



The Department of Computer Science at Columbia University

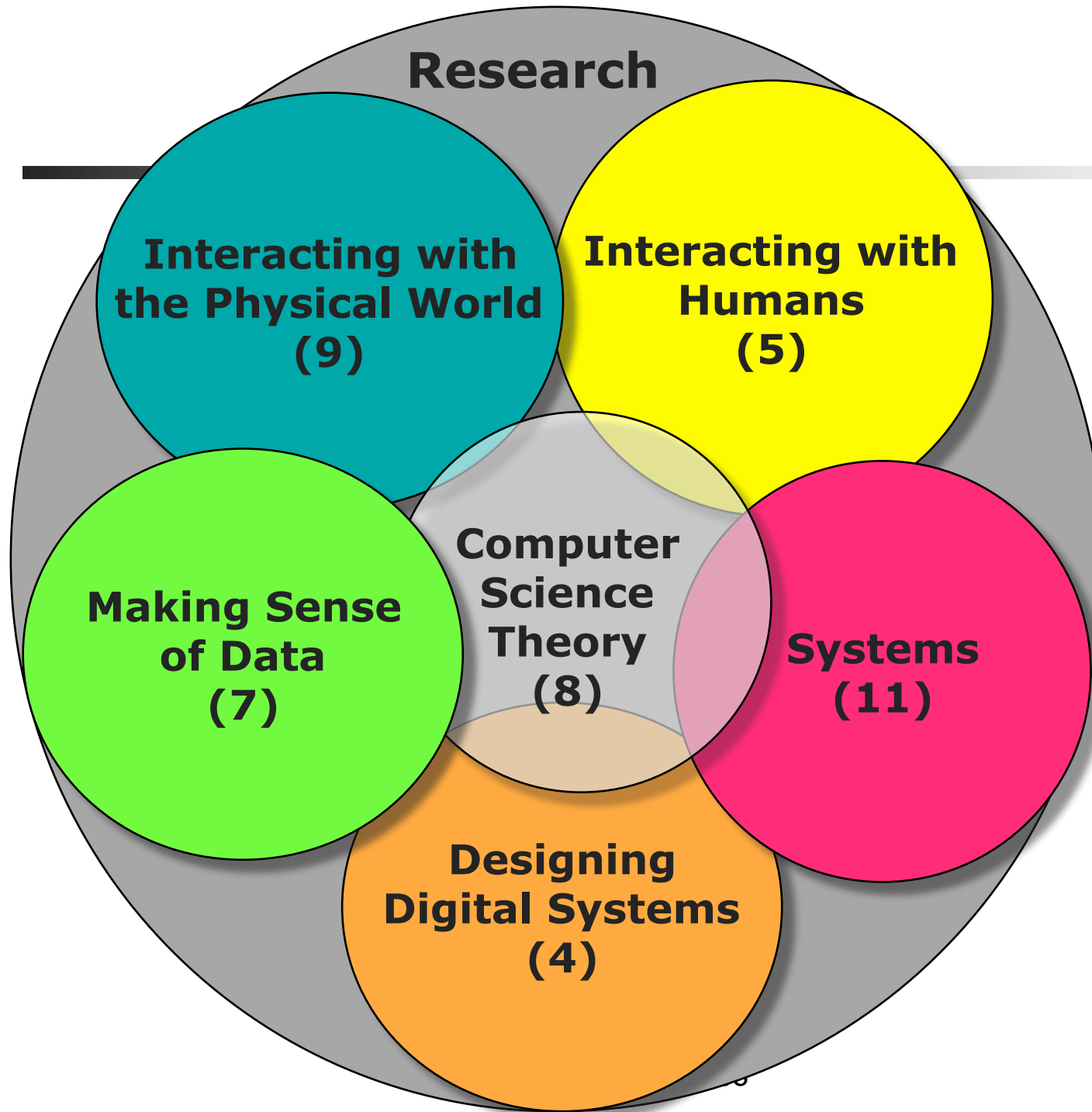
Henning Schulzrinne, Chair
Dept. of Computer Science
Columbia University
2008

Columbia Computer Science in Numbers

- ~34 full-time faculty and lecturers
 - + visitors, postdocs, adjunct faculty, joint appointments (EE, IEOR), ...
- 103 PhD students (13 new arrivals)
- ~200 MS students (137 new arrivals)
- 60 CS + CE undergraduate juniors & seniors

Faculty: 35 (33 tenure track, 1 lecturer, 1 joint)

 Aho	 Allen	 Belhumeur	 Bellovin	 Cannon	 Carloni	 Edwards	 Feiner	 Grinspun
 Gravano	 Gross	 Hirschberg	 Jebara	 Kaiser	 Kender	 Keromytis	 Malkin	 McKeown
 Misra	 Nayar	 Nieh	 Nowick	 Pe'er	 Ramamoorthi	 Ross	 Rubenstein	 Schulzrinne
 Servedio	 Stolfo	 Stein *	 Traub	 Wozniakowski	 Yang	 Yannakakis	 Yemini	



