### Highlights of the NIH Common Fund National Centers for Biomedical Computing (NCBC)

July 16, 2012

#### Presented at ISMB2012 Long Beach, CA

#### Overview of the NIH Common Fund National Centers for Biomedical Computing (NCBC)

The National Centers for Biomedical Computing (NCBC) are intended to be part of the national infrastructure in Biomedical Informatics and Computational Biology. There are eight Centers (two now retired) that cover biophysical modeling, biomedical ontologies, information integration, tools for gene-phenotype and disease analysis, systems biology, image analysis, and health information modeling and analysis. The centers create innovative software programs and other tools that enable the biomedical community to integrate, analyze, model, simulate, and share data on human health and disease. Each Center has Cores that are focused on (i) biomedical computational science and (ii) driving biological projects (DBPs) whose intent is to foster interaction between computational and biomedical research that leads to innovation in both areas. There are numerous education and training activities sponsored by the Centers, ranging from webinars to tutorials to graduate internships. There is collaboration among the Centers, and also between the Centers and other large NIH program such as the CTSA centers. There is a special grant program for Collaborations with National Centers for Biomedical Computing. Under the collaboration grant program, 225 applications for funding have been reviewed at NIH and 33 have been awarded since its inception 8 years ago. The NCBCs have a federated approach to outreach and dissemination, Biositemaps provides access to unique software repositories and resources developed at the eight Centers. The NCBC Portal http://www.ncbcs.org/ provides a gateway to information about each Center and its products. The Centers work together in order to advertise and promote usage of their tools and resources. For example, a recent special session at the mainline Intelligent Systems in Molecular Biology (ISMB) meeting 2012 in Long Beach on July 16 focused on NCBC accomplishments; and a set of special articles in Journal of the American Medical Informatics Association (JAMIA) has been published.

**Three Themes covered by eight grants:** 

- <u>THEME A:</u> Systems Computational Science
- THEME B: Imaging
- <u>THEME C:</u> Biomedical Informatics

### THEME A: Computational biology and systems science under the NCBC program

#### Russ B Altman, MD, PhD Stanford University Simbios http://simbios.stanford.edu/

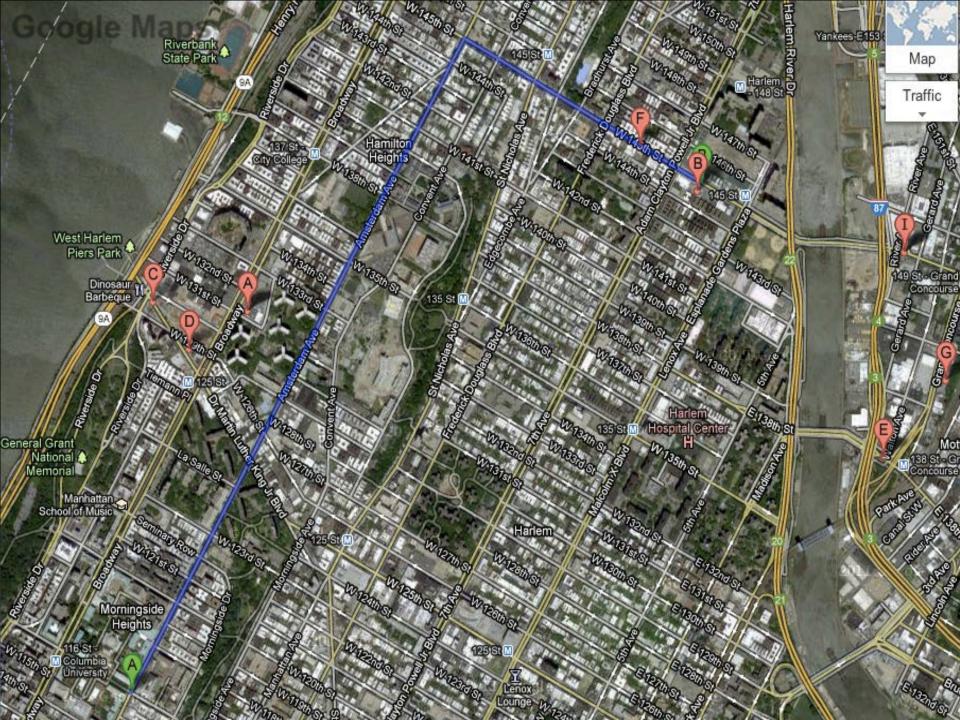
#### **Three NCBC Centers**

- MAGNet: Multiscale analysis of genomic and cellular networks (Columbia U.. Califano)
- NCIBI: National Center for Integrative Biomedical Informatics (U. Michigan, Athey)
- Simbios: National Center for Physics Based Simulation of Biological Structure (Stanford U., Altman, Delp, Pande)

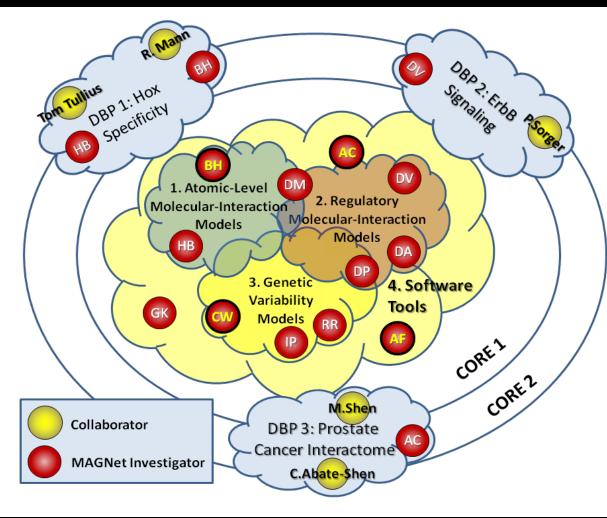
### A SYSTEMS AND STRUCTURAL BIOLOGY APPROACH TO THE DISSECTION OF COMPLEX BIOLOGICAL PHENOTYPES



MAGNET MULTISCALE ANALYSIS OF GENOMIC AND CELLULAR NETWORKS NCBC and ICBP/CCSB Center admap nal Centers for Biomedical Computing



## The strategy of MAGNet



#### Leadership:

Andrea Califano (PI) Barry Honig (co-PI) Aris Floratos (Exec Dir)

#### Investigators:

Dimitris Anastassiou Harmen Bussemaker Gail Kaiser Diana Murray Dana Pe'er Itsik Pe'er Raul Rabadan Dennis Vitkup Chris Wiggins

#### **Driving Biological Projects**

Cory Abate-Shen Michael Shen Richard Mann Peter Sorger Tom Tullius

MAGNet Center Mission: the development of novel Structural and Systems Biology methods and tools for the *dissection of molecular-interactions in the cell* and for the *interaction-based elucidation of cellular phenotypes* 

## **Core I: Theoretical and Computational Studies**

## Project 1: Atomic-level Molecular-Interaction Models

- B.Honig, H.Bussemaker, D.Murray
- structural and biophysical properties of proteins and DNA and for their integration into Systems Biology.
- Project 2: Regulatory Molecular-Interaction Models
  - A.Califano, D.Anastassiou, D.Pe'er, D.Vitkup.
  - The multiscale complexity of intra- and inter-cellular regulatory studied by integrating layers of regulation traditionally studied in isolation.

## **Core I: Theoretical and Computational Studies**

## Project 3: Genetic Variability Models

- C.Wiggins, D.Pe'er, I.Pe'er, R.Rabadan
- Tools for the genotypic data analysis,

### Project 4: Software tools

- A.Floratos, A.Califano, G.Kaiser
- Algorithms developed in Projects 1 3 will be integrated and disseminated as *geWorkbench* platform components.

## **Driving Biological Projects**

#### DBP 1: Role of DNA shape in protein DNA binding specificity

- T.Tullius, R.Mann, H.Bussemaker, B.Honig
- Determine the sequence and structural basis of Hox protein specificity.

### DBP 2: Probabilistic dynamical models of ErbB signaling pathways

- **P. Sorger** and D. Vitkup.
- Predictions of network-mediated effects of oncogenic mutations and small-molecule perturbations

#### DBP 3: Master regulators of tumorigenesis and drugsensitivity in prostate cancers,

- C.Abate-Shen, M.Shen, A.Califano
- Human prostate cancer xenografts in the mouse to reconstruct *in vivo* regulatory networks and elucidate the mechanisms driving tumorigenesis and drug sensitivity.

### Accomplishments: Science, Infrastructure, Education

#### Publications:

- 61 MAGNet publications (last 2Y)
  - >50% in high impact factor journals (18/28 in the last year)

#### **Collaborative Projects:**

- 10 Driving Biological Projects
- >60 collaborative projects
   >1/3 funded

#### Infrastructure

- 4,500 CPU supercomputer, ~1 petabyte storage system
- Scored 23 on a \$2M equipment grant to upgrade our supercomputer

#### Education and Dissemination

- Conference organization:
  - 2012 AACR Special Conference on Chemical Systems Biology
  - 2012 RECOMB Regulatory and Systems Biology Conference with DREAM Challenges
  - NYAS Sys. Bio. Interest Group

#### Students and Postdoctoral training

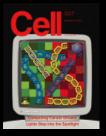
- Over 100 students and postdocs in MAGNet funded labs
- Developed over 20 CompBio courses
- Training Grant (NIGMS)
- Stats from student retention: 6/8 of our top choices decided to come to Columbia

# **Scientific Productivity**



Cofactor Binding Evokes Latent Differences in DNA Binding Specificity between Hox Proteins. Slattery M, Riley T, Liu P, Abe N, Gomez-Alcala P, Dror I, Zhou T, Rohs R, Honig B, Bussemaker HJ, Mann RS. Cell. 2011 Dec 9;147(6)

An Extensive MicroRNA-Mediated Network of RNA-RNA Interactions Regulates Established Oncogenic Pathways in Glioblastoma Sumazin P, Yang X, Chiu HS, Chung WJ, Iyer A, Llobet-Navas D, Rajbhandari P, Bansal M, Guarnieri P, Silva J, Califano A Cell. 2011 Oct 14;147(2):370-81.



An integrated approach to uncover drivers of cancer. Akavia UD, Litvin O, Kim J, Sanchez-Garcia F, Kotliar D, Causton HC, Pochanard P, Mozes E, Garraway LA, Pe'er D. Cell. 2010 Dec 10;143(6):1005-17. Epub 2010 Dec 2.

*The transcriptional network for mesenchymal transformation of brain tumours.* Carro MS, Lim WK, Alvarez MJ, Bollo RJ, Zhao X, Snyder EY, Sulman EP, Anne SL, Doetsch F, Colman H, Lasorella A, Aldape K, Califano A, Iavarone A. Nature. 2010 Jan 21;463(7279):318-25. Epub 2009 Dec 23.



The role of DNA shape in protein-DNA recognition. Rohs R, West SM, Sosinsky A, Liu P, Mann RS, Honig B. Nature. 2009 Oct 29;461(7268):1248 53.

Geographic dependence, surveillance, and origins of the 2009 influenza A (H1N1) virus. Trifonov V, Khiabanian H, Rabadan R. N Engl J Med. 2009 Jul 9;361(2):115-9.







# High Impact Publications (2011 - 2012)

- Chen, Y. ... II, B. Honig, H. Lu and W. Cho (2012). "Genome-wide Functional Annotation of Dual-Specificity Protein- and Lipid-Binding Modules that Regulate Protein Interactions." *Molecular Cell*.
- Dapito, ..., R. Rabadan and R. F. Schwabe (2012). "Promotion of Hepatocellular Carcinoma by the Intestinal Microbiota and TLR4." *Cancer Cell* 21(4): 504-516.
- Fabbri, ... R. Rabadan, R. Dalla-Favera and G. Gaidano (2011). "Analysis of the chronic lymphocytic leukemia coding genome: role of NOTCH1 mutational activation." *The Journal of Experimental Medicine* 208(7): 1389-1401.
- Fischer, M., ..., B. Honig and D. Petrey (2011). "MarkUs: a server to navigate sequence-structure-function space." *Nucleic Acids Res* 39(Web Server issue): W357-361.
- Greenbaum, ... R. Rabadan (2012). "Viral reassortment as an information exchange between viral segments." *PNAS* 109(9): 3341-3346.
- Grossmann, ... R. Rabadan, T. Haferlach and B. Falini (2011). "Whole-exome sequencing identifies somatic mutations of BCOR in acute myeloid leukemia with normal karyotype." *Blood* 118(23): 6153-6163.
- Kreimer, A.... D. Pe'er and I. Pe'er (2012). "Inference of modules associated to eQTLs." Nucleic Acids Res.
- Martinez, M. R., ... A. Califano and G. A. Stolovitzky (2012). "Quantitative modeling of the terminal differentiation of B cells and mechanisms of lymphomagenesis." *PNAS* 109(7): 2672-2677.
- Ntziachristos, ... R. Rabadan, et al. (2012). "Genetic inactivation of the polycomb repressive complex 2 in T cell acute lymphoblastic leukemia." *Nature Medicine* 18(2): 298-301.

# High Impact Publications (2011 - 2012)

- Pasqualucci, L., ... R. Rabadan and R. Dalla-Favera (2011). "Analysis of the coding genome of diffuse large B-cell lymphoma." *Nature Genetics* 43(9): 830-837.
- Rossi, D., ... R. Rabadan, et al. (2011). "Mutations of the SF3B1 splicing factor in chronic lymphocytic leukemia: association with progression and fludarabine-refractoriness." *Blood* 118(26): 6904-6908.
- Rossi, D., ... R. Rabadan, et al. (2012). "Mutations of NOTCH1 are an independent predictor of survival in chronic lymphocytic leukemia." *Blood* 119(2): 521-529.
- Slattery, B. Honig, H. J. Bussemaker and R. S. Mann (2011). "Cofactor binding evokes latent differences in DNA binding specificity between Hox proteins." *Cell* 147(6): 1270-1282.
- Sumazin, ... and A. Califano (2011). "An extensive microRNA-mediated network of RNA-RNA interactions regulates established oncogenic pathways in glioblastoma." *Cell* 147(2): 370-381.
- Tiacci, ... R. Rabadan and B. Falini (2011). "BRAF mutations in hairy-cell leukemia." *The New England Journal of Medicine* 364(24): 2305-2315..
- Zhang, ..., B. Honig and D. Petrey (2011). "PredUs: a web server for predicting protein interfaces using structural neighbors." *Nucleic Acids Res* 39(Web Server issue): W283-287.
- Della Gatta, ... A. Califano and A. A. Ferrando (2012). "Reverse engineering of TLX oncogenic transcriptional networks identifies RUNX1 as tumor suppressor in T-ALL." *Nat Med* 18(3): 436-440.
- Pasqualucci, ... R. Rabadan and R. Dalla-Favera (2011). "Analysis of the coding genome of diffuse large B-cell lymphoma." *Nature Genetics* 43(9): 830-837.

## **MAGNet derived activities and links**

#### New Department of Systems Biology at Columbia University

- 5 New Recruitments in the last year (27 faculty)
  - Saeed Tavazoie, Ph.D (Princeton)
     Peter Simms, Ph.D (Harvard)
  - Sagi Shapira, Ph.D (Broad)
     Yufeng Shen, Ph.D (Columbia)
  - Chaolin Zhang, Ph.D (Rockefeller)
- Integration of HT Biology (NextGen Sequencing + HT Screening) and Computational Biology

#### 8 Centers of Excellence + Several multiPl grants

- National Center for Biomedical Computing (also ICSB/CCSB)
- PSI Initiative (Bioinformatics Core)
- Cancer Target Discovery and Development (CTD<sup>2</sup>)
- LINCS Technology Center
- LINCS Computational Center
- In Silico Research Center of Excellence (temporarily terminated)
- Serious Adverse Events Consortium, Data Analysis and Coordination Center
- caBIG MAT Knowledge Center (discontinued)

# **Software Dissemination**

#### Individual Tools

Highly accessed tools for:

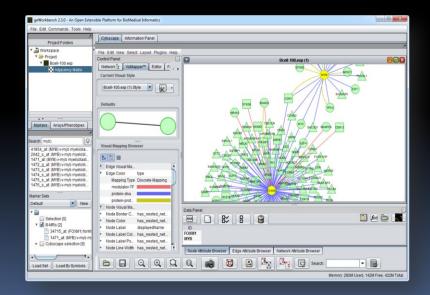
Reverse Engineering of Regulatory Networks: ARACNe, MINDy, MatrixReduce, Medusa, PREPPI, Target Explorer, etc.

Protein Structure Analysis: Pudge, Delphi, Grasp, PrISM, etc.

