

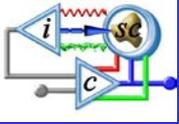
Exploit Proteins as High Performance Nanoscale Signal Processing Devices

➤ **Create Technologies to Assemble, Integrate and Interconnect Protein Devices with Silicon Circuitry (Biology-to-Digital Converter)**



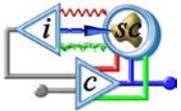


Biological and Biochemical Preamplifiers to Biological Amplifiers and Detectors

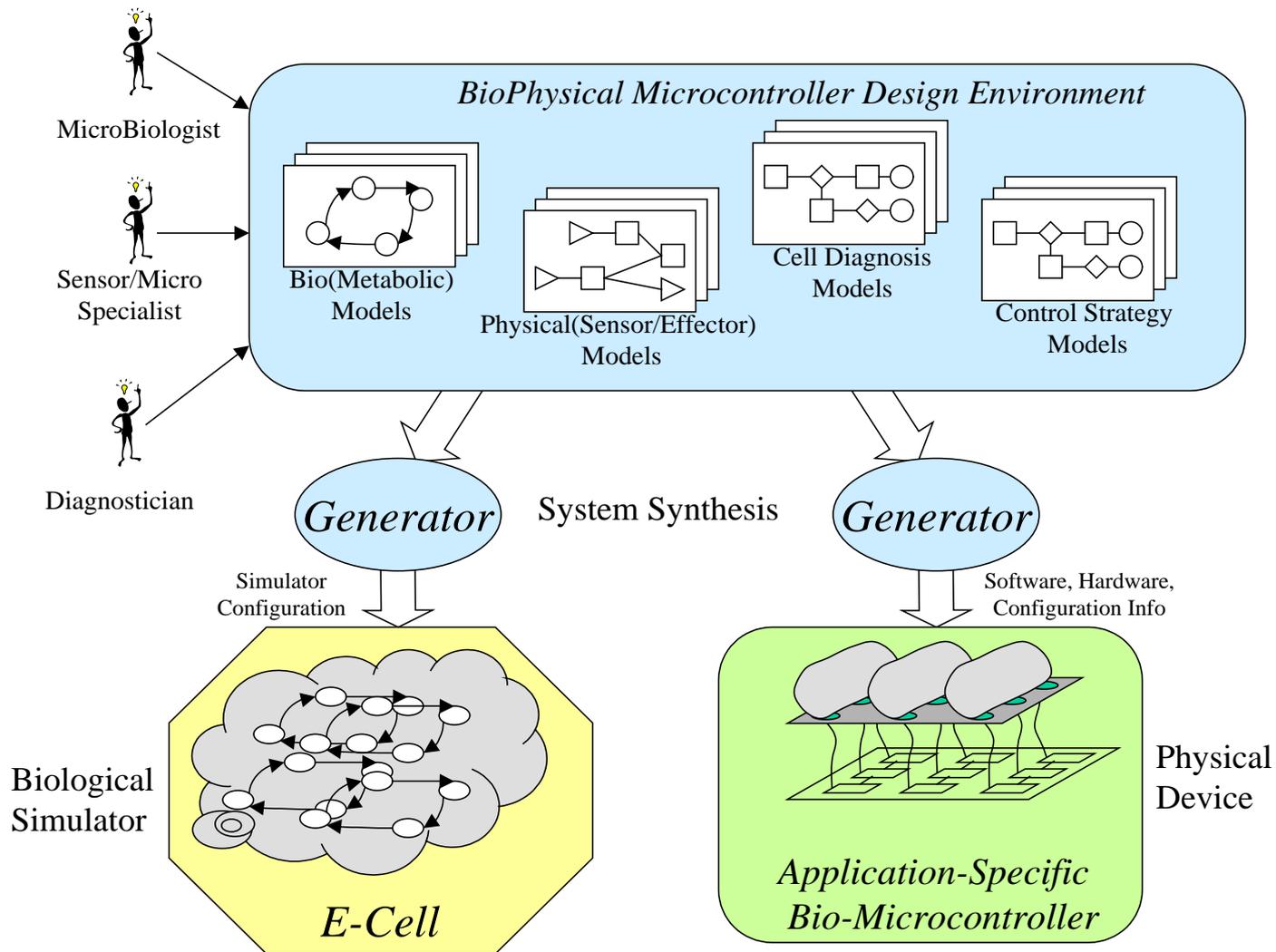


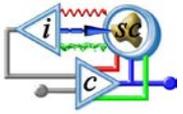
Topics

- The advantages of micro/nanoscale instruments
- Cellular complexity
- The need for closed-loop control
- How to identify early manifestations of disease
 - Modeling
 - Interactive, dynamical analysis
 - Mining dynamics data