Research areas

Interacting with the Physical World	<i>graphics, robotics, vision</i>	<i>Allen, Belhumeur, Feiner, Grinspun, Grunschlag, Jebara, Kender, Nayar, Ramamoorthi</i>
Interacting with Humans	<i>user interfaces, natural language and speech processing, collaborative work, personalized agents</i>	<i>Feiner, Hirschberg, Kaiser, Kender, McKeown</i>
Systems	<i>networks, distributed systems, security, compilers, software engineering, programming languages, OS</i>	<i>Aho, Bellovin, Edwards, Kaiser, Keromytis, Malkin, Misra, Nieh, Schulzrinne, Stolfo, Yang, Yemini</i>
Designing Digital Systems	<i>digital and VLSI design, CAD, asynchronous circuits, embedded systems</i>	<i>Carloni, Edwards, Nowick, Sethumadhavan</i>
Making Sense of Data	<i>databases, data mining, Web search, machine learning applications, computational biology</i>	<i>Cannon, Gravano, Jebara, Kaiser, Pe'er, Ross, Servedio, Stolfo</i>
Computer Science Theory	<i>cryptography, quantum computing, complexity, machine learning theory, graph theory, algorithms</i>	<i>Aho, Galil, Gross, Malkin, Servedio, Traub, Wozniakowski, Yannakakis</i>

CCLS: A Research Center in CS



The Center for Computational Learning Systems (CCLS) aims to be a world leader in learning and data mining research and the application of this research to natural language understanding, the World Wide Web, bioinformatics, systems security and other emerging areas. CCLS will emphasize interdisciplinary efforts with other departments at Columbia, and will leverage Columbia's CS Department's strengths in learning, data mining and natural language processing, extending the effective size and scope of the Department's research effort.



Research

**Making Sense
of Data
(7)**

Columbia's Database Group

<http://www.cs.columbia.edu/database>

Databases, data mining,
information retrieval, web search

Faculty

Luis Gravano

Ken Ross

Mihalis Yannakakis

Ph.D. Students

John Cieslewicz

Wisam Dakka

Alpa Jain

Julia Stoyanovich



Some Projects in Gravano's "Subgroup" <http://www.cs.columbia.edu/~gravano>

- Snowball, an information-extraction system
<http://snowball.cs.columbia.edu>
- QProber, a system for classifying and searching "hidden-web" databases
<http://qprober.cs.columbia.edu>
- SDARTS, a protocol and toolkit for metasearching/distributed information retrieval
<http://sdarts.cs.columbia.edu>
- RANK: "top- k " query processing
<http://rank.cs.columbia.edu>

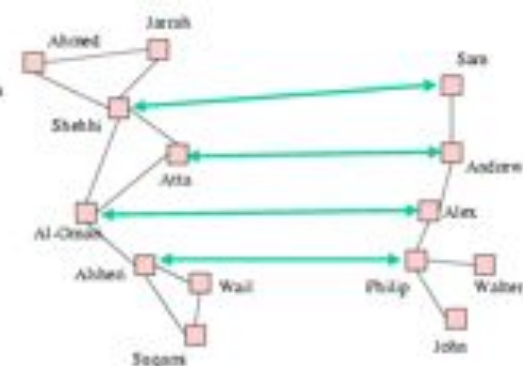
Machine Learning Lab

- Prof. Tony Jebara www.cs.columbia.edu/learning
- Computational statistics and algorithms for finding patterns in data and making predictions
- Theme: how to extend statistics to novel, multidimensional and structured data
- Data: images, text, time series, social nets



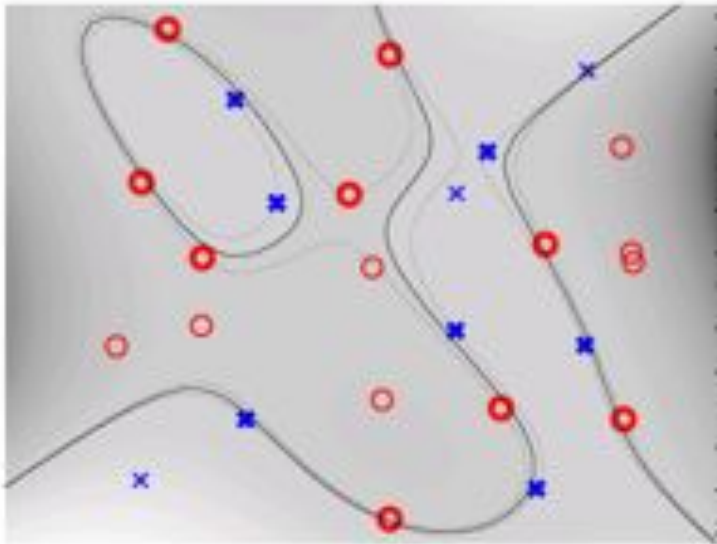
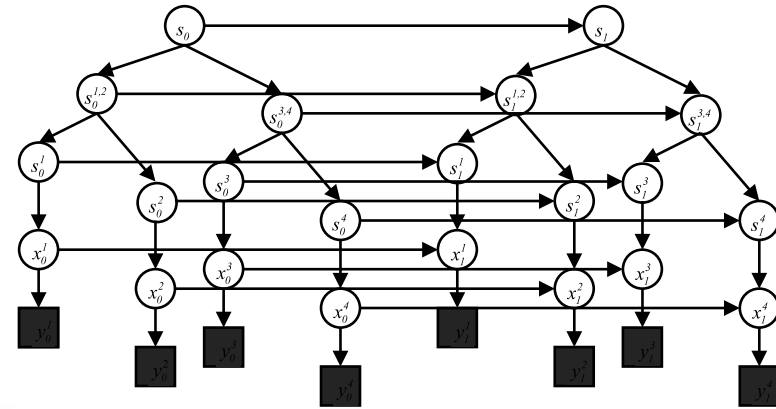
The man had ~~brown~~ eyes and short ~~black~~ hair. He had a thick voice and spoke with a ~~Romanian~~ accent. Mentioned having visited ~~Moscow~~ last year and purchased some fine ~~tapestries~~. He was ~~thin~~ and ~~fidgety~~. He was leaving for ~~London~~ in a few days.