Identification of causal drivers: MARINa, Connexic, Genatomy,

#### Integrative Analysis Platform

- GeWorkbench
  - >5,000 downloads
  - > 500 regular users
  - Built-in Social Science Network
  - Large number of functional modules
  - Access to most of the software
  - produced by MAGNet investigators New version (2012): Web-based user interface



## NCIBI: Recent Accomplishments, Growing Community Engagement and Evolving Directions

## Brian D. Athey, PI Jim Cavalcoli, Project Manager Kevin Smith, tranSMART Acting Exec. Dir.

portal.ncibi.org/gateway & tranSMARTproject.org

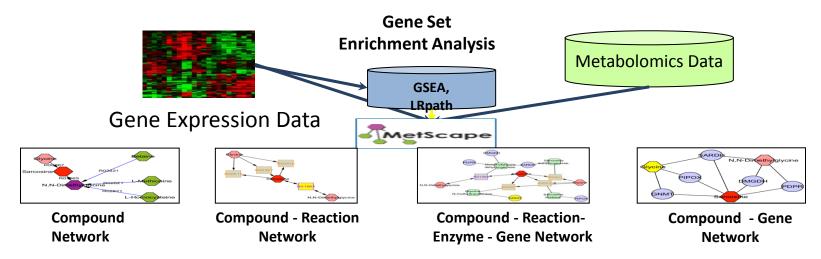




The National Center for Integrative Biomedical Informatics (NCIBI) mission is to enhance and accelerate basic, clinical and translational research by providing services to integrate and analyze molecular and phenotypic information

#### **Recent Refinement of NCIBI Metabolomics DBP tools & publications**

- Continued effort with MiMI interactions information resources; NICIBi Cytoscape plugins; MetScape 2 and Metab2Mesh Metabolomoics tools
  - Key information and analytics platform elements of "Michigan Comprehensive Regional Metabolomics Resource Core": NIDDK NIH Metabolomics U24 Resource (expected to be launched Sept., 2012)



• Karnovsky A et al, Metscape 2 Bioinformatics Tool for the Analysis and Visualization of Metabolomics and Gene Expression Data Bioinformatics 2012; 28(3): 373-80. PMID 22135418 Sartor MA,, et al, Metab2MeSH: Annotating Compounds with Medical Subject Headings (MeSH) Bioinformatics 2012; 28(10): 1408-10. PMID 22492643

## **NCIBI** services and outreach and training continue

#### Broad use of web services for data and analytic services (ncibi.ws

- Data Services
  - Natural Language Processing Pipeline for PubMed and PMCOA
  - Gene2MeSH
  - Metab2MeSH
  - Michigan Molecular Interactions Database (MiMI) Protein-Protein Interactions
  - Metabolomics reference data resources from NIH Regional Metabolomics Core (Launching Oct., 2012)
- Computational Analysis Services
  - Natural Language Processing
    - Sentence Segmentation
    - Phrase Structure Parsing
  - Gene Set Enrichment Analysis
    - LRPath
    - ThinkBACK

#### **Outreach activites are growing in frequency and potential impact**

- MetScape tutorial (video)
  - <u>http://treehouse.ccmb.med.umich.edu/mst.html</u>
- International Society of Nephrology Forefronts Symposium on Systems Biology and the Kidney
  - Hands-on tutorial session covering NCIBI tools (June, 2012)
- AACR Frontiers in Basic Cancer Research, San Francisco, California September 14-18, 2011
  - "Lrpath analysis reveals common pathways dysregulated via DNA methylation across cancer types" - Maureen Sartor: NICIB faculty leader
- Poster presentations at GLBIO, May 15, 2012
  - NodeFilter: A Cytoscape Plugin for Efficient Network Exploration



13<sup>th</sup> RCMI International Symposium on Health Disparities scheduled for December 2012 in San Juan, Puerto Rico( Workshop on NCIBI Tools)



## NCIBI is transitioning as the organizing leader of the tranSMART Public Private Partnership

- tranSMART is an emerging global open-source public private partnership community developing a comprehensive informatics-based analysis and data-sharing cloud platform for clinical/translational research
- TranSMART Includes pharmaceutical and other companies, not-for-profits, academics, patient advocacy groups, and government stakeholders
- tranSMART Community members collaboratively build, share, and use the tranSMART platform to break down social/technical barriers and capture scientific/collaborative opportunities using crowd sourcing
- NCBCs and tranSMART: tranSMART has i2b2 and functionalities embedded into its code base now. NCIBI to follow October 1, 2012. i2b2 SMART January 1, 2012 release. Preliminary discussions with NCBO.
- NCIBI Core team intact and growing. See tranSMART Project.org







Simbios: National Center for Physics-based <u>Sim</u>ulation <u>of</u> <u>Bio</u>logical <u>Structure</u>

> Russ Altman Scott Delp Vijay Pande Stanford University

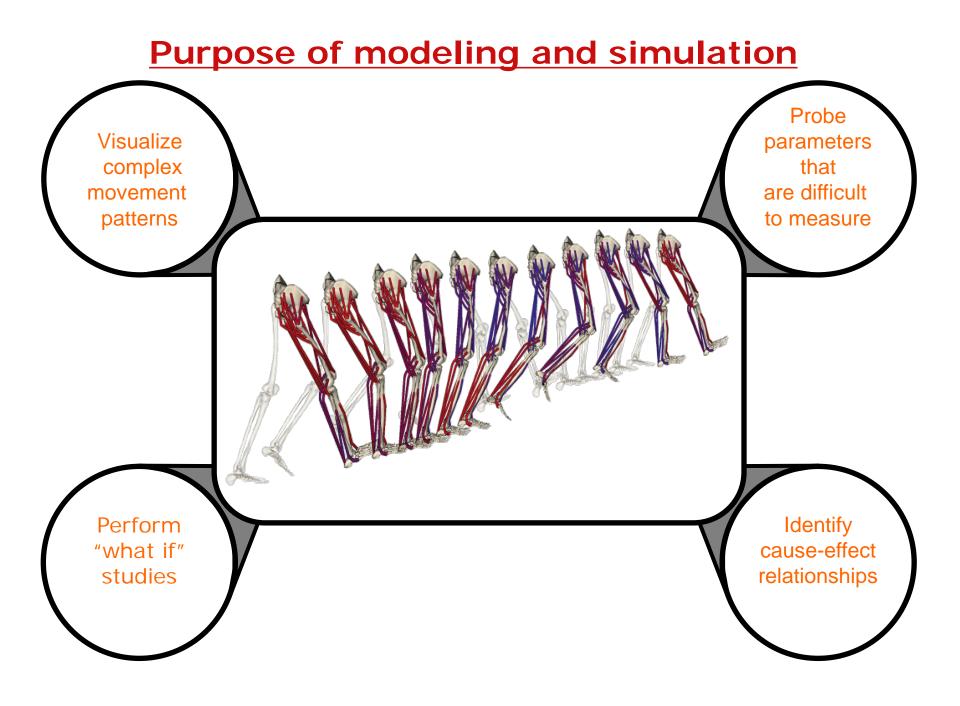
Two key scientific foci

- Biomechanical simulation & model sharing (OpenSIM toolkit)
- Molecular dynamics simulation (OpenMM)

OpenSim: a biologically accurate simulator to evaluate and design Warrior Web technologies

#### Scott Delp

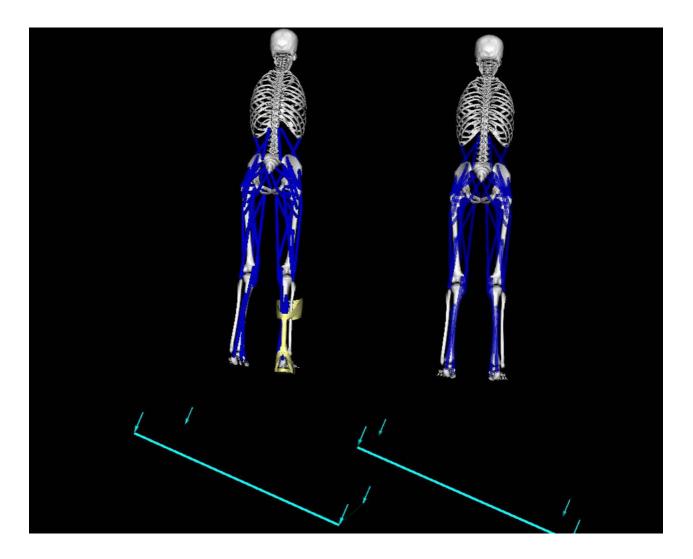
Departments of Bioengineering, Mechanical Engineering, Orthopaedic Surgery, Stanford University



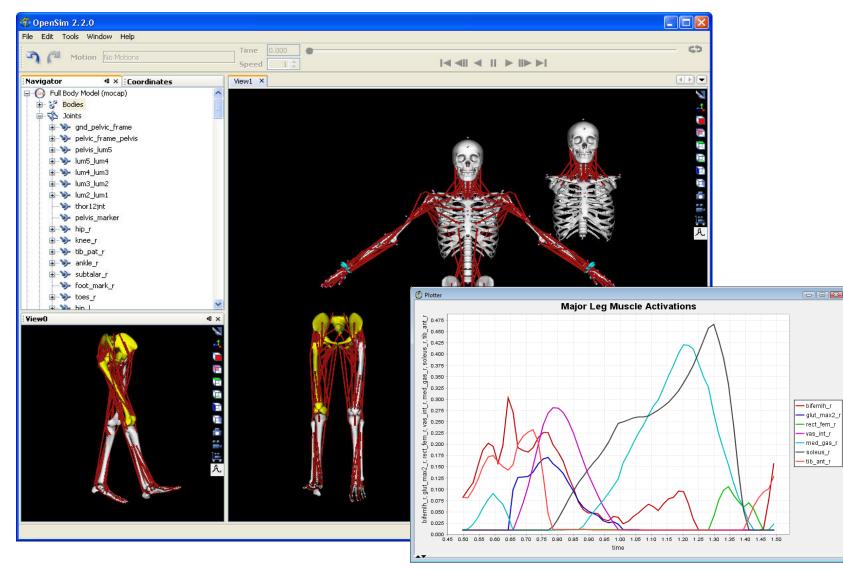
### Visualize human running in detail



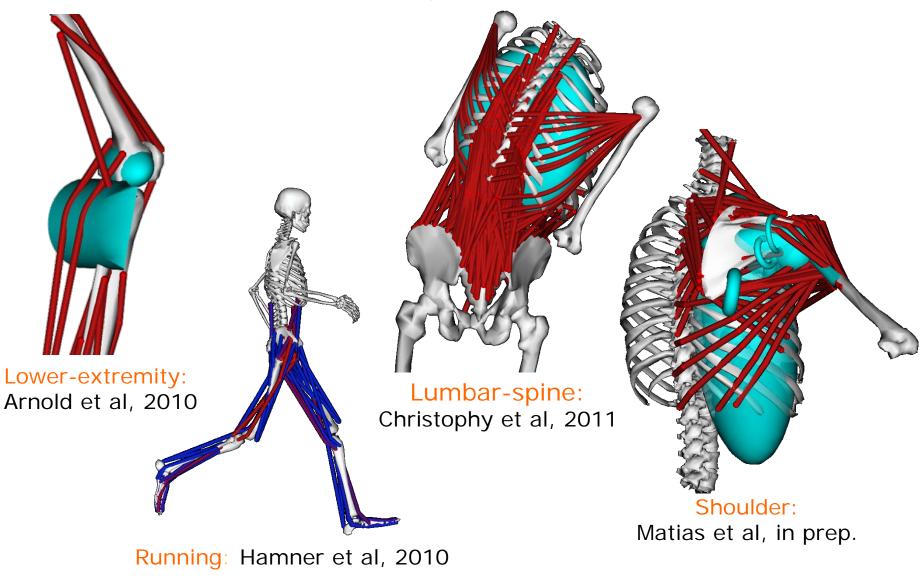
### Examine causes ankle injury



### **OpenSim is an application**



#### **OpenSim is a repository of models, data, & tools**



#### **OpenSim is a repository of models, data, & tools**



13,000 users of these tools; 70 projects with downloads

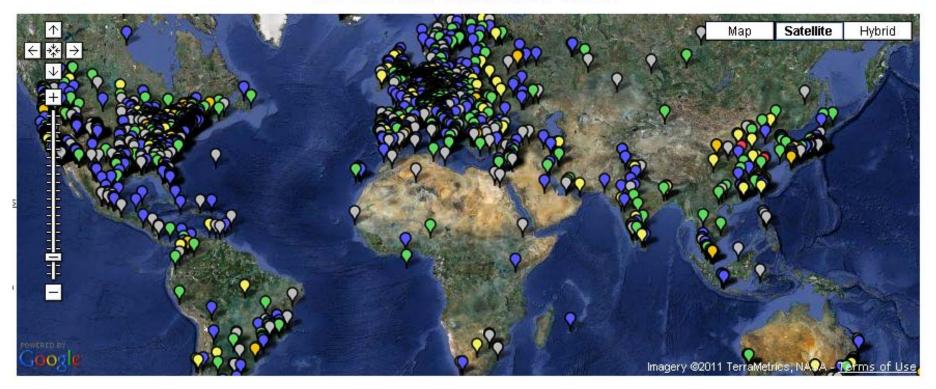
#### **OpenSim is a resource**

### http://opensim.stanford.edu

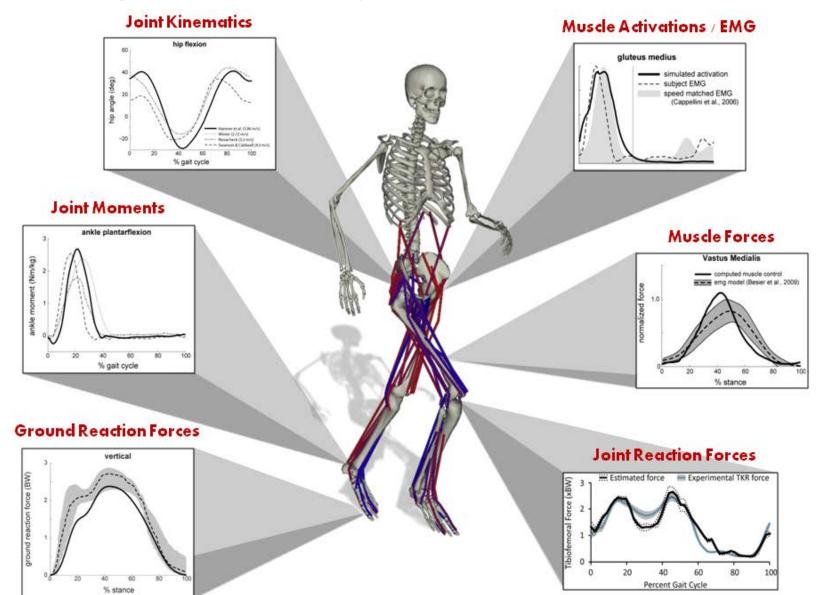


#### **OpenSim is a worldwide community**

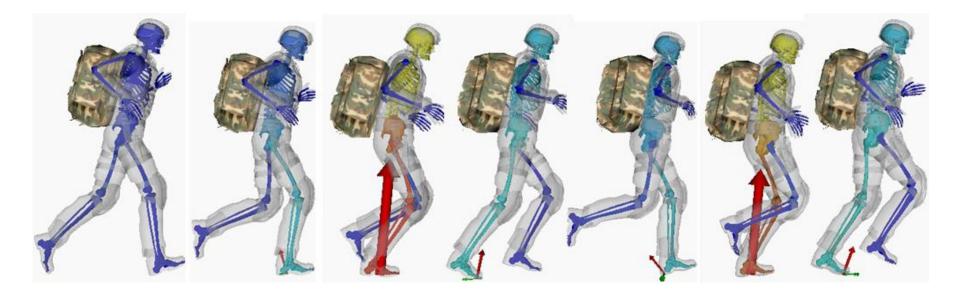
86702 Page Hits in the past 180 Days (9742 Unique Visitors) 2345 Stanford Page Hits (81 Unique Visitors)



#### **Testing the Accuracy of Simulations**

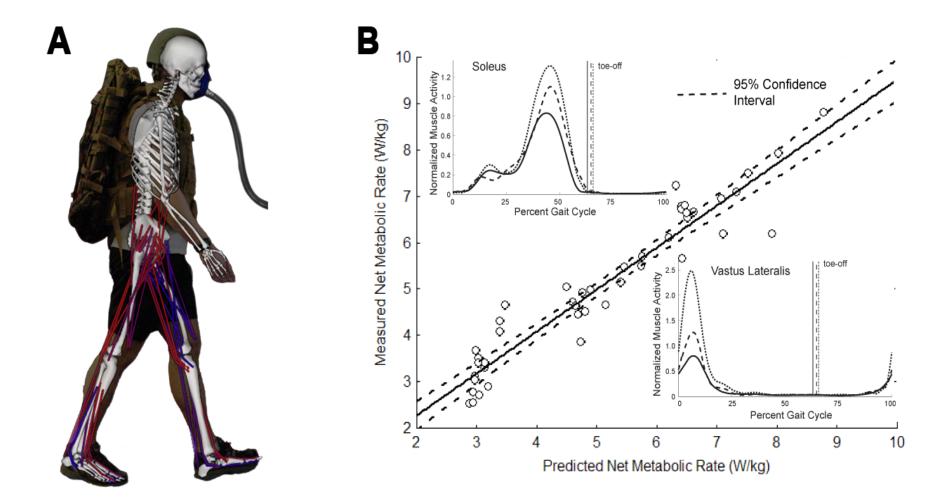


#### **Motion Synthesis**

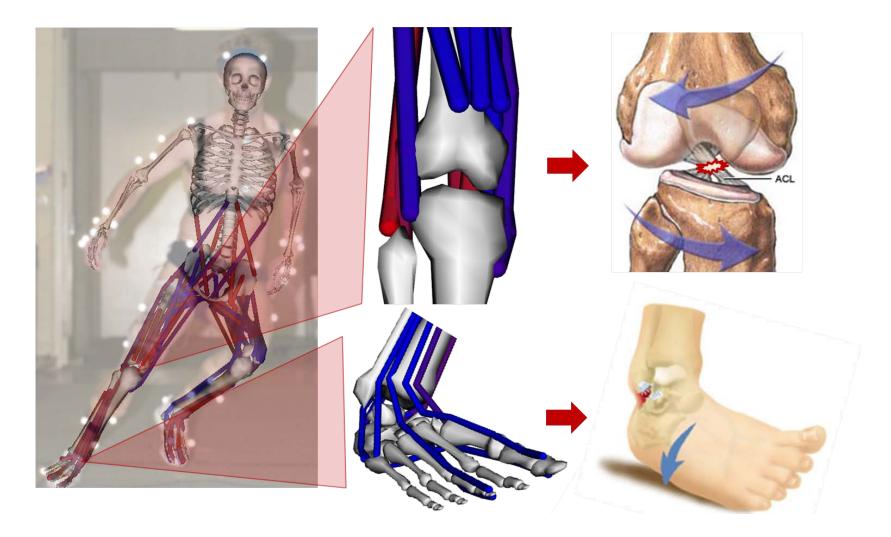


Wang, JM, Hamner, SR, Delp, SL, Koltun, V. Optimizing locomotion controllers using biologically-based actuators and objectives. *SIGGRAPH 2012* 