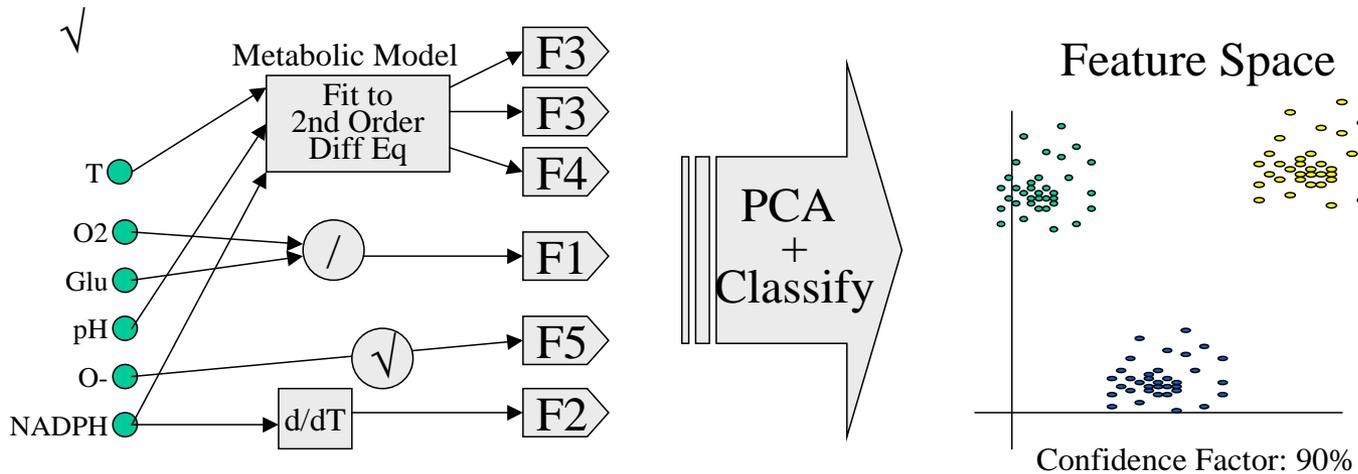
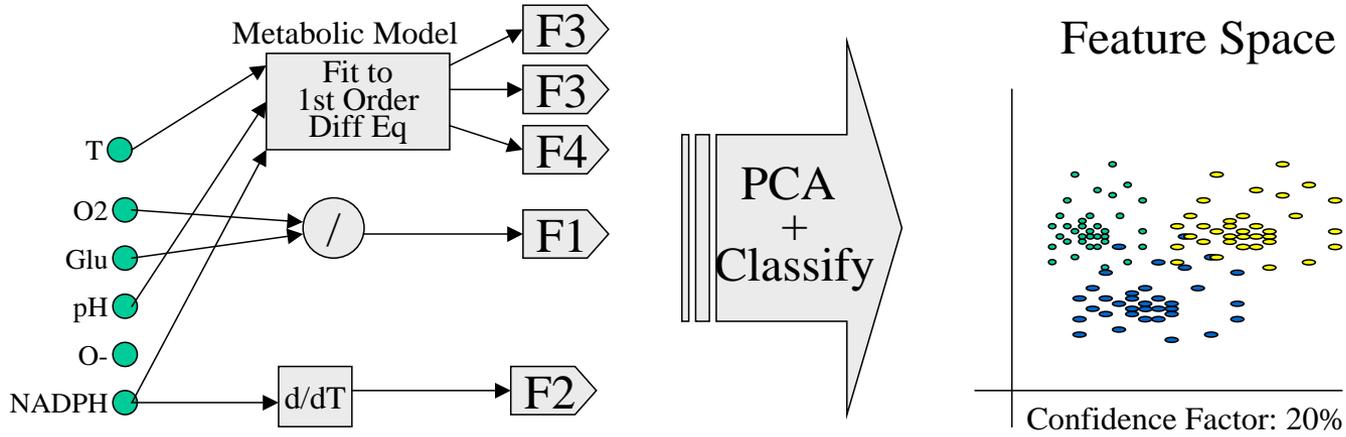