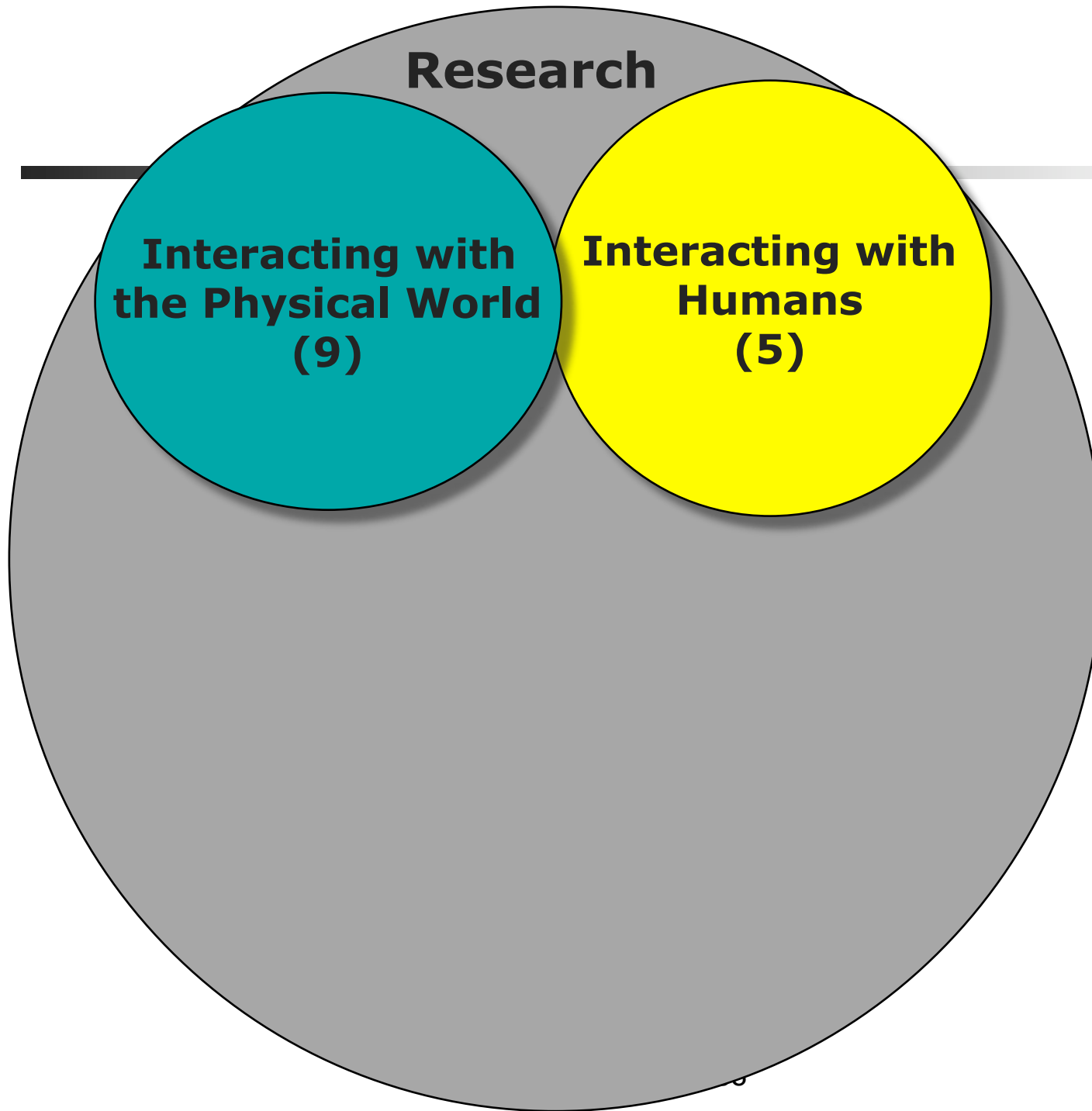
Male on a flight from ~~Laguaidia~~ to ~~Heathrow~~. Light build, 5' ~~10~~ tall, dark ~~features~~. Heavy ~~Eastern European~~ accent. Profession: import and sale of luxury goods.