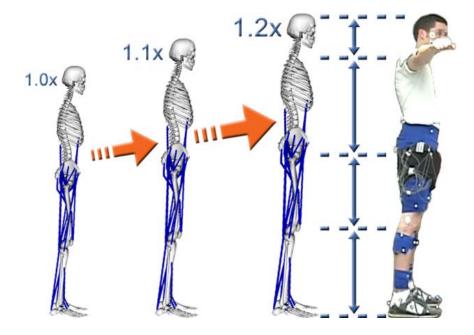
#### **Metabolics Assessment**

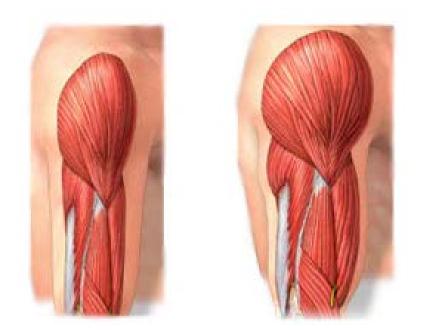


### **Injury Risk Assessment**



#### **Soldier-Specific Scaling**





#### Support, Training, and Collaboration to Prove Your Technology





## Load OpenSim on your laptop for tomorrow's hands-on workshop

#### **Training the next generation**



#### **OpenSim is a team of contributors:**







Ayman Habib



**Jennifer Hicks** 



**Jeff Reinbolt** 





Ajay Seth **Michael Sherman** 



**Edith Arnold** 



Matt DeMers

Sam Hamner



**Chand John** 





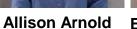




Peter Eastman **Melanie Fox** 



**Clay Anderson** 



Eran Guendelman

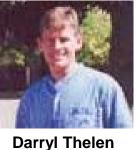


May Liu



Kat Steele

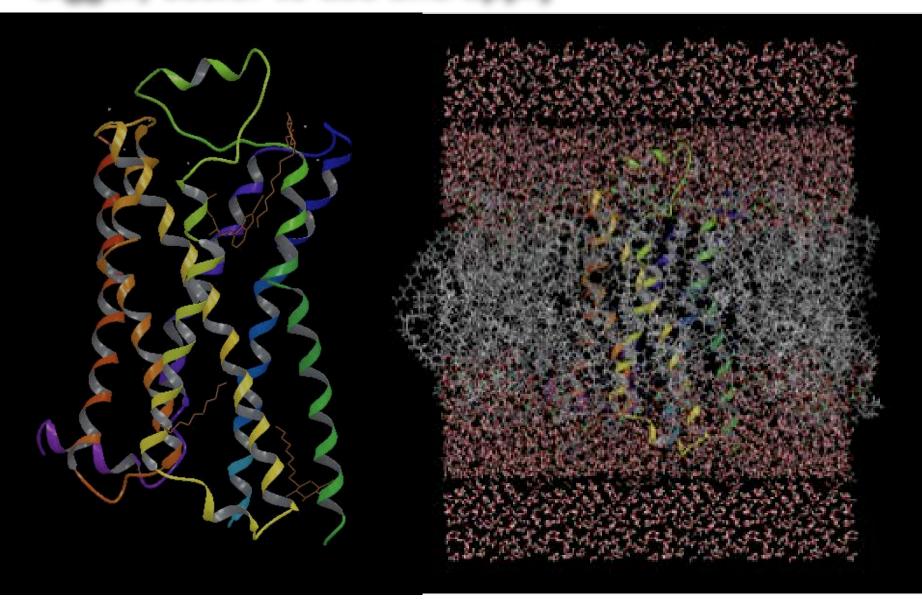
Peter Loan





**WW Teams** 

## Molecular Dynamics Simulations: faster, bigger, easier to use and apply



#### Our solution to the long-timescale simulation challenge

Combine multiple, powerful, complementary technologies

Folding@home:
 very large-scale
 distributed computing



Most powerful computer cluster in the world (~8 petaflops)

## $10^4 x$ to $10^5 x$

http://folding.stanford.edu

Voelz, *et al*, *JACS* (2010) Ensign *et al*, *JMB* (2007) Shirts and Pande, *Science* (2000) **2) OpenMM:** Very fast MD (~1µs/day) on GPUs



~1µs/day for implicit solvent simulaton of small proteins (~40aa)

~10<sup>2</sup>x

3) Markov State Models(MSMs): Stat mech ofmany trajectories



very long timescale dynamics by combining many simulations

 $10^{2}$ x to  $10^{3}$ x

http://simtk.org/home/msmbuilder

Bowman, et al, J. Chem. Phys. (2009) Singhal & Pande, J. Chem.<sub>42</sub> Phys. (2005)

#### Our solution to the long-timescale simulation challenge

*Combine multiple, powerful, complementary technologies* 

1) Folding@home: very large-scale distributed computing



Most powerful computer cluster in the world (~8 petaflops)

### $10^4 x$ to $10^5 x$

http://folding.stanford.edu

Voelz, et al, JACS (2010) Ensign et al, JMB (2007) Shirts and Pande, Science (2000) 2) OpenMM: Very fast MD (~1µs/day) on GPUs



~1µs/day for implicit solvent simulaton of small proteins (~40aa)

~10<sup>2</sup>x

#### http://simtk.org/home/openmm

Elsen, et al. ACM/IEEE conf. on Supercomputing (2006) Friedrichs, et al. J. Comp. Chem., (2009) Eastman and Pande. J. Comp. Chem. (2009) 3) Markov State Models(MSMs): Stat mech of many trajectories



very long timescale dynamics by combining many simulations

 $10^{2}$ x to  $10^{3}$ x

## OpenMM: http://simtk.org/home/openmm

#### •What is OpenMM?

- API, library, and application for core molecular dynamics
- open source (LGPL) software

#### •Key features

- Very rapid execution (GPUs, multi-core CPUs)
- rapid development: clean API, python bindings, custom force classes
- support of modern hardware
- broad support for forcefields with full acceleration:
  - additive: AMBER, CHARMM, OPLS, ROSETTA
  - polarizable/more accurate: AMOEBA, RPMD
  - implicit solvent: GB/SA variants, EEF1, ABSINTH

#### OpenMM enabled applications

• GROMACS, Folding@home, Protomol, AMBER (file formats), CHARMM (C. Brooks)



#### http://simtk.org/home/openmm OpenMM: Fast execution and rapid development

#### • Interface to Python: towards a Domain Specific Language (DSL)

- 10 lines of code to a customizable, high performance MD code
- tweak to your hearts content, but keep high performance aspects

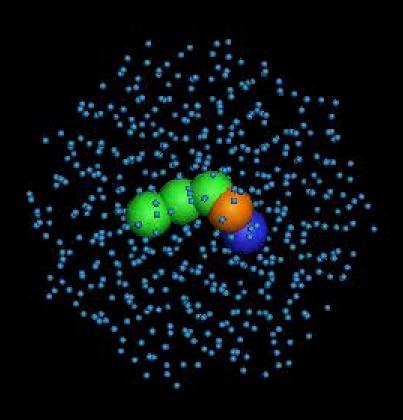
#### Custom Force classes

- code in equations, rather than CUDA or OpenCL, but keeping high performance
- Custom classes for implicit solvent, bonded, non-bonded, integrators
- looking to generalize further based on interest from the community

force = CustomBondForce("D\*(1-exp(a\*(r0-r)))^2")

#### **Application to biomolecular assembly**





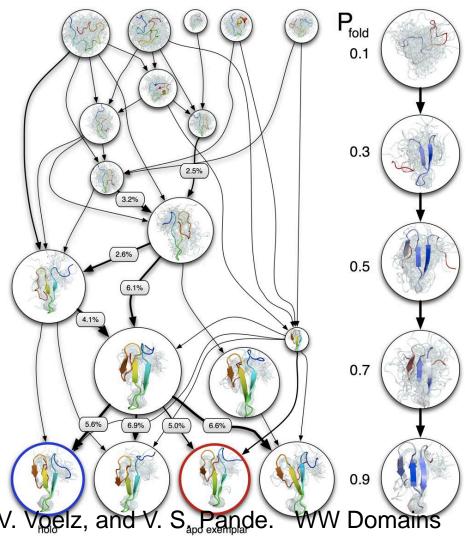
#### Grand Canonical construction of a micelle

Movie made with VMD

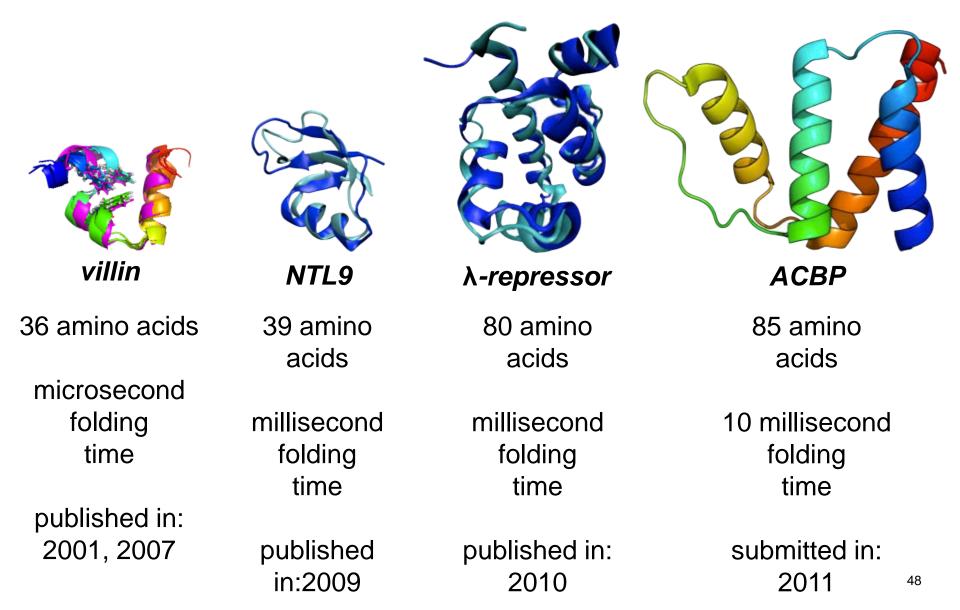
**MSMs yield novel insight:** *Nature of folding pathways* 

- Simply having long trajectories does not solve the challenge of analysis
  - how to gain insight from trajectories?
- MSM finds heterogeneous pathways, not a single path
  - simple analyses of long trajectory data did not find
  - original method assumed single pathway
  - MSMs don't make these assumptions (eg WW simulations from Noé et al, PNAS 2009)

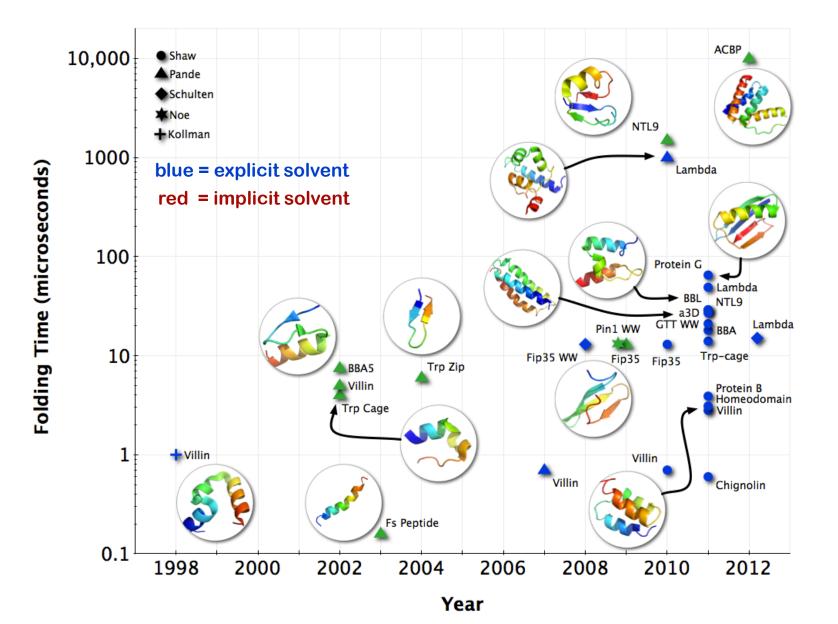
T. J. Lane, G. Bowman, K. Beauchamp, V. Voelz, and V. S. Pande. WW Domains Take a New Turn: Markov State Model Reveals Folding and Functional Dynamics in Ultra-Long MD Trajectories. *JACS* (2011)



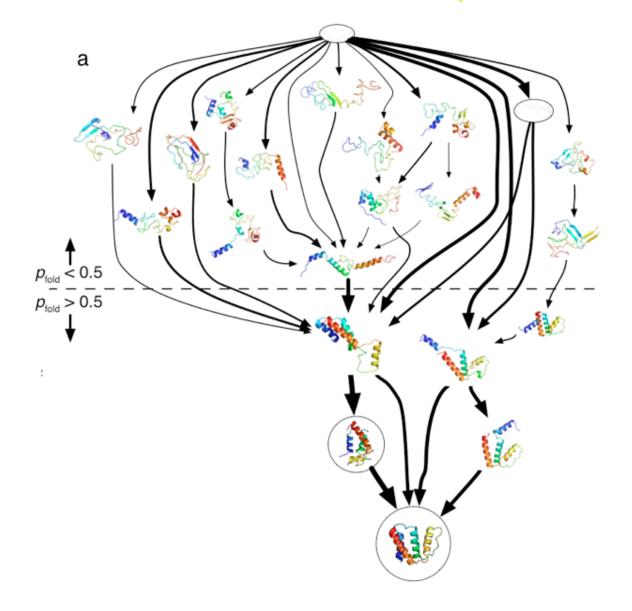
#### **General Result #1: This approach is broadly applicable** *Summary of our key protein folding simulation successes*



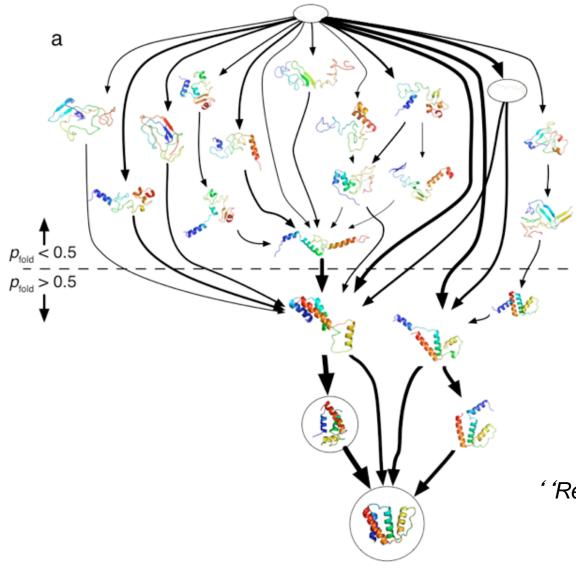
#### What has the simulation community done so far?