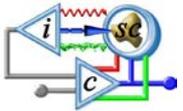
Biological Modeling and Analysis



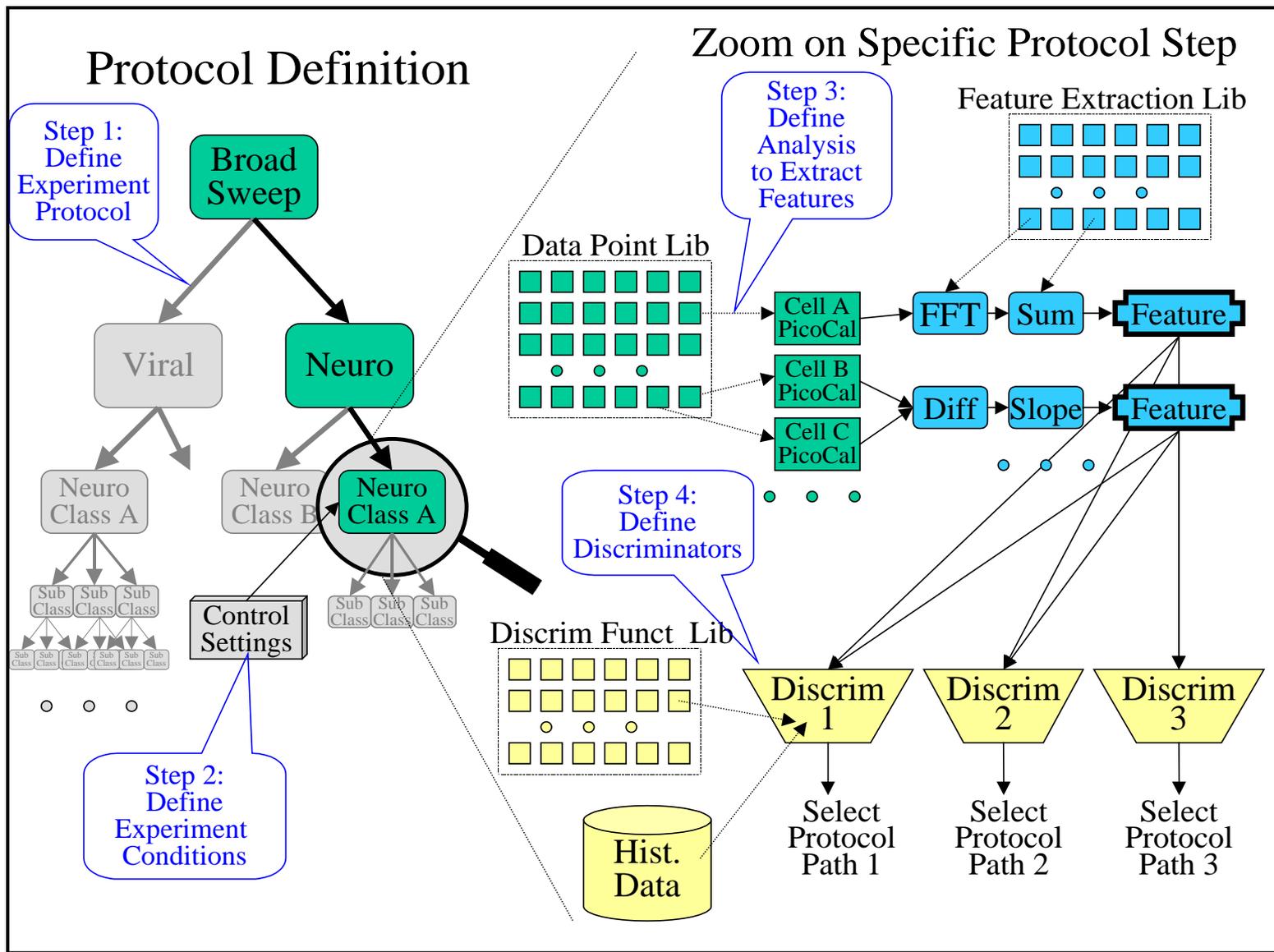


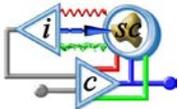
Signal Classification: Feature Extraction