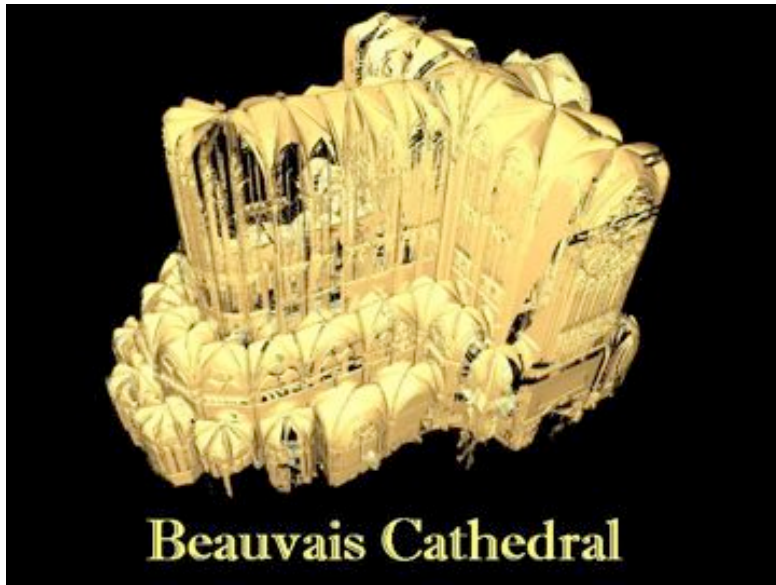


Machine Learning Lab

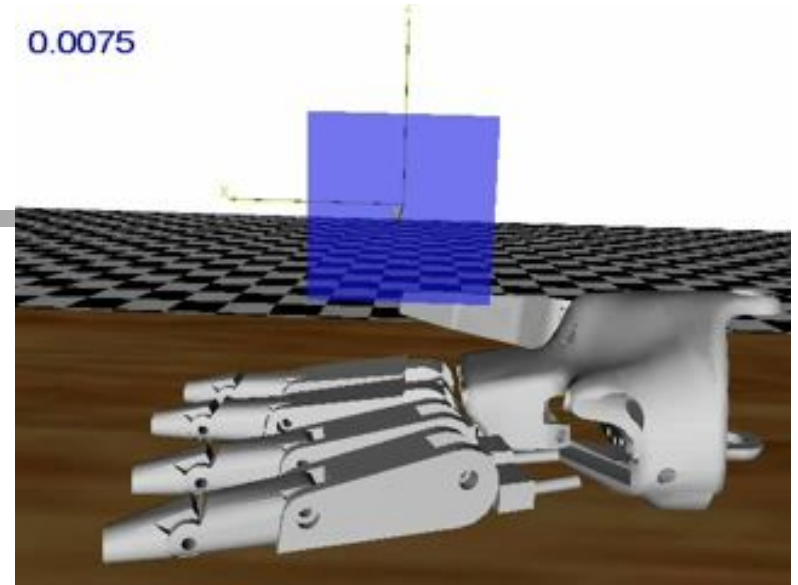
- Tools: Bayes Nets, Support Vector Machines, Representation, Invariance





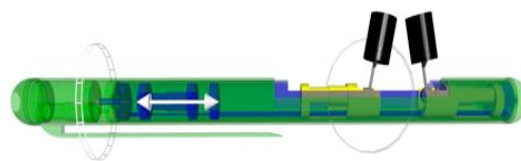
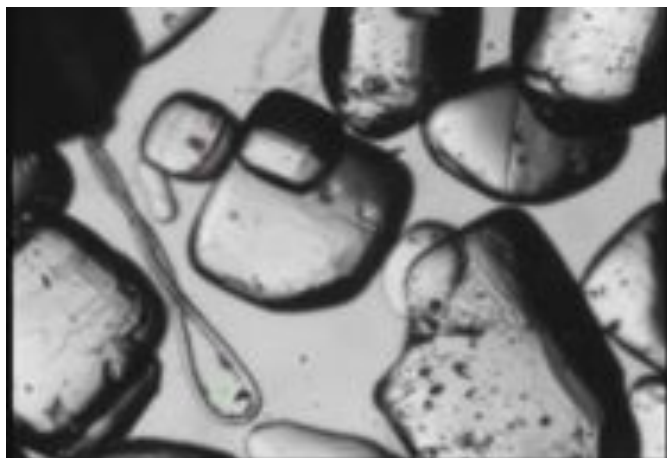
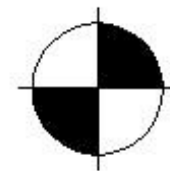


3-D Site Modeling



Graspit!
Simulator

Columbia University
Robotics Group

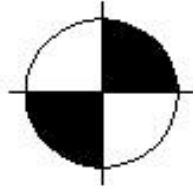


Robotic Crystal Mounting



Mobile Robotics





■ **Current Projects:**

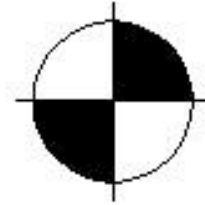
1. 3-D Modeling: Combining laser scanning and computer vision to create photorealistic models. Current NSF ITR project includes scanning Beauvais Cathedral in France and ancient ruins in Sicily
2. Robotic and human hand simulation using our Graspit! simulator which includes full dynamics, grasp quality measures, and grasp learning
3. Microscale protein crystal mounting using visual control. Microscope camera used to track/pick up very small crystals for x-ray diffraction
4. AVENUE mobile scanning robot: automating the site modeling process using GPS, wireless network, computer vision and range scanning
5. New insertable stereo cameras with pan, tilt and translation for minimally-invasive surgery

■ **People:**

Postdocs: Atanas Georgiev and Andrew Miller

GRA's: Paul Blaer, Alejandro Troccoli, Ben Smith

M.S.: Rafi Pelosoff, Alex Haubald



Goal: Creating intelligent machines and systems

Collaborative Research:

- Molecular Biology (crystal mounting)
- Art History (3D Modeling)
- Biomechanics (human hand simulation)
- Surgery (next-generation surgical imaging)

One of the labs affiliated with CVGC (Columbia Vision and Graphics Center)

Research opportunities include a wide range of software, hardware and systems projects.