#### **General result #2: Kinetics looks like transitions between many metastable states:** *ACBP example below*



#### **General result #3: Consequences of projections** How can one reconcile this with the simple picture?







'Regarded from two sides'' by Diet Wiegman (1984) Kruschela & Zagrovic. DOI:10.1039/b917186j

#### (Lawrenz, VSP)

movie made with VMD

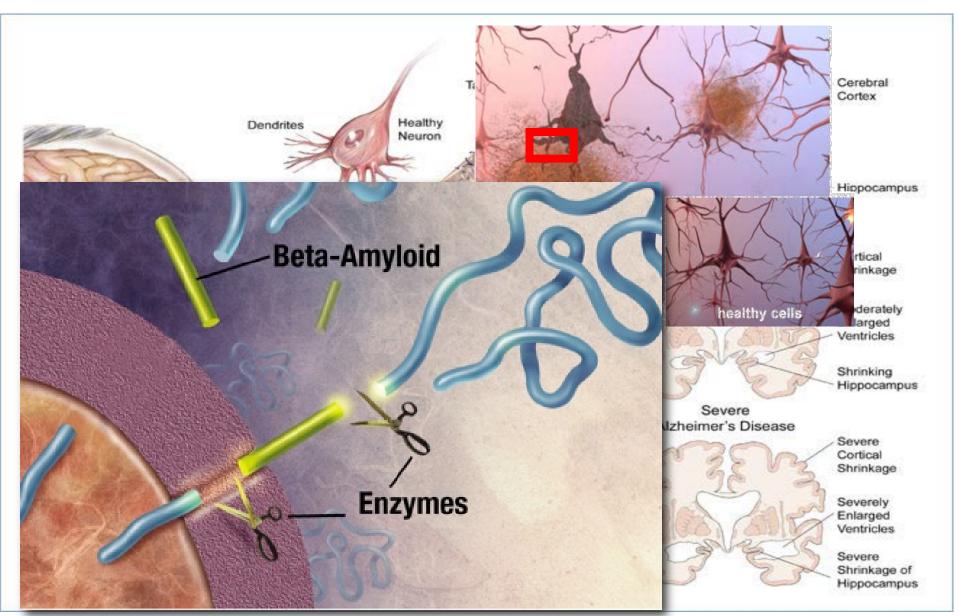
#### 20µs MSM trajectory shows L6 binding

surface view

Movie made with VMD

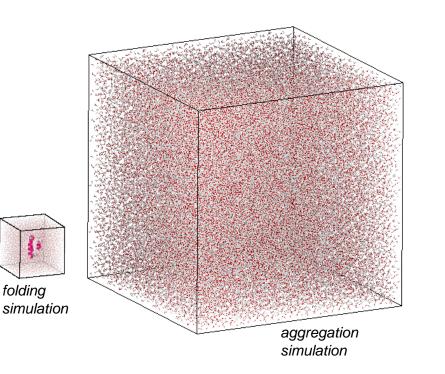
flexible loop ensnares ligand ribbon + surface view

#### Application of MSMs to misfolding: Simulation of misfolding in Alzheimer's Disease

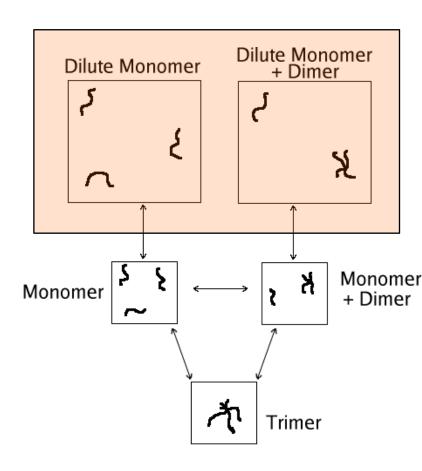


#### **Extensions to MSMs for oligomerization**

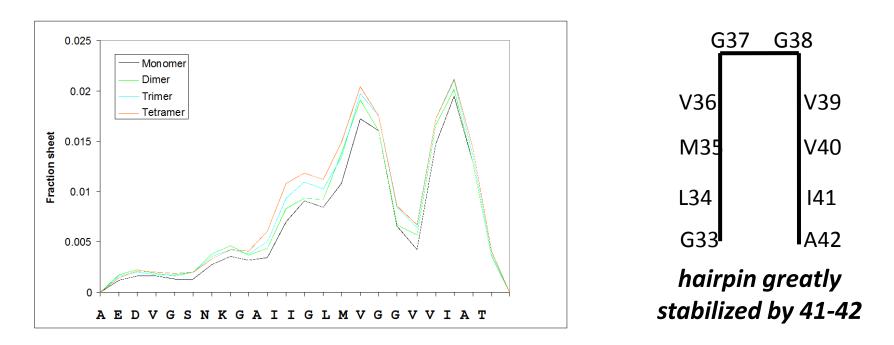
Large system size needed in aggregation simulation: Folding simulation compared to aggregation simulation



Adding low concentration states allows for a direct comparison to experiment



## We find a ß-hairpin structure

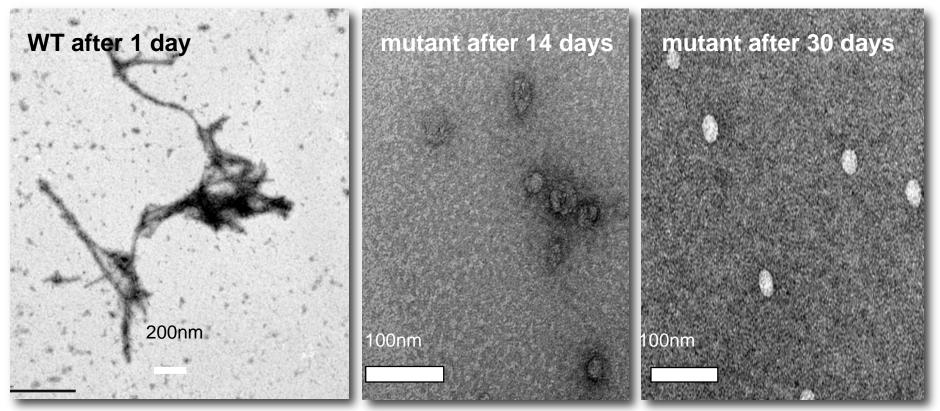


- We find a hairpin centered around residues 37-38
- let's stabilize the hairpin to force the structure we see
- G37D-pro mutant to fix hairpin structure
- yields a theory to explain why 1-42 is different from 1-40

V. Vishal, N. W. Kelley, R. Jaykumar, C. Liu, T. Pray, G. Krafft, and V. S. Pande. Simulation of the rate of formation and structure of Aß oligomers. Journal of Chemical Physics, 129 214707 (2008)

(Liu, Jayakumar, VSP)

#### **TEM: Mutant shows slowed aging**



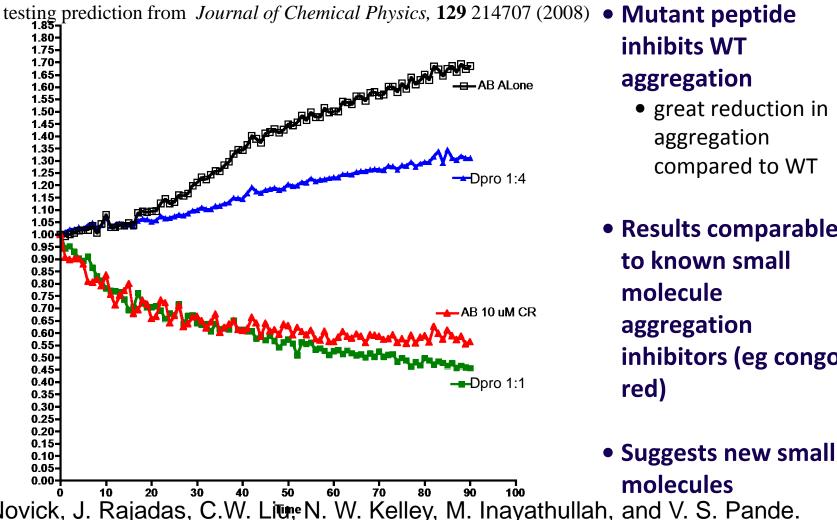
testing prediction from *Journal of Chemical Physics*, **129** 214707 (2008)

#### WT forms protofibrils easily (days)

- Mutant considerably more stable
- We see spheriod particles, but no fibrils

P. Novick, J. Rajadas, C.W. Liu, N. W. Kelley, M. Inayathullah, and V. S. Pande. Rationally designed turn promoting mutation in the amyloid  $\beta$ -peptide sequence to stabilize oligomers in solution. *PLoS ONE* **6**(7): e21776 (2011)

#### **Dpro mutant inhibits WT aggregation**



#### Mutant peptide inhibits WT aggregation

- great reduction in aggregation compared to WT
- Results comparable to known small molecule aggregation inhibitors (eg congo red)

molecules P. Novick, J. Rajadas, C.W. Liune N. W. Kelley, M. Inayathullah, and V. S. Pande. Rationally designed turn promoting mutation in the amyloid  $\beta$ -peptide sequence to 57 stabilize oligomers in solution. PLoS ONE 6(7): e21776 (2011)

### Simtk.org: a resource for sharing code, data, models



**Biomedical** Computation Review



Simbody 2.2

multibody dynamics library.

OpenMM 4.1 OpenMM 4 introduces a new application layer, allowing users to easily run molecular dynamics simulations out of the box on high performance GPUs supporting CUDA and OpenCL. It is part of the OpenMM Software Suite.

Simbody is a high-performance, opensource toolkit for simulation of articulated biological structures and includes a



Neuromuscular

Cardiovascular

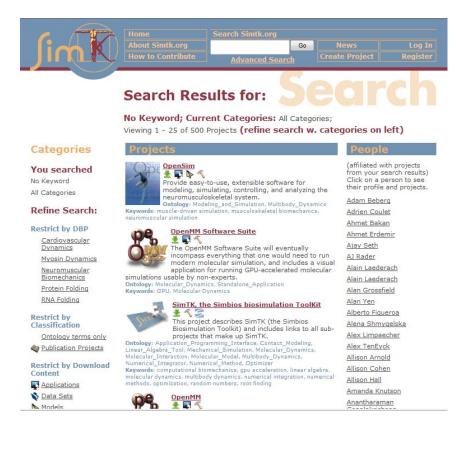
**Dynamics** 

Biomechanics

 Web-based project hosting site for the biocomputational community

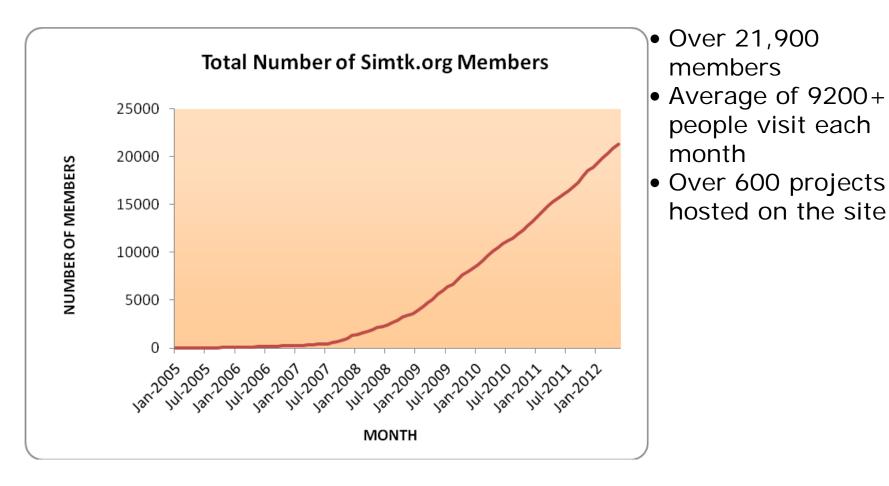
- Features include:
  - Privacy options to share data/software only when you are ready
  - Daily backups
  - Statistics on project visitors and users

## Simtk.org Projects



- Variety of projects hosted on Simtk.org
  - Software
  - Models & simulation data
  - Training materials
  - Publication-based projects
  - Projects for collaborations and more...

## Simtk.org Statistics

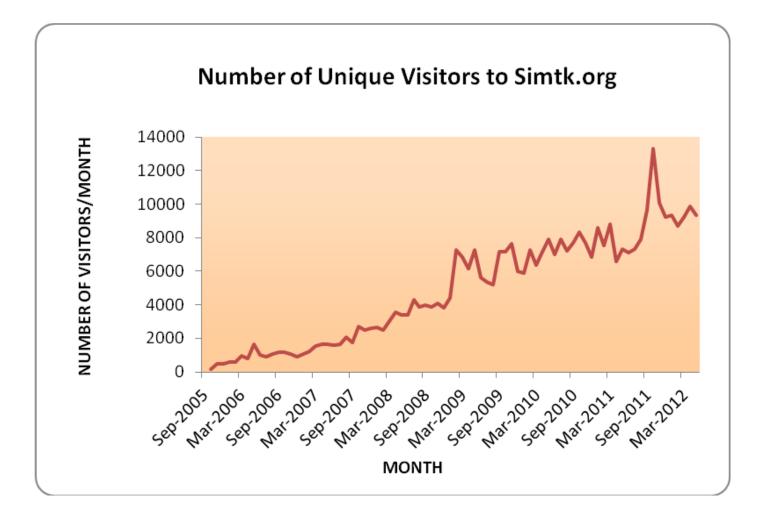


## **Biomedical Computation Review**

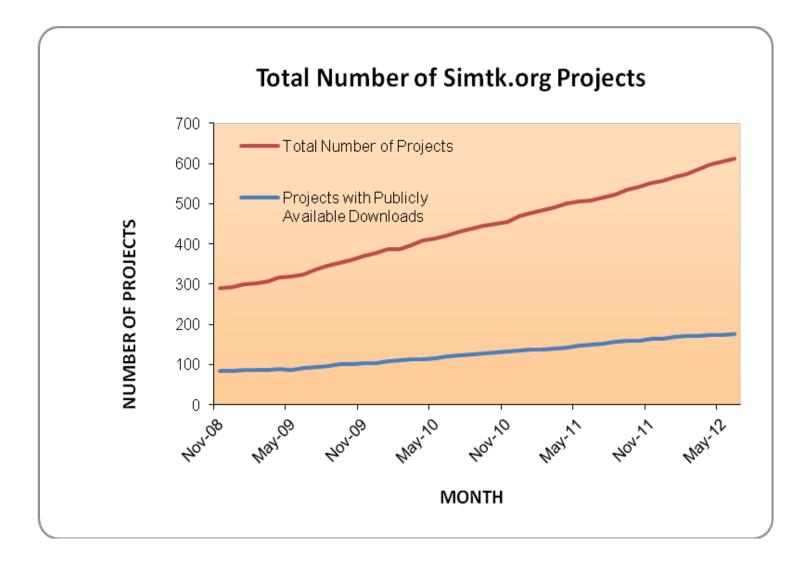


- OMagazine on biomedical computation research, written for a general lay audience
- **O**Published 3 times a year
- **O** Also available on the web
- **Over 3600 subscribers to the print edition**

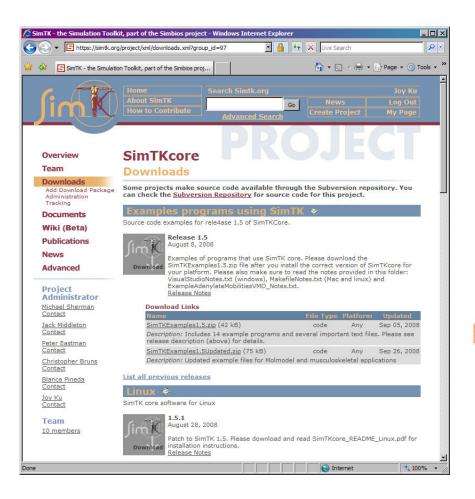
#### Simtk registered users



## Simtk projects



#### Simtk project: core Simbios software





#### **Conclusions**

- The three centers focusing on systems science and computational biology, substantial contributions
  - Scientific (papers, impact)
  - Community (people, meetings, magazines)
  - Infrastructure (software, data, models)
- The key success of the NCBC centers is producing and integrating all three of these in focused areas of science: in these cases = systems biology, biomedical informatics, physical simulation

#### Thanks.

#### russ.altman@stanford.edu



## THEME B: Biomedical Image Post Processing under the NCBC Program

### Ron Kikinis, M.D.

Robert Greenes Distinguished Director of Biomedical Informatics Professor of Radiology, Harvard Medical School

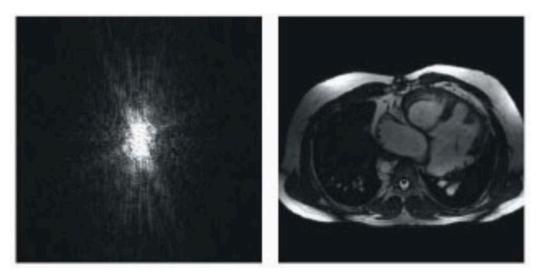
Founding Director, Surgical Planning Laboratory, Brigham and Women's Hospital Principal Investigator, National Alliance for Medical Image Computing (a National Center for Biomedical Computing), and Neuroimage Analysis Center (a NIBIB National Resource Center) Research Director, National Center for Image Guided Therapy

#### **Charter**

- A number of the NCBC centers have activities related to biomedical image analysis
  - The National Alliance for Medical Image Computing (NA-MIC) researches computational tools for the analysis and visualization of medical image data,
  - The Center for Computational Biology (CCB) is focused on the development of computational biological atlases of different populations, subjects, modalities, and spatio-temporal scales.
  - Several of the other centers have imaging related aims, including iDash, Simbios, and I2B2.

## **Introduction**

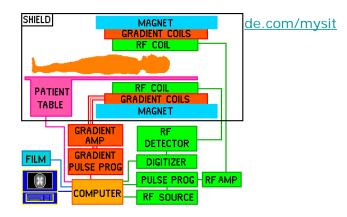
- Imaging is complicated
- From physical measurement to image data.
  - MR: RF
  - CT: X-rays
  - Ultrasound
  - etc.