Agent Discrimination Algorithms

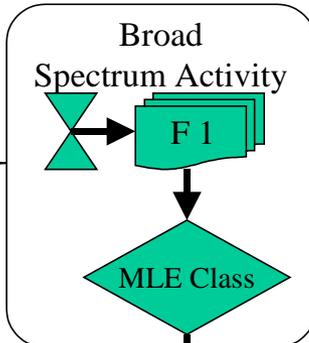




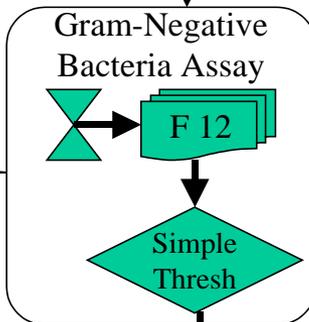
Data Mining/Exploration



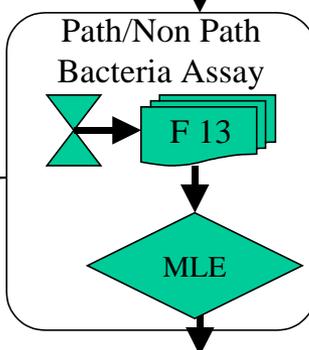
Cell Line: Macrophage +Liver
Sensors: Heat, Oxygen, Free Radical NADPH, Glukconeogenesis
Feat Extraction: Slope and AUC.
Expected: Both Cell Lines Activated NADPH Divergent Response
REF: TABLE xxx
Computed Robustness: 10%



Cell Line: Macrophage(-CD14)
Sensors: Heat, Oxygen, Free Radical NADPH
Feat Extraction: Slope and AUC.
Expected: Discrim on Activation
Robustness Factor: 40%



Cell Line: Intestinal Cell Line
Sensors: Heat, Oxygen, Free Radical NADPH
Feat Extraction: Slope and AUC
Expected: Discrim on Met Levels
Robustness Factor: 80%

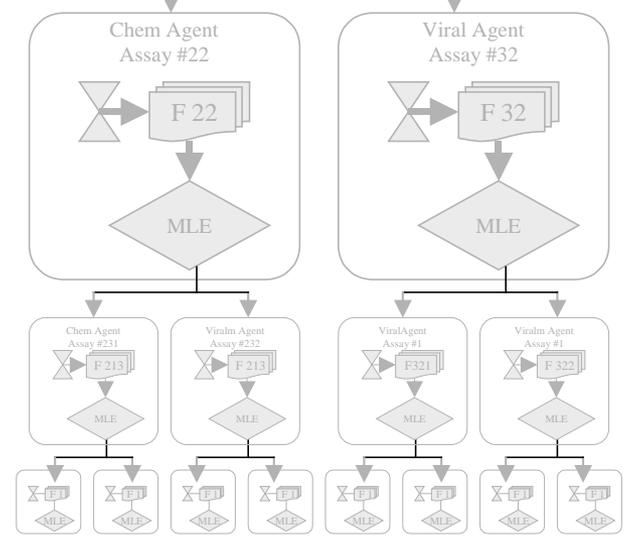


Legend

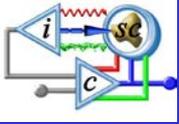
Action

Feature Set Extraction

Features



...



Conclusions

- Micro/Nano will “increase throughput and automation, reducing cost per analysis, and enabling entirely new applications.” *C. Dahl*
- Understanding cellular dynamics is key to understanding cellular physiology
- Micro/Nano will enable closed-loop control of certain cellular functions
- Biology and biochemistry can serve as preamplifiers for biological, biochemical, and biophysical detectors
 - PCR of course, but what else?
- Cell harvesting may be a problem for many tissues
 - Physiological biopsy
 - Pretransplant certification (pancreatic beta cells in islet transplants)
 - Well suited for probing drug interactions for particular phenotypes
- Dynamic model complexity is a major challenge
 - Specification
 - Verification