Expertise in robotics, graphics, or vision is helpful



COMPUTER SCIENCE AT
COLUMBIA UNIVERSITY

Insertable Imaging and Effector Platforms for Robotic Surgery

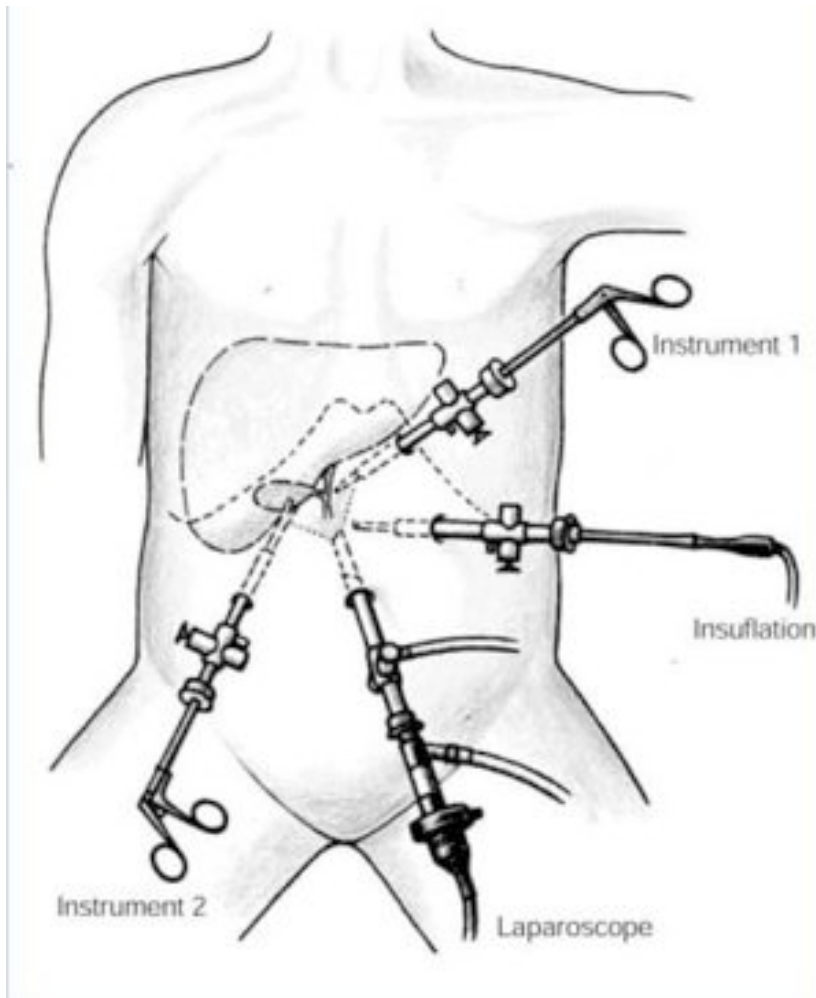
Peter Allen

Dennis Fowler (Dept. of Surgery)

Andrew Miller

<http://www.cs.columbia.edu/robotics>

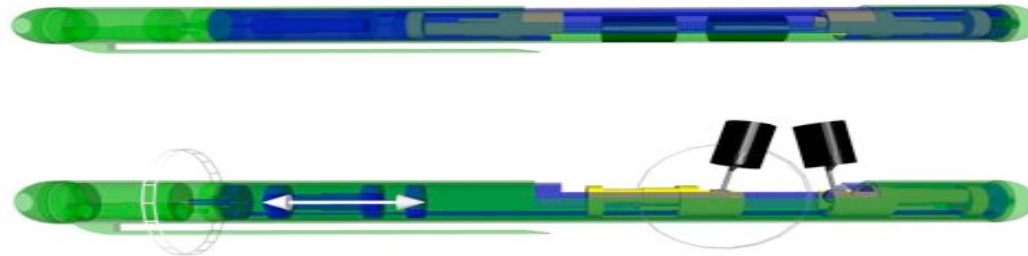
Current Laparoscopic Paradigm



- Multiple holes/insertion points
- Ports needed for each camera, instrument involved
- Limited range of motion at incision
- Pushing long sticks into small openings is still the idea!!!
- Assistant(s) needed to control camera
- Monocular viewing
- Works well - but can we do better?