Example MRI RF measurements represented in k-space (left) and after Fourier transform (right)

#### Source:

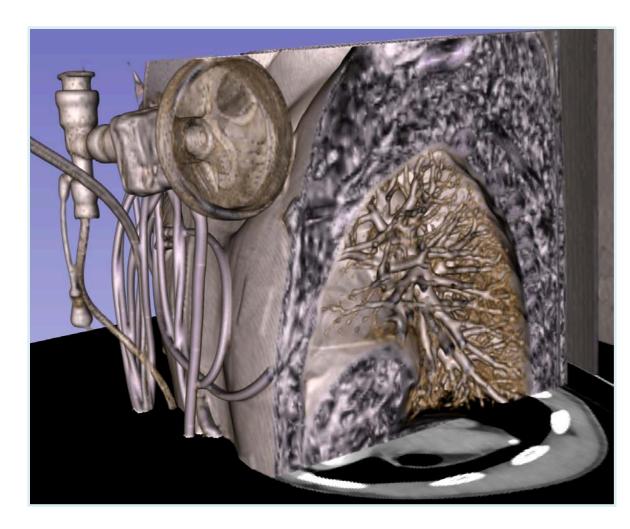
http://www.biij.org/2008/1/e15/fig.asp?p=13 9&o=351



## **Post-Processing Is Needed**

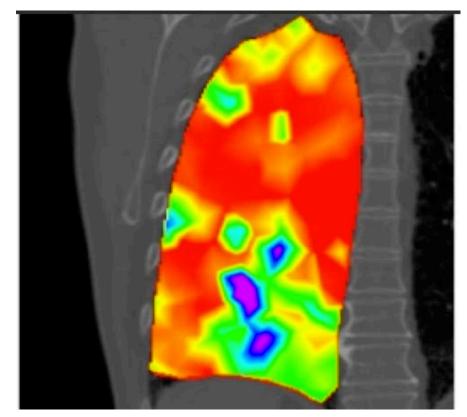
- From image data to information
- From information to knowledge





#### Medical Image Computing (MIC)

- Imaging is of increasing importance in medicine, however:
  - More data
  - More complexity
    - fMRI, molecular imaging dMRI, 4DUS
  - More applications
    - Diagnosis
    - Therapy



Risholm P., Ross J., Washko G.R., Wells III W.M. *Probabilistic Elastography: Estimating Lung Elasticity*. Inf Process Med Imaging. 2011;22:699-710. PMID: 21761697. PMCID: PMC3249413

# What Is Your Science?

- The basic science of one field is the applied science in a different field
- Image analysis concepts move
  - From applied math to computer vision to biomedical
- A caveat:
  - Clearly, your field of science is the most interesting to you.
  - Your colleagues think the same about their field of science

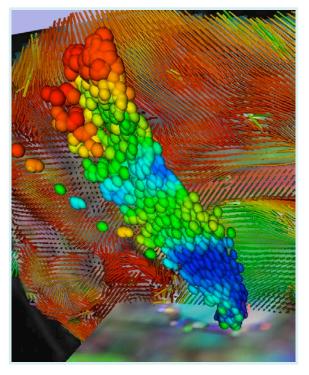


Image provided by Kikinis

# From Algorithms To Tools

- Can it be done?
   Prototypes
- Is it worth doing?
  - Tools for translational research
- Standard of care
  - Commercially available clinical "devices" with regulatory approval

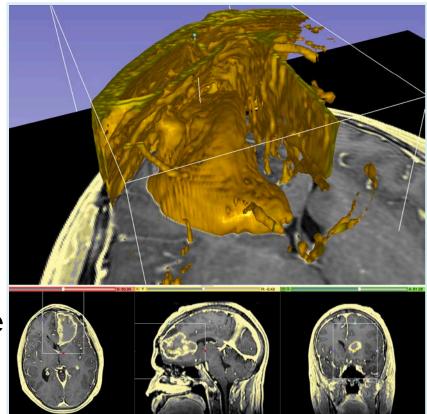


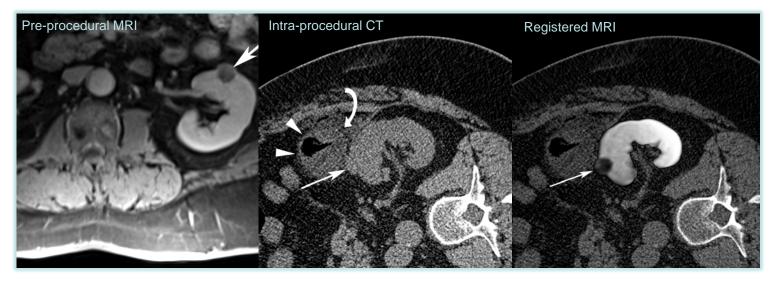
Image provided by Kikinis

## Why Tools?

- A prototype will work until the completion of a thesis or paper
  - Not portable
  - Unstable
- A tool will work in your environment
  - Easy to install
  - Easy to use
  - Robust
- Significant software engineering investment is needed for the creation of robust tools

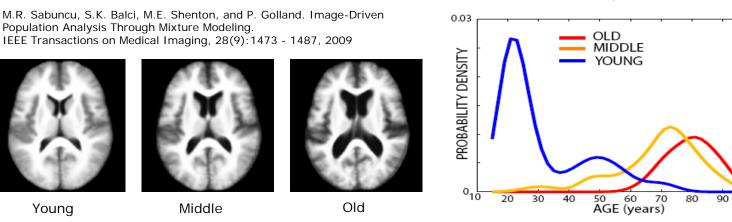
### **The Valley of Death**

- Well-engineered software tools are needed for translational clinical research in image analysis
- Creating such tools is expensive and does not fit traditional funding mechanisms
  - Science agencies: its not innovative
  - Companies: no proven clinical utility, patents do not work, its too risky



### **Group Comparisons**

- Often used in basic imaging research
- Targets normal appearing structures
  - Typical appearance
  - Normal variability
- Extensive resources

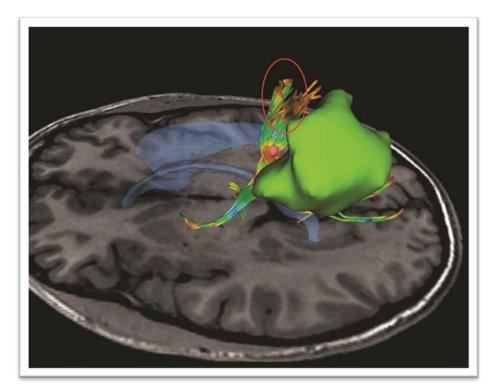


3 Templates

100

### Subject Specific Analysis

- Clinical motivation to understand the situation of one subject
- Targets pathology:
  - Where is the pathology?
  - What are important surrounding structures
- Limited resources



Golby A.J., Kindlmann G., Norton I., Yarmarkovich A., Pieper S., Kikinis R. *Interactive Diffusion Tensor Tractography Visualization for Neurosurgical Planning*. Neurosurgery. 2011 Feb; 68(2):496-505. PMID: 21135713

### **NCBC and Imaging**

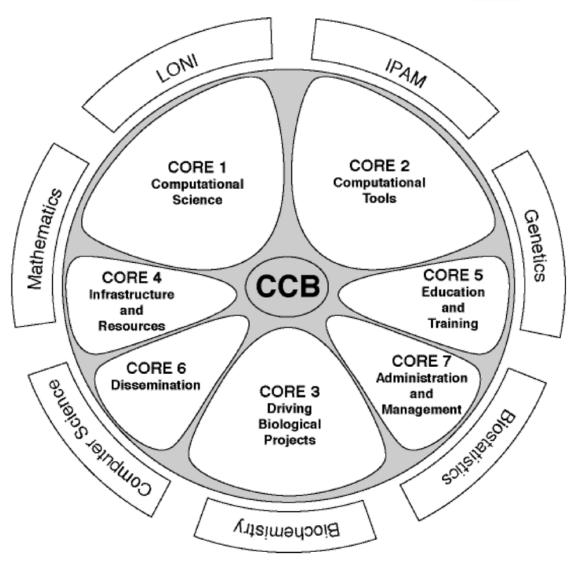
- CCB
- iDash
- Symbios
- I2B2
- NA-MIC

#### <u>CCB</u>



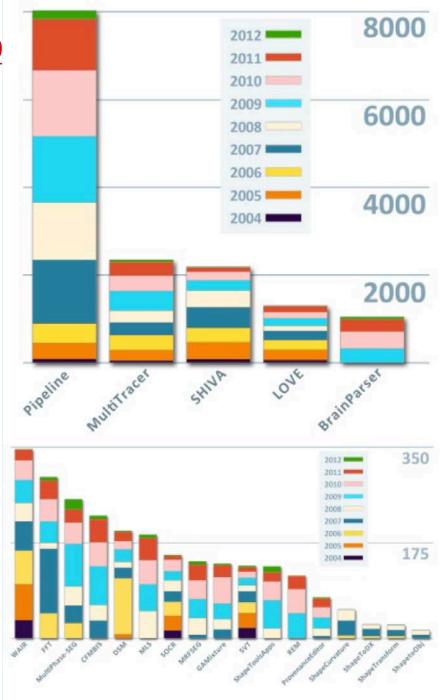
Center for Computational Biology, U54RR21813

- Core 1: mathematical and computational research. Core 2: develops the tools to be applied to the four driving biological projects
- Core 3: DBPs: Mapping Genomic Function, Mapping Biological Structure and Mapping Brain Phenotype



### **Accomplishments 20**

- 280+ peer reviewed journal articles
- 70+ algorithmic prototypes and tools including:
  - Segmentation, registration, dMRI, workflow engines, provenance management, QA tools



- The Segmentation Validation Engine (SVE) <u>http://sve.loni.ucla.edu/</u>, a segmentation challenge for skull-stripping.
- Registered users may download 40 MRI whole head volumes, process them and upload the results to the SVE server.
- Uploaded segmentation results are processed to produce a set of agreement measures based on comparison with manually delineated brain volumes.

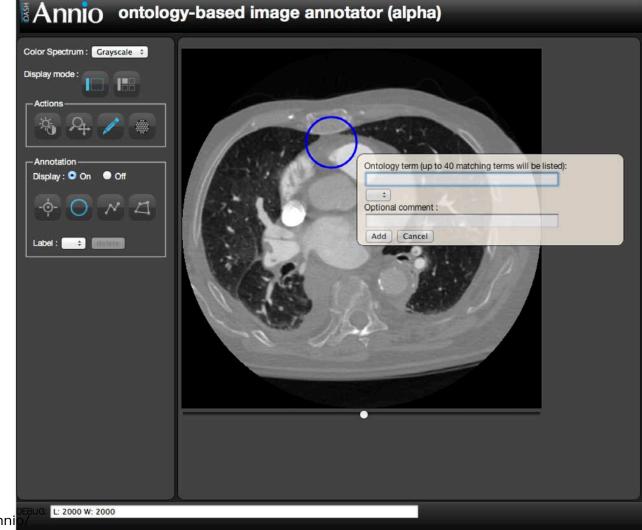


Integrating Data for Analysis, Anonymization and SHaring (iDASH)

 The iDASH center provides a secure, privacy-preserving environment in which researchers can analyze genomic, transcriptomic, clinical, behavioral, and social data relevant to health.

#### <u>iDash</u>

As part of the comprehensiv e support for annotation of clinical data, iDash is developing a web based image annotation tool.



http://imaging-idash.ucsd.edu/anni





Simbios is the NIH Center for physics-based Simulation of Biological Structures. U54 GM072970,

### **Simulation-Based Treatment Planning**

# **Experimental Data Biomechanical Models** Image analysis



Informatics for Integrating Biology and the Bedside

- The i2b2 Center is developing a scalable informatics framework that will enable clinical researchers to use existing clinical data for discovery research
- Massive data mining in clinical databases



Medical Image Informatics Bench to Bedside Massive Image Data Mining in Clinical PACS systems

- Integrates Informatics Databases (RPDR/i2b2) with PACS
- DICOM Query/Retrieve to Desktop
- Logged Access and IRB Controls
- Governed Access to PACS
  - Radiology Department Controls Access Time and Rate
  - Prevent Interference with Clinical Work
- Free and Open Source <a href="http://www.mi2b2.org">http://www.mi2b2.org</a>

#### <u>mi2b2</u>

i2b2 Workbench for i2b2 Demo

spital, 1 study 562673.14401) X Date: 2006/12/19, 1 series

Mage Viewer 🖾

CLAUS^SANTA^C M M, 1949/01/01, MGH YAWKEY 3T, 1 study

Library: /Users/davidwang/files/ImageLibrary

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14+

Frame(1/54

Minimum:

Maximum:

Contrast:

Brightness:

Auto Adjust

4095

Zoom Controls Zoom Factor: 0.89

🗹 Zoom to Fit

Reset

Action MRN

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Sample ID

SKULL

0002

#### IRB-Approved Medical Records Queries Identify Studies of Interest

1. Search for Patients 2. Search for Studies 3. Image Repository 4. View Images

Image Viewer	×											Ø. 1
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9995004	fPHS	research	MF-00	00004	05/18/2012 11:43	2:04 12/19/2006	13:45:40 Magnetic Resonance	15.11 MB	demo	05/23/2012	11:41:26	
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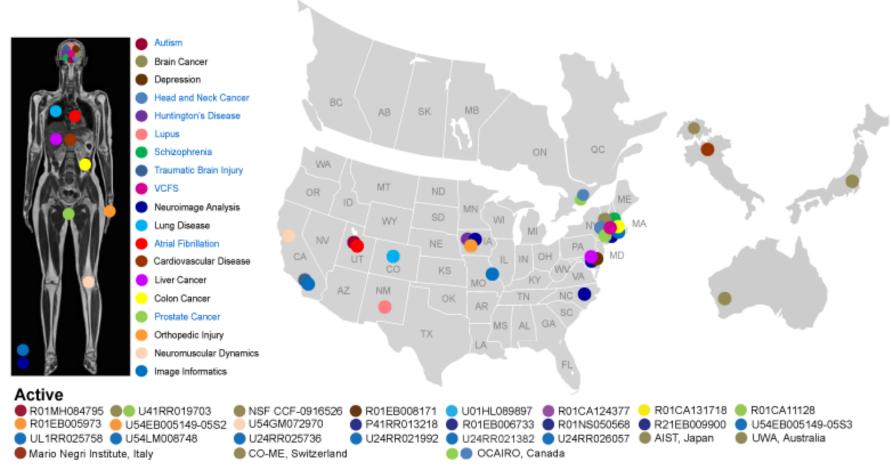
Selected Studies are Downloaded to Local Storage for Further Research Processing

#### NA-MIC

The National Alliance for Medical Image Computing (NA-MIC), is a community of esearchers

- Focus on
  - Subject specific image analysis
  - NA-MIC kit, including 3D Slicer as a platform for dissemination

# **NA-MIC Community**



#### Completed

U54EB005149-04S1

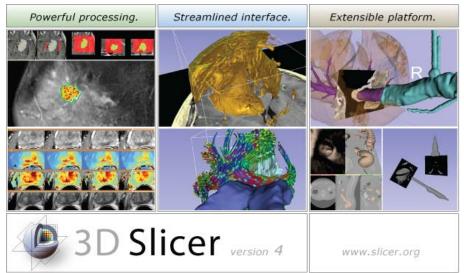
Picture 2011, courtesy Kapur, Jakab, Kikinis

### Why Open Source?

- Collaborate freely
  - Proprietary software allows collaboration only among customers of that package
  - Neutral territory in multi-vendor scenarios,
- Reduce duplication
- Extensible

# **3D Slicer**

- 3D Slicer bridges the "valley of death" for subject specific analysis
  - Free open source software
    - Enables scientific collaboration
    - License allows painless translation to proprietary clinical tools
  - Well-engineered high-performance core
    - Software engineering methodology, multi-platform
  - Many options for extensions





### **Slicer for Translational Research**







#### What does a developer need ?

Easily Deployable Extensible and Reconfigurable Rich Utility Libraries

Stable Base

What does a user expect ? Easy Install and Upgrade "Standard" Clinical Behavior Advanced Functionality Consistent Interface

3D Slicer: a cross platform system for *translating* innovative algorithms into clinical research applications

Courtesy R. Kikinis

# **Slicer Is Open**

Open Science
 Open Source
 +
 Open Data
 +
 Open Community

Tokyo 2010, hosted by H. Iseki





Boston 2010

# **Slicer Is Accessible**

- Designed from scratch for:
  - Multi-platform support
  - Multi-site development
- International developer community
- International user community





# **Slicer is Extensible**

- Variety of options for the developers:
  - Developer startup time and control of
  - Slicer

 $\checkmark$ 

More

- Scripted module: TCL or Python scripts
  - simple, no compilation needed
    - limited access to Slicer internals

#### • Command-line module: .exe file

- simple, executable without Slicer
- no access to Slicer internals, Slicer compilation needed

#### Loadable (interactive) module: .dll

- full access to Slicer internals
- Slicer compilation needed, requires Slicer core knowledge

# **Slicer 4 Downloads**

#### http://download.slicer.org



### <u>URL' s</u>



National Alliance for Medical Image Computing www.na-mic.org



Neuroimage Analysis Center Nac.spl.harvard.edu



Surgical Planning Laboratory, Brigham and Women's Hospital spl.harvard.edu



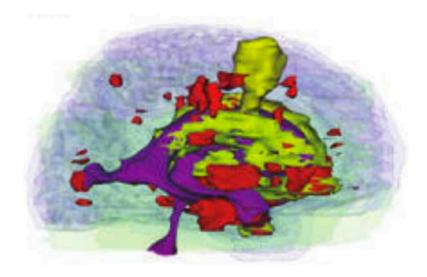
National Center For Image Guided Therapy www.ncigt.org

### **Subject Specific Analysis**

- Studies focused on subject specific analysis are an example of the translational science paradigm discussed previously. The goal is to develop capabilities to analyze:
  - One subject
  - Short time for the analysis
- Limited automation
- Limited computational resources
- Example:
  - TBI

### **NA-MIC DBP on TBI**

Team: BWH, Utah, Kitware, UNC, Boston Univ., UCSD



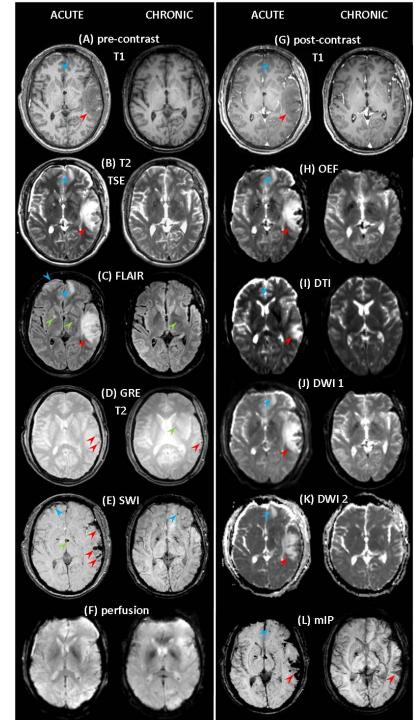
Irimia A., Chambers M.C., Alger J.R., Filippou M., Prastawa M.W., Wang B., Hovda D., Gerig G., Toga A.W., Kikinis R., Vespa P.M., Van Horn J.D. *Comparison of Acute and Chronic Traumatic Brain Injury using Semi-automatic Multimodal Segmentation of MR Volumes*. J Neurotrauma. 2011 Nov; 28(11): 2287-306

- •Biomedical image analysis
- •Segmentation
- Processing
- •Modeling
- Measurement
- Visualization

### **Example Case**

Longitudinal neuroimaging of TBI using multimodal MRI at the Brain Injury Research Center (BIRC), UCLA

- Acute imaging within 1<sup>st</sup> 48 hours after admission
- Chronic imaging 6 months post injury
- Multiple sequences



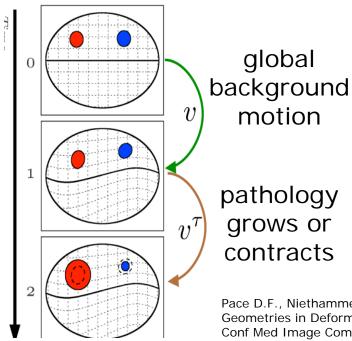
# Algorithm Development 1 Registration of

<u>sliding</u>

anatomical

#### **Registration:** Geometric 'Metamorphosis'

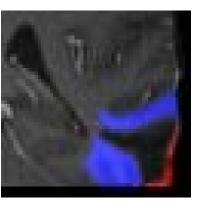
structures Joint estimation of global background & pathology deformation



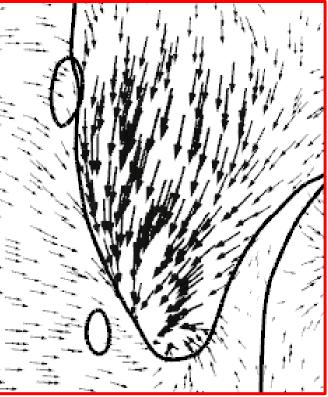
global

motion

#### pathology grows or contracts

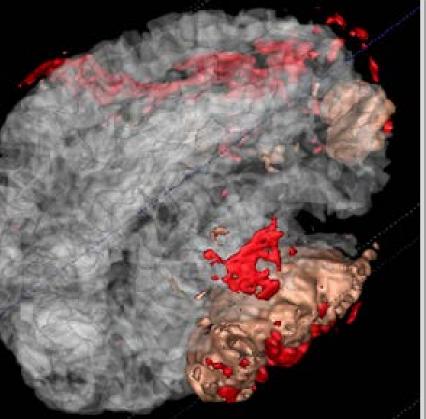


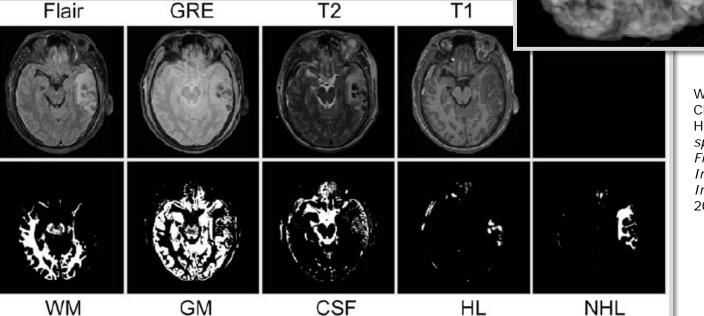
Pace D.F., Niethammer M., Aylward S.R. Sliding Geometries in Deformable Image Registration. Int Conf Med Image Comput Comput Assist Interv. 2011;14(WS):141-148. Workshop on Abdominal Imaging



#### <u>Algorithm</u> <u>Development 2</u>

### Segmentation: Multi-Tissue Type Classification





Wang B., Prastawa M., Irimia A., Chambers M.C., Vespa P.M., Van Horn J.D., Gerig G. *A Patientspecific Segmentation Framework for Longitudinal MR Images of Traumatic Brain Injury*. Proceedings of SPIE 2012;8314, 831402.

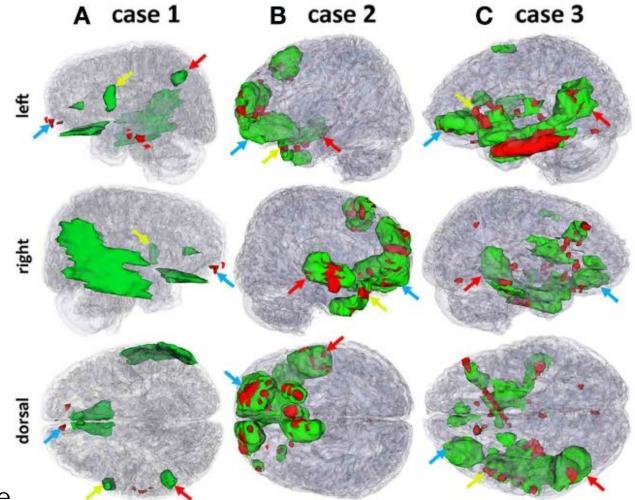
### Subject Specific Analysis 1

3D models of pathology in three patients

Wang B., Prastawa M., Irimia A., Chambers M.C., Vespa P.M., Van Horn J.D., Gerig G. *A Patientspecific Segmentation Framework for Longitudinal MR Images of Traumatic Brain Injury.* Proceedings of SPIE 2012;8314, 831402.



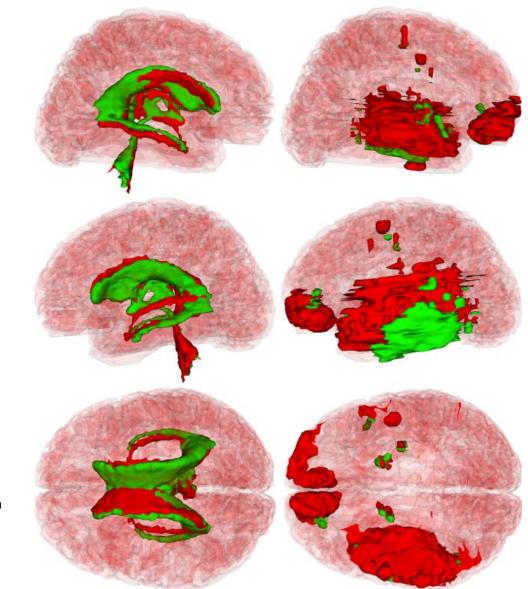
edema hemorrhage



### **Subject Specific Analysis 2**

(C) VENTRICULAR SYSTEM

(D) LESIONS



### Longitudinal change: acute vs. chronic

Wang B., Prastawa M., Irimia A., Chambers M.C., Vespa P.M., Van Horn J.D., Gerig G. *A Patientspecific Segmentation Framework for Longitudinal MR Images of Traumatic Brain Injury.* Proceedings of SPIE 2012;8314, 831402.



Wang et al., Univ. Utah

### **Group Comparisons**

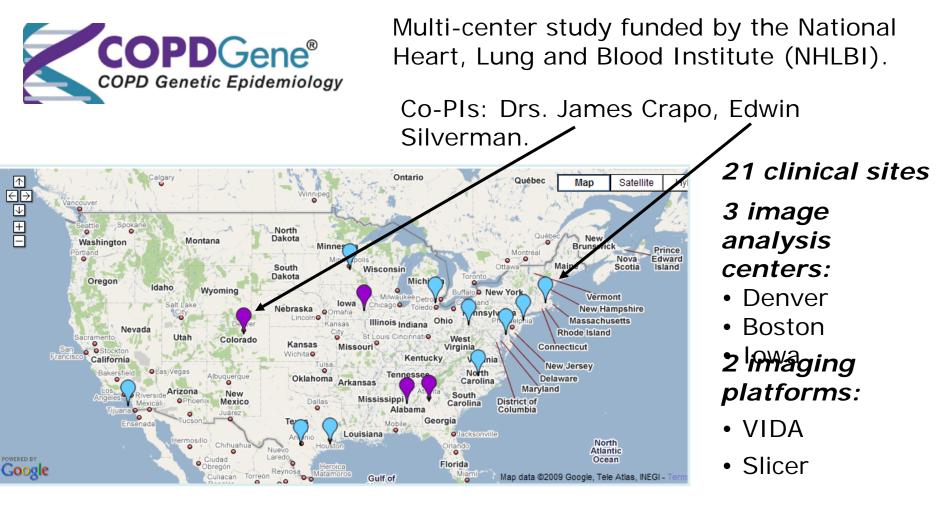
- Clinical Imaging Studies are similar to the basic science paradigm discussed previously:
  - Large number of subjects
  - Years for the analysis
- Requires fully automated pipelines
- Requires large computational resources
- Example: COPD gene



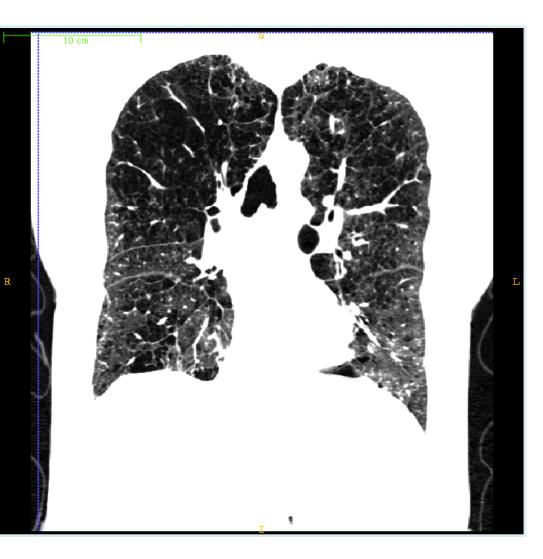
Only 20% of smokers develop COPD



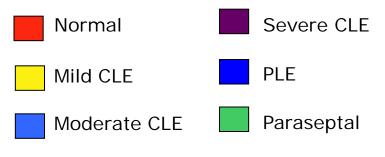
Genetic factors



#### **Emphysema Classification for Gene Discovery**



 Identification of emphysema patterns based on local histogram classification

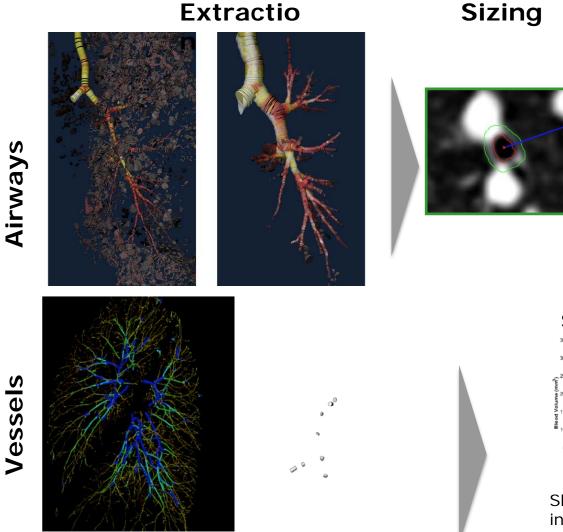


- Centrilobular (CLE) and panacinar (PLE) emphysema
- GWAS in 9000 smokers
- New genetic markers for emphysema were found near the CHRNA3/5 locus on 15q25 and near MMP12 and MMP3 on 11q22

Castaldi PJ, San Jose Estepar R, Sanchez Mendoza C, Crapo JD, Lynch D, Beaty TH, Washko GR, Silverman EK, Proc. ATS, 2012, p.A3808.

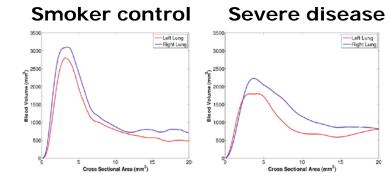
### Phenotype Analysis In The Lung

### **Extractio**



Phenotyp e (ww.) veare root wall a aranbo Airway wall corresponding to a

10 mm internal Perimeter



Shift in blood volume per cross sectional area indicating distal pruning and proximal remodeling with disease progression

Kindlmann G, San José Estépar R, Smith SM, Westin CF. Sampling and visualizing creases with scale-space particles. IEEE Transactions on Visualization and Computer Graphics 2009; 15(6): 1415-1424. PMID: 19834216.

# THEME C: Biomedical Informatics Under the NCBC Program

### Mark A. Musen Stanford University

DASH Integrating Data for Analysis, Anonymization, and SHaring

i2b2 Informatics for Integrating Biology & the Bedside



### **National Centers for Biomedical Computing**



Computation

### **Bioinformatics in the NCBC Program**

- Focus is on infrastructure for
  - Data modeling
  - Data acquisition
  - Data management
  - Data analysis
- Continuum of data from basic biology to clinical medicine to population health
- Each of the centers in this group emphasizes different methodological aspects

### **Bioinformatics-related NCBCs**



Informatics for Integrating Biology & the Bedside

Isaac Kohane, PI; Harvard/Partners' HealthCare

# DASH Lucila Ohno-Machado, PI; UCSD

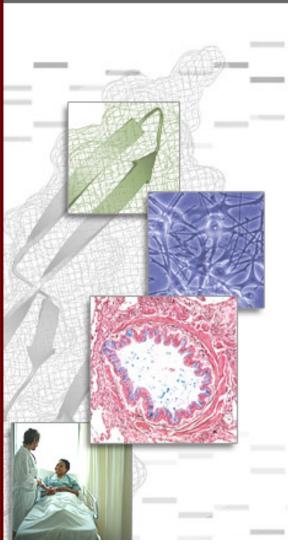


Mark Musen, PI; Stanford

A National Center for Biomedical Computing

#### Informatics for Integrating Biology & the Bedside

Software | Resources | Events | Training | News | Collaborations About Us Driving Biology Projects Publications



#### MISSION

i2b2 (Informatics for Integrating Biology and the Bedside) is an NIH-funded National Center for Biomedical Computing based at Partners HealthCare System. The i2b2 Center is developing a scalable informatics framework that will enable clinical researchers to use existing clinical data for discovery research and, when combined with IRB-approved genomic data, facilitate the design of targeted therapies for individual patients with diseases having genetic origins. This platform currently enjoys wide international adoption by the CTSA network, academic health centers, and industry. i2b2 is funded as a cooperative agreement with the National Institutes of Health.

#### DRIVING BIOLOGY PROJECTS

- Overview ...
- Current DBPs ...
- ... Autoimmune/CV Diseases
- Diabetes/CV Diseases ...
- Past DBPs -----
- **Airways Diseases** -
- Hypertension ...
- -----Type 2 Diabetes Mellitus
- Huntington's Disease ==
  - Major Depressive Disorder
  - Rheumatoid Arthritis
  - Obseity

...