Next Generation Imaging Device

- Insertable unit
- 5 Degrees-of-freedom: 2 pan, 1 tilt, 2 translate
- Stereo Cameras
- More mobility for imaging
- Frees up incision port for other tooling

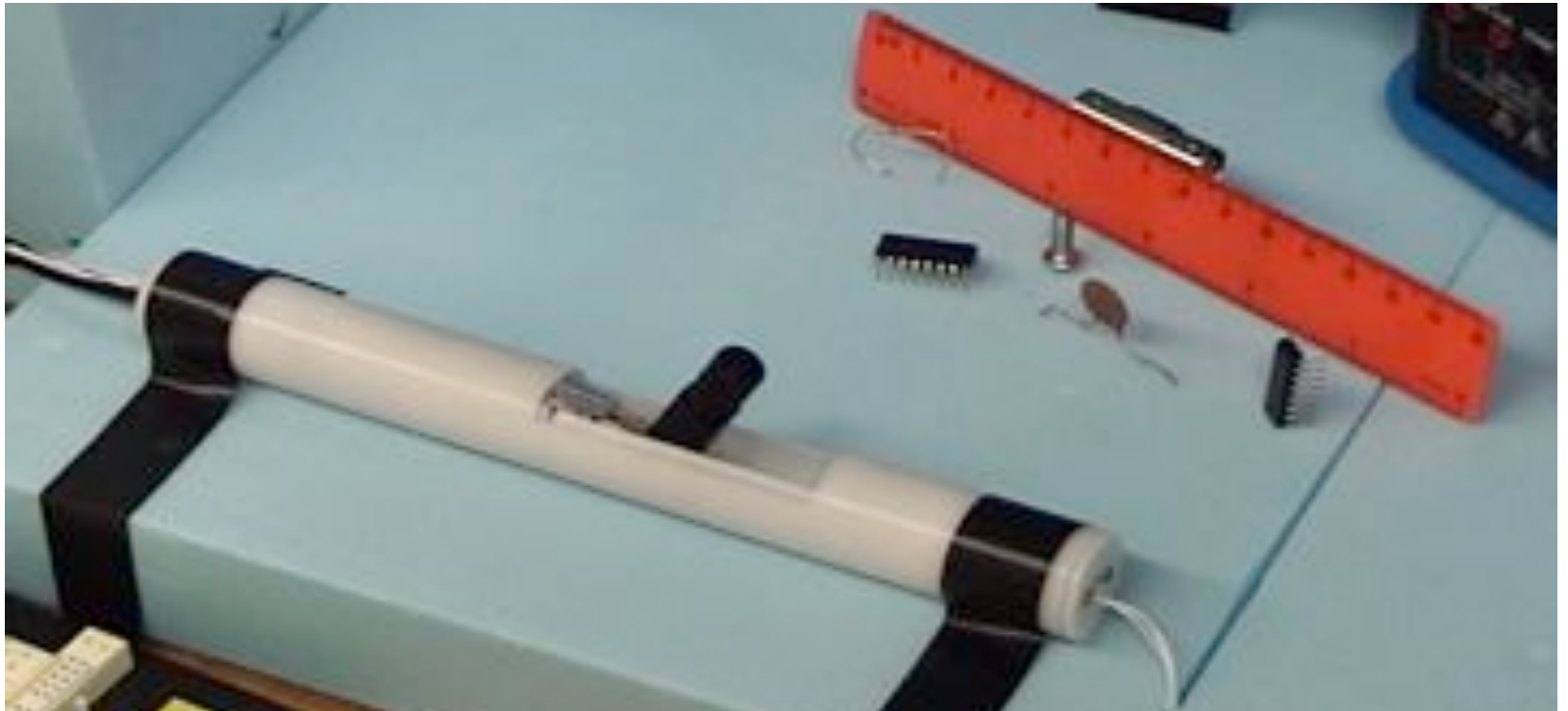


Single Camera Prototype