==

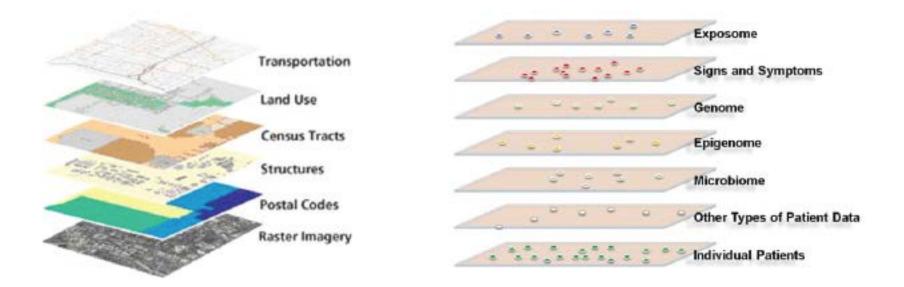
#### RESOURCES

- Overview
- **Computational Tools**
- **De-Identification Demo**
- Software
- NLP Research Data Sets
- NLP Shared Tasks ...
- Academic Users' Group

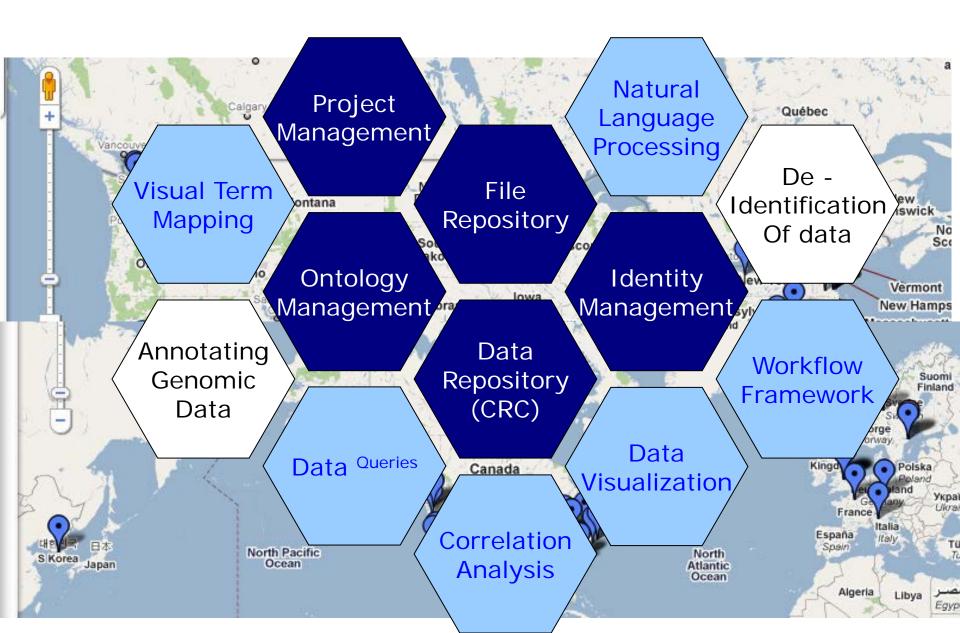
### Better, faster insights through for Precision Medicine by Instrumenting Health care and Populations

#### Google Maps: GIS layers Organized by Geographical Positioning

#### Information Commons Organized Around Individual Patients



### **National Translational Toolkit**



### Narrative data (NLP text extractions)

000	i2b2 Workbench		
i2b2 Workbench for Rheuma	tojekrthritis	Robert Ple	enge, MD, PhD Status: 😑 🛛 🕬
🗣 Navigate 🛛 🗣 Find Ter 🗖 🗖	🖉 Query Tool 🕱 💽 Correlation Analysis Cell	0 - 2	Import Data 🛛 👔 Help 🗖 🗖
🖉 💟	Query Name: True_3-ACR Cri@09:32:30	Reset Groups	<u>N</u>
<ul> <li>RA</li> <li>Case Controls</li> <li>Chart Reviews</li> <li>Chart Reviews</li> <li>Diseases</li> <li>JRA</li> <li>PSA</li> <li>RA</li> <li>SLE</li> <li>Frosions</li> <li>Labs</li> <li>Medications</li> <li>Motes</li> <li>RMP Case Control</li> </ul>	Group 1       X       Group 2       X       Group 3       X         Dates       Occurs > 0x       Exclude       Dates       Occurs > 0x       Exclude         Image: True_3       Image: ACR Criteria       Image: C	<ul> <li>✓ Timeline</li> <li>✓ Patient Count</li> </ul>	Import Wizard     Import Status       Step 1 - Choose Data       Either     Or       1 : impor     Drag Patient       Step 2 - Verify Data       Patient Mapping     Event Map       Status     Patient
<ul> <li>Smoking</li> <li>RPDR</li> </ul>	Run Query Patient(s)		
<ul> <li>Demographics</li> <li>Diagnoses</li> </ul>	Timeline View 🛛 🕒 Export Data	i 🖉 🖋 🗖 🔂	
	Create model for Timeline Render a Timeline		
<ul> <li>Microbiology</li> <li>Procedures</li> <li>Transfusion Services</li> <li>Visits</li> </ul>	▼ ACR_Criteria	- 6	
♥ 급 Clinic 쥜 BWH Arthritis Cei 쥜 MGH Arthritis As 쥜 Other Clinics	▼ Erosions		
Hosptial	Vedications ▼ L R_Notes		
► 🔂 True_1-Female@04:29:14 [	▼ BW: Arthritis_C ▼ Rheu: toid_arth		Step 3 - Upload Data
<ul> <li>True_1-Adalimu@04:27:49</li> <li>True_1-Methotr@04:26:33</li> <li>True_1-Nodules@04:25:37</li> <li>True_1-CCP Pos@04:21:45</li> </ul>	<u></u>	ent: 10 >	Progress

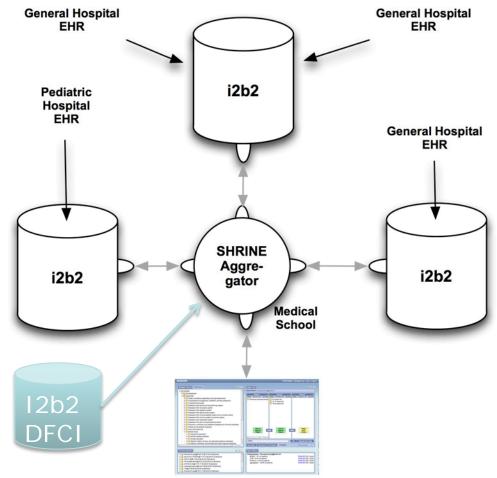
Codified data (ICD9 codes, etc)

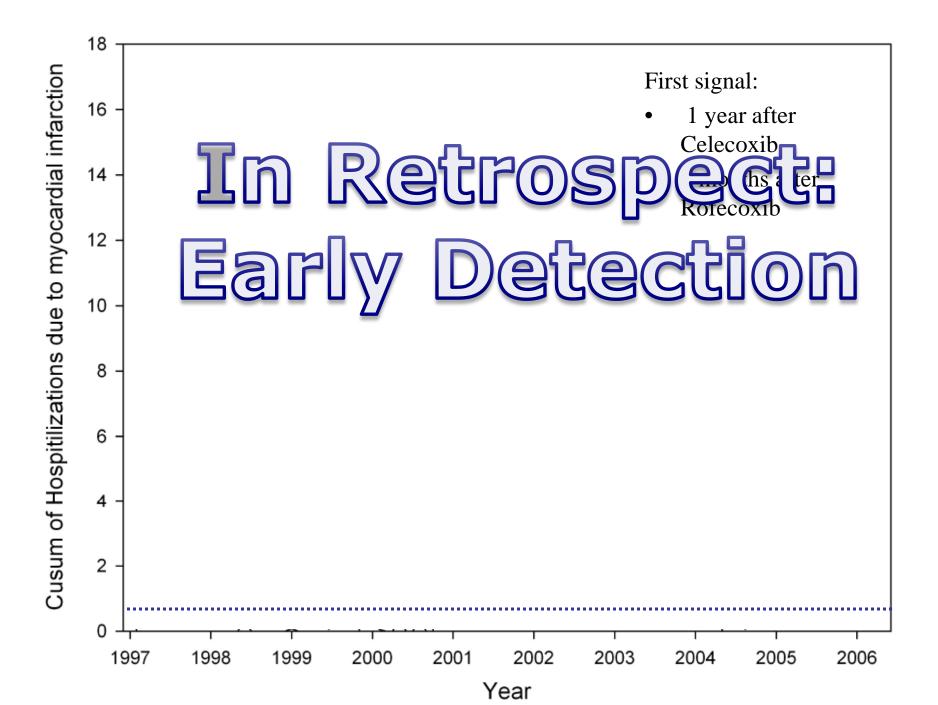
<u>2012</u>

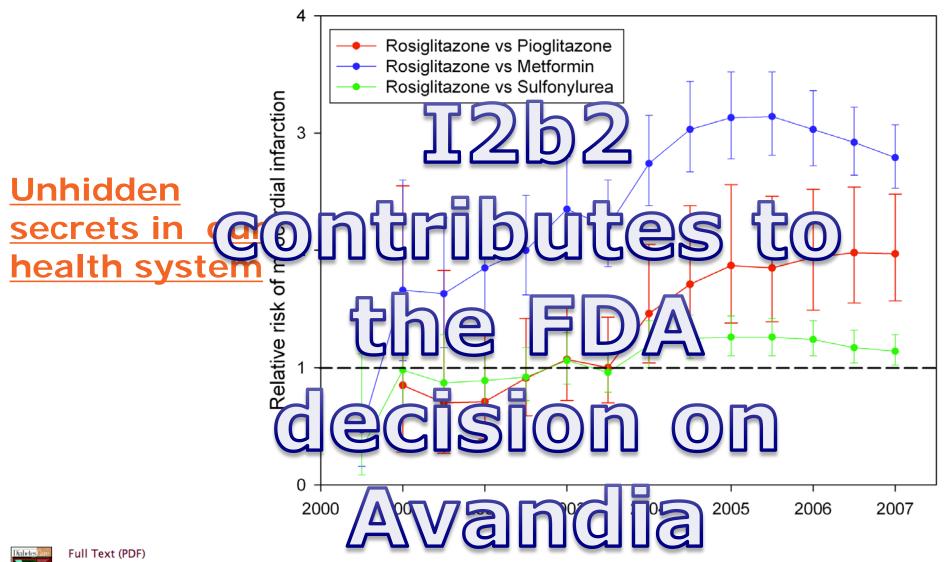


# SHRINE Network extends the reach of i2b2 across sites

- Search routine clinical records from 5 major hospitals for:
   General Hospital
  - Demographics
  - Diagnosis
  - Medications
  - Lab Results
- Reach N
  - Rare Dx
  - Small Effects







Rapid Identification of Myocardial Infarction Risk Associated With Diabetes Medications Using Electronic Medical Records

Diabetes Care March 2010 33:526-531; published ahead of print December 15, 2009,



Tools & Services 🔻 About 🔻 Research 💌 Training 🔻

Search

### Policy-based Secure Data Sharing

#### Policy-based Secure Data Sharing

#### Science

Learn more about our driving biomedical and bioinformatics projects

#### Welcome to iDASH



Share/Access Data Host and access data in a secure and privacypreserving environment



Software/Tools Advance your research and push your boundaries



CyberInfrastructure Explore the fabric that binds all iDASH resources together



Contemporary biomedical and behavioral research increasingly demands access to data-intensive computational resources. While the United States' investments in information technology assets has created a rich national fabric to accelerate research, the number of bioscience researchers without these tools is increasing. By integrating secure, patient-anonymous data for analysis, anonymization, and sharing, iDASH is narrowing the gap by extending its infrastructure, tools, and services more broadly to the national biomedical, clinical, and informatics communities at universities, medical schools, and hospitals.

Created as a National Center for Biomedical Computing (NCBC) under the auspices of the NIH Roadmap for Bioinformatics and Computational Biology, iDASH is a Biomedical Cyberinfrastructure (BCI) that provides innovative services, algorithms, open-source software, and data storage as well as training.

#### **iDASH News**

iDASH Second Annual All-Hands Symposium

July 18-19, 2012, UCSD, La Jolla, CA

Biomedical Data Sharing: Ethical, Legal, and Policy Perspectives

July 18, 2012, UCSD, La Jolla, CA Details

IEEE Conference on Healthcare Informatics, Imaging, and Systems Biology (HISB) September 27-28, 2012, UCSD, La Jolla, CA Details

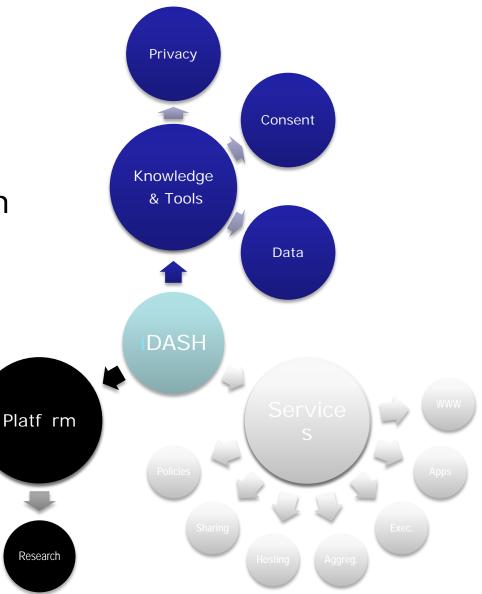
iDASH Privacy Workshop September 29, 2012, UCSD, La Jolla, CA

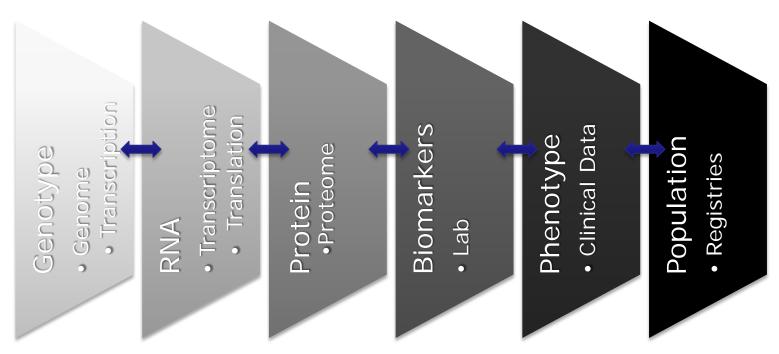
### **iDASH Vision**

- Share access to data and computation
  - Allow biomedical researchers to focus on their science

Develop.

- Provide software, platform, and infrastructure
- Protect privacy
- Share
  - Data
  - Workflows
  - Computation
  - Security
  - Policies





- Data integration across biological scales
- Data analysis from multiple sources
- Data 'anonymization' and privacy preservation

### Big Data, Small Data, and other Data

## Public Repository for Biomedical Data

MIDAS – Digital Archiving System							
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oo ka iiii rygiitetta		Login Help					
	ting Data for Analysis, Anonymization, and SHaring	1					
E Feed							
🚓 Explore	What is the iDASH public data repository?						
읎       Communities         2       Users          My space	Welcome to the iDASH public data repository. This Midas repository is intended to store biomedical data that does <b>not</b> contain personal health information (PHI) or personal identifiable information (PII). Data sets that contain PHI or PII can be placed in the iDASH private data repository.						
	How can I use this repository?						
	The process for being granted access to this repository is described on the iDASH website						
	What data sets are available from iDASH?						
	A description of all data sets currently available (or soon to be available) from iDASH are listed here						
	How can I contact iDASH if I have questions?						
	You can e-mail any questions to idash@ucsd.edu						

## Private Repository for Biomedical Data

000	MIDAS – Digital A	rchiving S	ystem				≜ ⊮ <sup>2</sup>
+ * https:/	//idash-data.ucsd.edu/user/userpage			d	Q+ Goo	gle	
60 💭 🎹 Pygments	highlighter Understandiathematics Gallery2:FAQ.	llery Code	x Swite	hPipe	e Deployn	ent Ho	ost Monsteeb hosting
						В	rian Chapman - Logout Help
DASH integrating	Q Search						Upload
	Data for Analysis, Anocymization, and SHaring	_	_	-	_	_	
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Explore	Brian Chapman University of California, San Diego San Diego	. United Sta	ites				ACTIONS
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### **Models for Sharing**

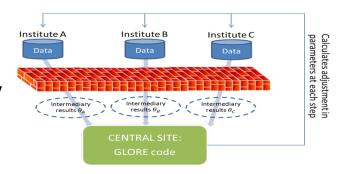
- *Traditional*: iDASH-hosted data exported for computation
  - Users download data from iDASH
  - Good for Small Data, Low-risk data with Data Use Agreements
- Computation comes to iDASH-data
  - (Users download artificial sets to pre-test their algorithms)
  - Users upload algorithms into iDASH
  - Good for Big Data, High Performance Computing, Genomics, PHI
- iDASH-computation goes to the data
  - Distributed computation, shared modeling
  - Good for when data cannot leave the institution/country

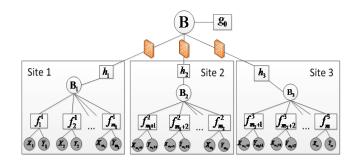
### Privacy preserving model building

- Distributed Privacy Preserving Support Vector machine (DPP-SVM)
  - http://privacy.ucsd.edu:8080/ppsvm
  - Ready for use
- Grid LOgistic REgression (GLORE)

   Demo: <u>http://tinyurl.com/7fwnkf6</u>
   UI in development (3 months), CLI ready
   \*Wu Y, et al. JAMIA 2012
- EXpectation Propagation based LOgistic REgRession (EXPLORER)
  - Demo: <u>http://tinyurl.com/7b5xaab</u>
  - UI in development (3 months) , CLI ready







Search Search Site . Search Google )







#### NCBO User Profile Jin-Dong Kim

Jin-Dong Kim Database Center for Life Science



More > Other profiles >

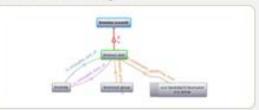
#### Video

Learn about Biomedical Ontologies. Watch a series of introductory videos.



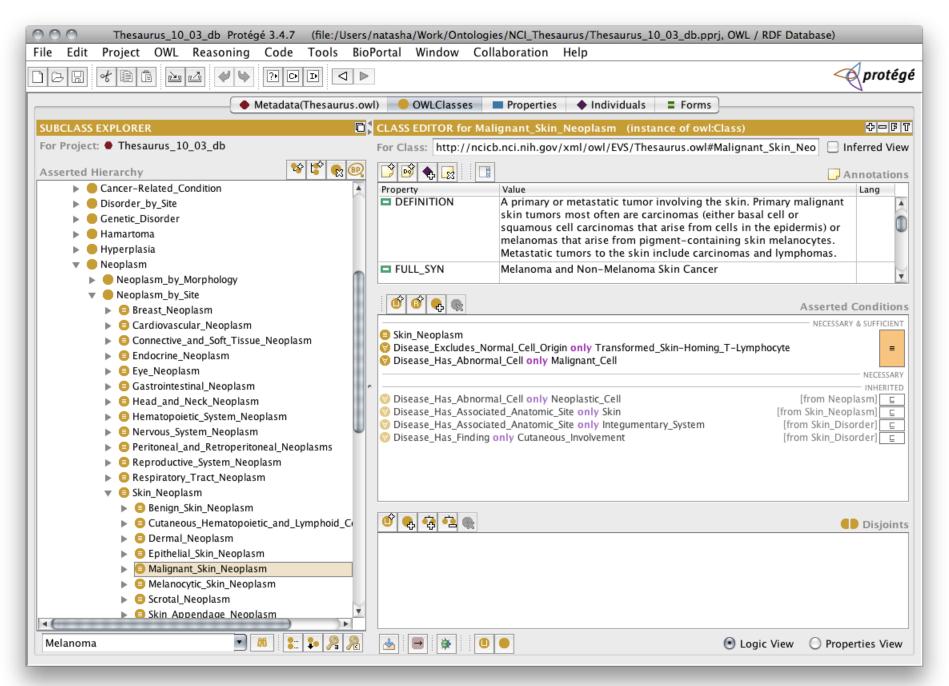
#### Browse ontologies in BioPortal!

BioPortal allows users to browse, search and visualize ontologies.



the Gene Ontology		AmiGO					
Search Browse BLAST	Homolog Annotations Tools & Resources Help						
Search GO	terms _ genes or proteins _ exact match s	ubmit					
Tree Browser							
Filter tree view       Filter Gene Product Counts         Filter by ontology       Data source         All       Data source         biological process       All         cellular component       AspGD         molecular function       CGD	Species All Arabidopsis thaliana Aspergillus fumig Aspergillus niger	ompact Set filters					
<ul> <li>all : all [582472 gene products] </li> <li>GO:0008150 : biological_process [442277</li> <li>GO:0022610 : biological adhesion [7784 geters]</li> <li>GO:0065007 : biological regulation [106873</li> <li>GO:0009758 : carbohydrate utilization [354</li> <li>GO:0015976 : carbon utilization [251 geners]</li> <li>GO:0001906 : cell killing [1176 gene products]</li> <li>GO:00071840 : cellular component organization</li> <li>GO:0016265 : death [12861 gene products]</li> <li>GO:0032502 : developmental process [490</li> <li>GO:0051234 : establishment of localization</li> </ul>	ene products] 3 gene products] gene products] products] ucts] e products] tion or biogenesis [55517 gene products] ne products] [] 09 gene products] [] [55604 gene products]	Actions Last action: Opened GO:0008150 Graphical View Permalink Download OBO RDF-XML GraphViz dot					
GO:0040007 : growth [13918 gene product	-						

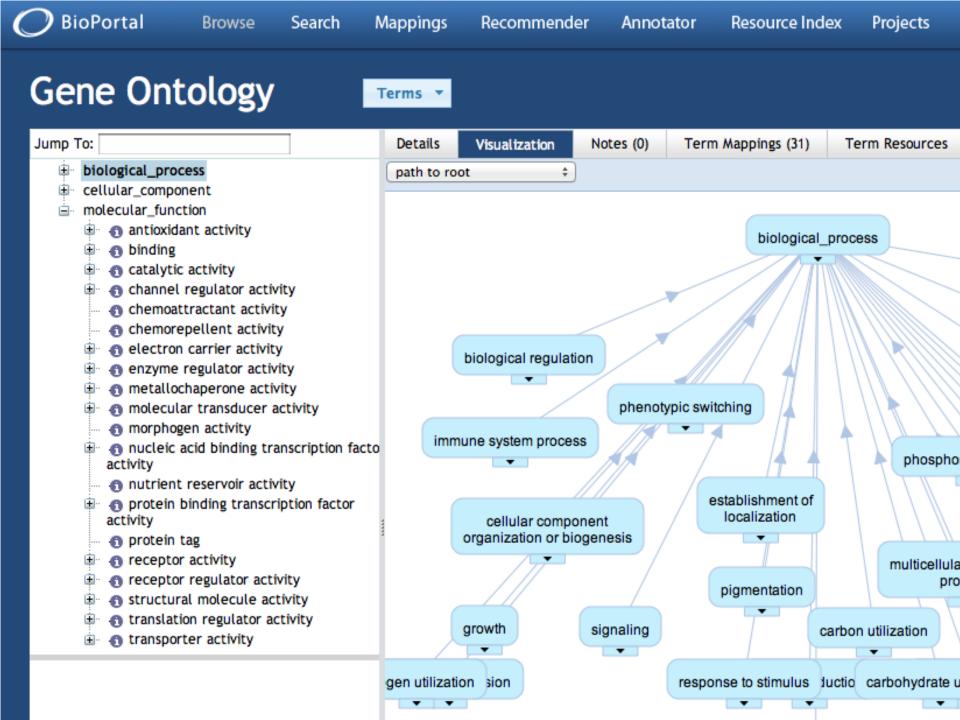
### The National Cancer Institute Thesaurus



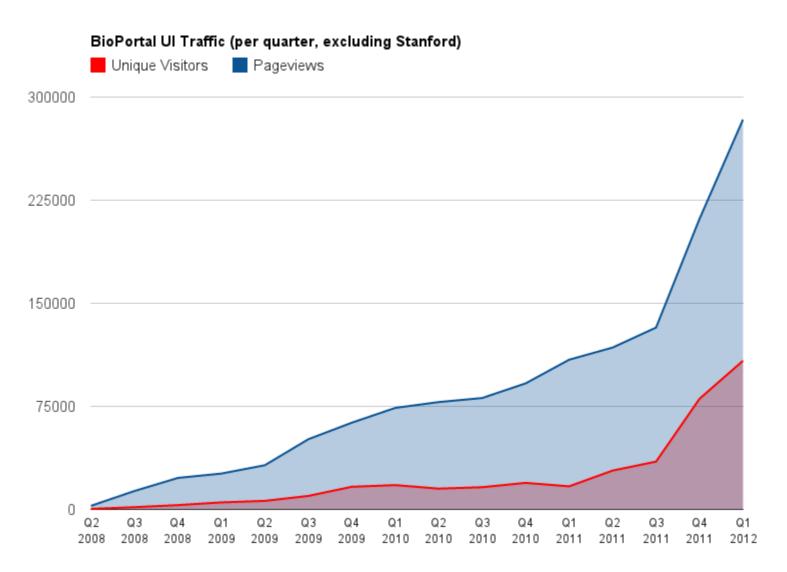
### **BioPortal Ontology Repository**

O BioPortal Browse	Search Mappings	Recommender Annotator	r Resource Index	Projects	Sign In Help Feedbac
Welcome to BioPortal! To learn how to	o use the application, here o	or elsewhere, click on this icon:	?		Follow Cbicontology · 302 followers
Search all ontologies Enter term, e.g. Melanoma Advanced Search	Search	Find an ontology Enter ontology name, e.g. <u>Browse Ontologies &gt;</u>	NCI Thesaurus	plore	Search resources Enter a term, e.g. Melanoma Advanced Resource Search
Most Viewed Ontologies (August, 201	11)	Latest Notes			Latest Mappings
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SNOMED Clinical Terms	3145				2 (HOM-DATASOURCE_EPIC) => Deceased (HOM-EPIC)
<u>MedDRA</u>	1913	Re: Why have you depreca Resource Ontology) 2 mor This term was deprecated	nths ago by whetzel		BioPortal UI 10/05/11 KettyMobed
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http://bioportal.bioontology.org



### **BioPortal Traffic – Volume**





#### Annotator

Get annotations for biomedical text with terms from the ontologies 📄

insert sample text

Cyclic nucleotide phosphodiesterases (PDEs) are enzymes that regulate the cellular levels of the second messengers, cAMP and cGMP, by controlling their rates of degradation. There are 11 different PDE families, with each family typically having several different isoforms and splice variants. These unique PDEs differ in their three-dimensional structure, kinetic properties, modes of regulation, cellular expression, and inhibitor sensitivities. Current data suggest that individual isozymes modulate distinct regulatory pathways in the cell.

#### Select Ontologies

 GO ×
 clear selection select from list

 Select UMLS Semantic Types
 select from list

 Type here to select UMLS semantic types
 Include Mappings: Automatic Image: Manual

 Include Ancestors Up To Level:
 All 🛟

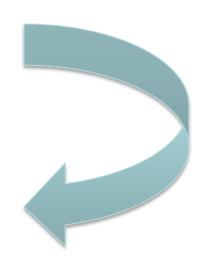
**Get Annotations** 

#### Annotator

Get annotations for biomedical text with terms from the ontologies 📄

insert sample text

Cyclic nucleotide phosphodiesterases (PDEs) are enzymes that regulate the cellular levels of the second messengers, cAMP and cGMP, by controlling their rates of degradation. There are 11 different PDE families, with each family typically having several different isoforms and splice variants. These unique PDEs differ in their three-dimensional structure, kinetic properties, modes of regulation, cellular expression, and inhibitor sensitivities. Current data suggest that individual isozymes modulate distinct regulatory pathways in the cell.

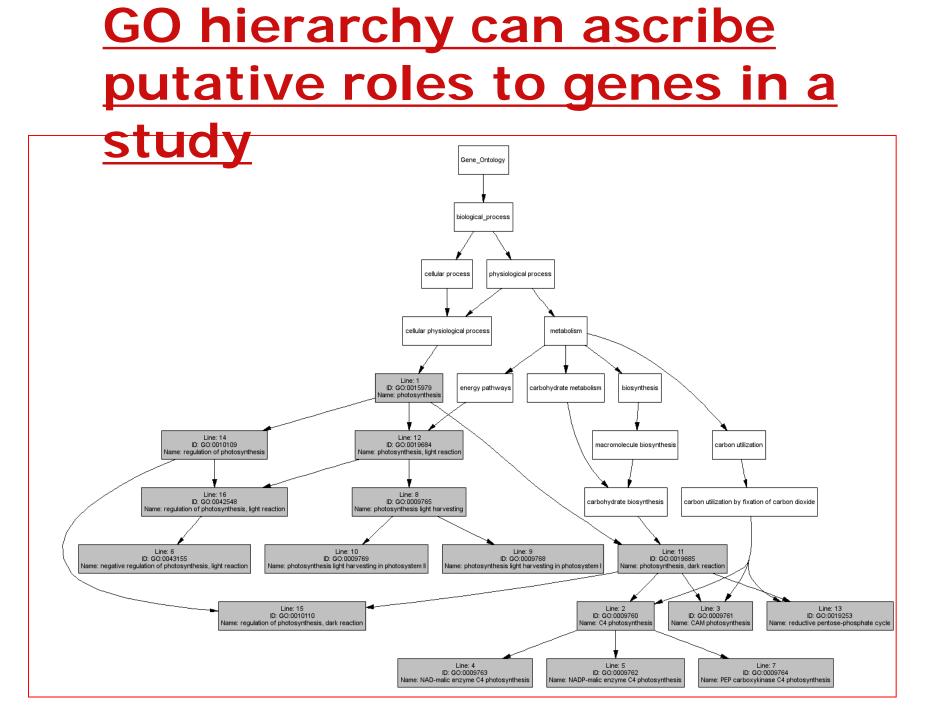


#### Get Annotations

#### Annotations

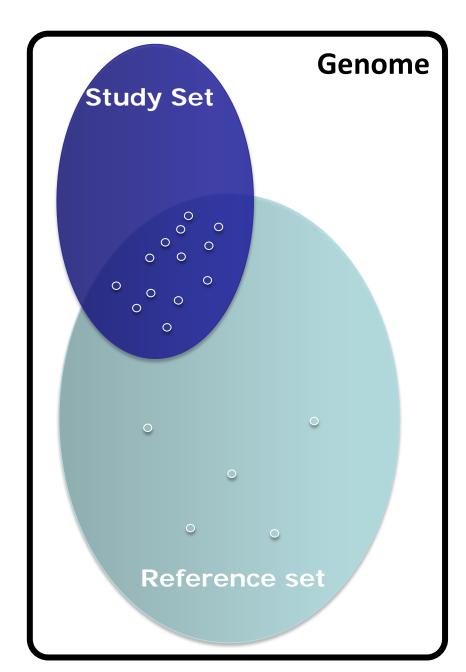
total results 5 (direct 2 / ancestor 3

TERM <u>filter</u>	ONTOLOGY <u>filter</u>	TYPE <u>filter</u>	CONTEXT	MATCHED TERM filter	MATCHED ONTOLOG
<u>cell</u>	Gene Ontology	direct	regulatory pathways in the cell	<u>cell</u>	Gene Ontology
metabolic process	Gene Ontology	ancestor	controlling their rates of degradation. There are 11 different	catabolic process	Gene Ontology
cellular_component	Gene Ontology	ancestor	regulatory pathways in the cell	<u>cell</u>	Gene Ontology
catabolic process	Gene Ontology	direct	controlling their rates of degradation. There are 11 different	catabolic process	Gene Ontology
biological_process	Gene Ontology	ancestor	controlling their rates of degradation. There are 11 different	catabolic process	Gene Ontology

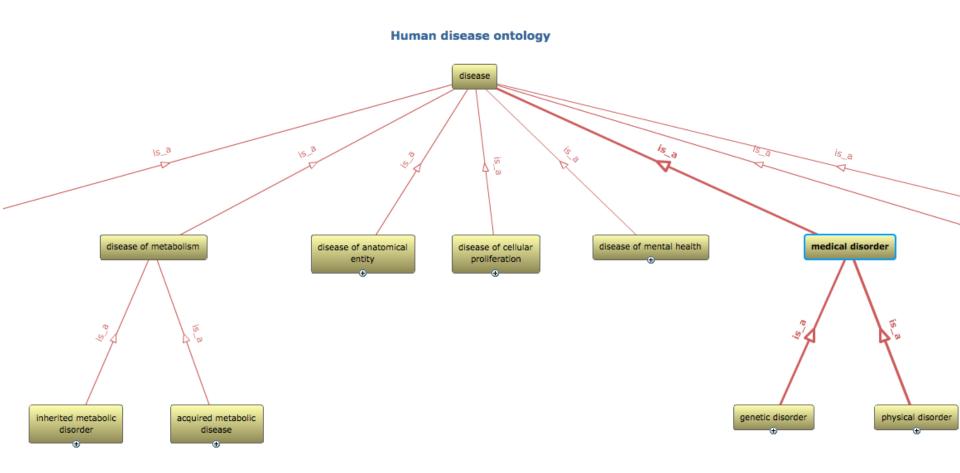


### <u>GO-based</u> <u>"enrichment</u> <u>analysis"</u>

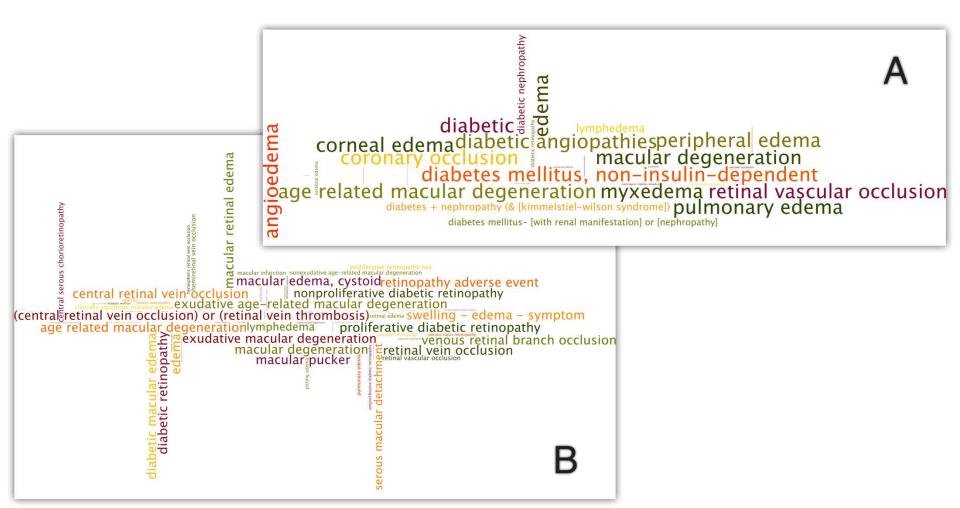
- 1. Get annotations for each gene in a set
- 2. Count the occurrence of each annotation term in the study set
- 3. Count the occurrence of that term in some reference set (whole genome?)
- 4. p-value for how surprising their overlap is



# Suppose one had an ontology of diseases and some EHR data ...



### Shah et al. perform "enrichment analysis" on textual progress notes (in this case, for "Avastin")



# Thank you

For information contact Peter Lyster, Chair of the NIH Common Fund National Centers for Biomedical Computing Project Team

Iysterp@mail.nih.gov 301.451.6446

or visit the consortium web site

http://www.ncbcs.org/