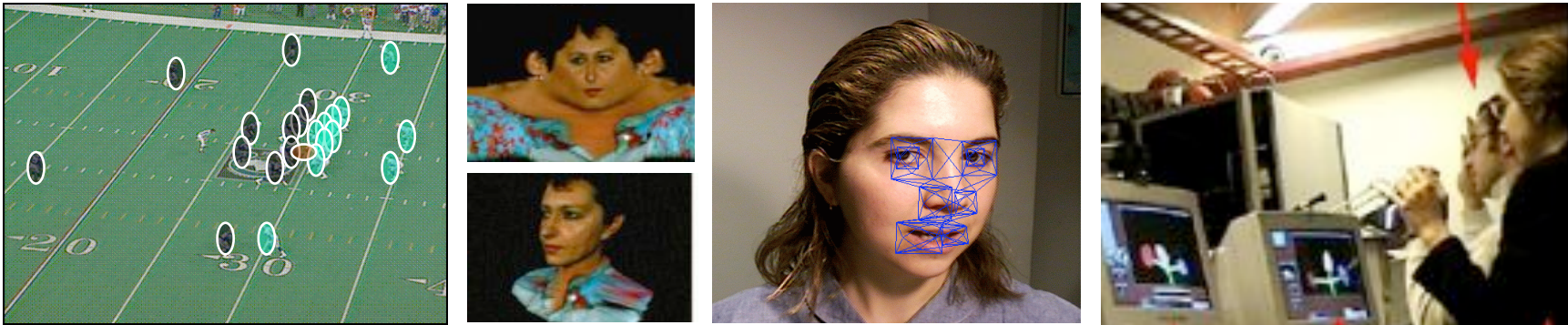
Diameter: 18mm; Length: 19cm

Camera opening: 5.8cm

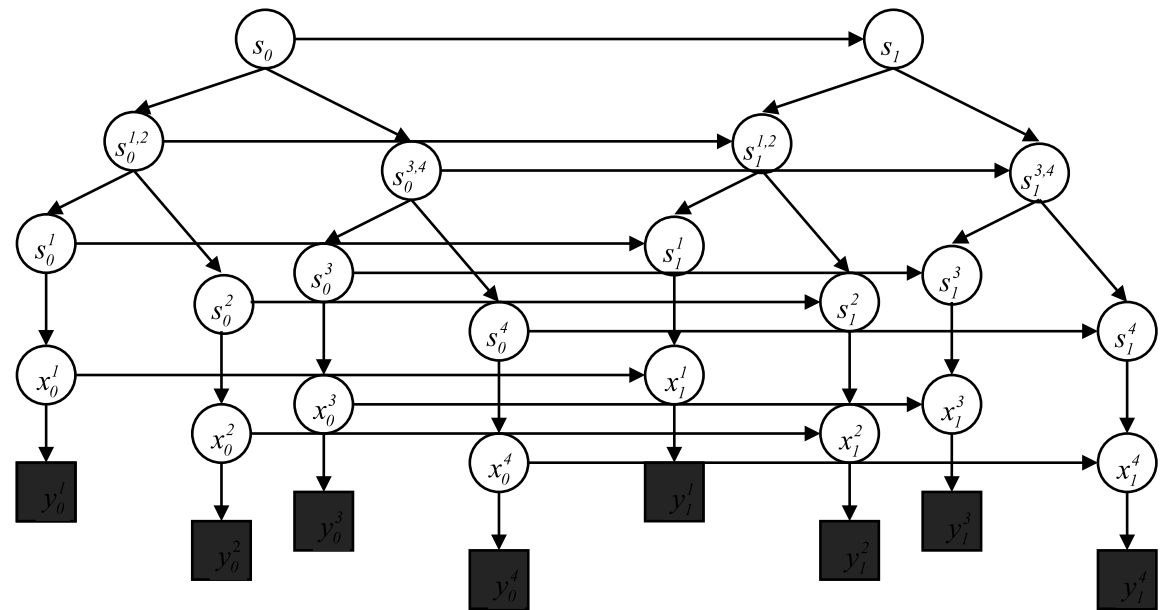
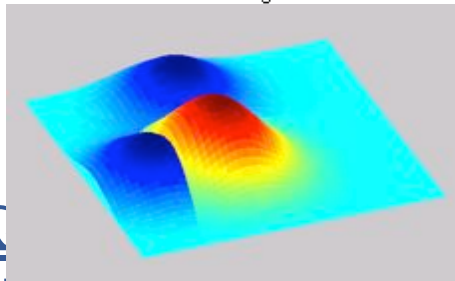
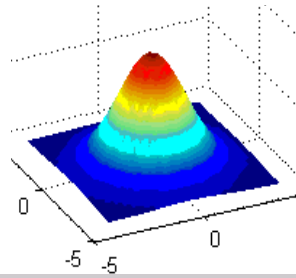
Pan: 120° ; Tilt: 130° ; Translation: 5cm



Computer Vision, Tracking People and Understanding Video



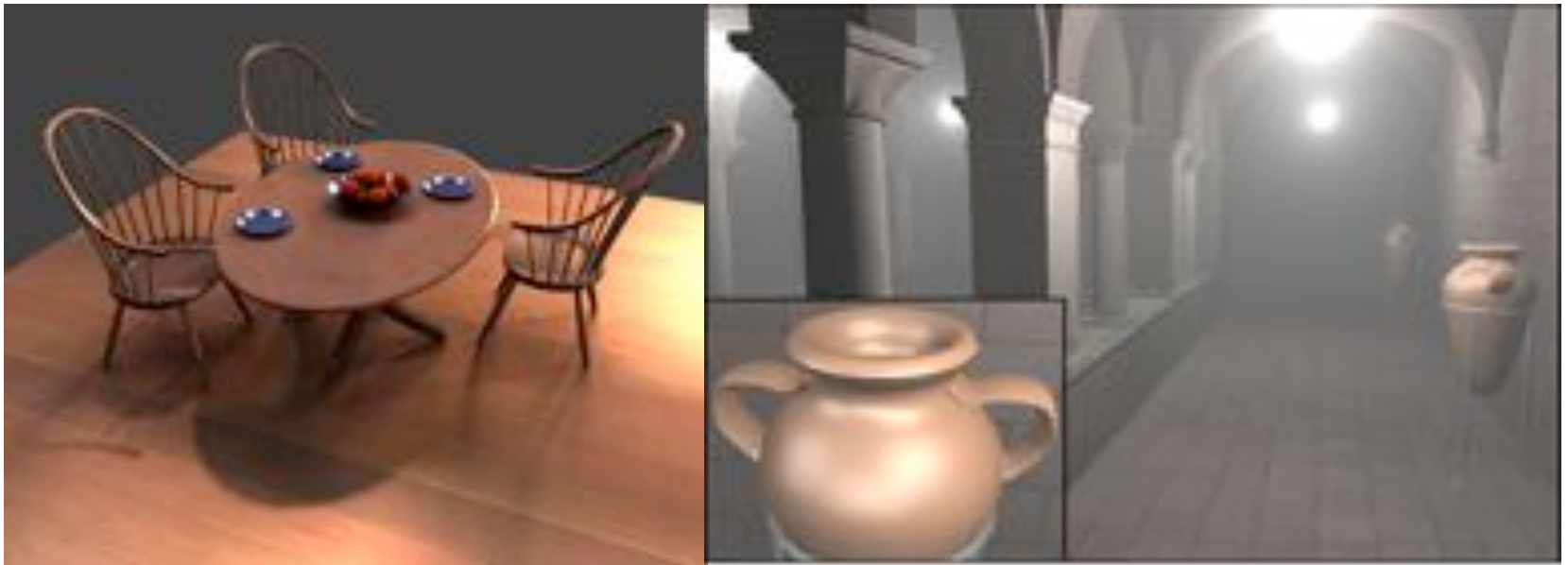
Discriminative Graphical Models



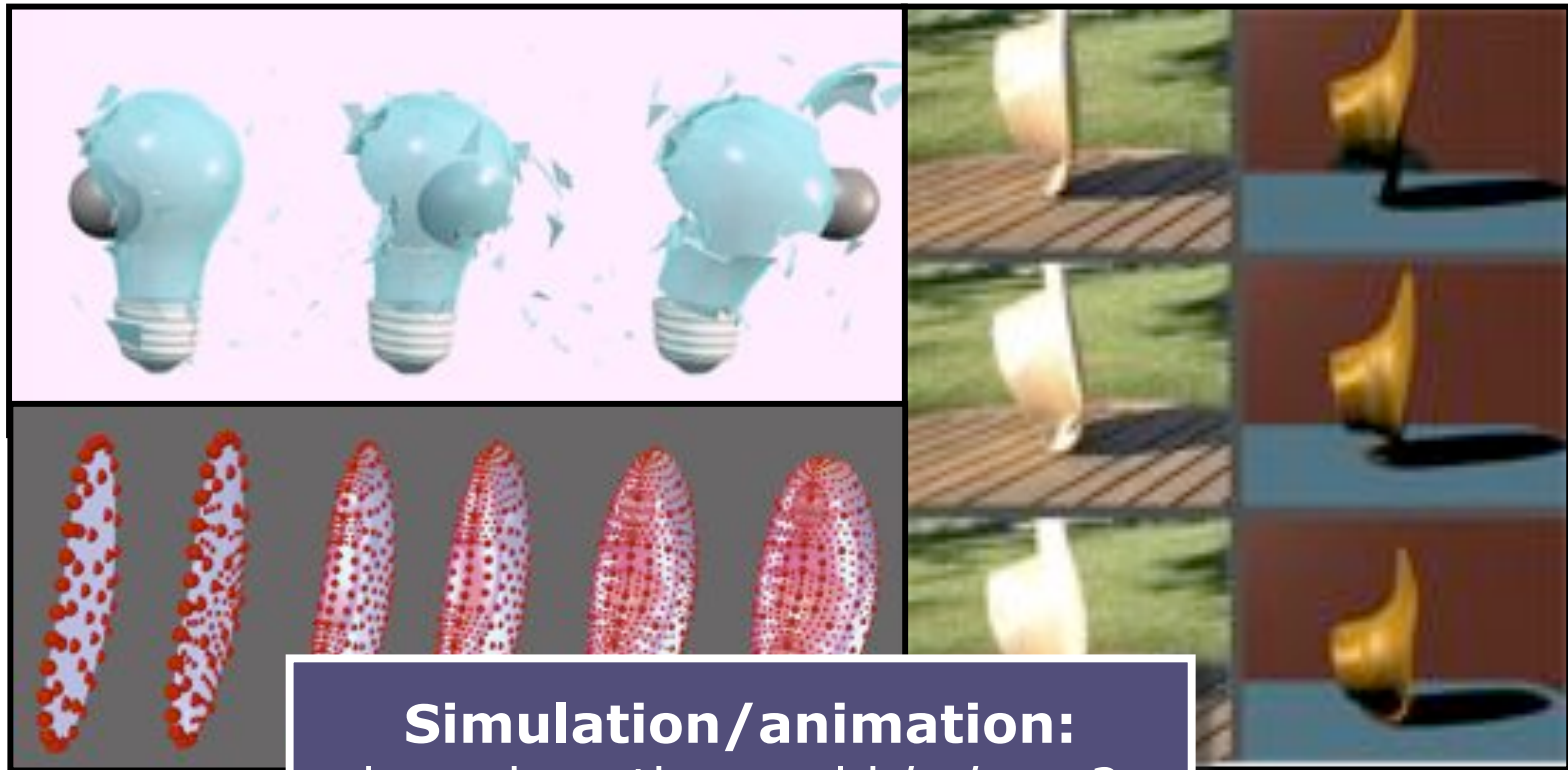
CS overview - Fall 2008

Computer Graphics Group

- Profs. Grinspun & Ramamoorthi
- Fundamental methods and math

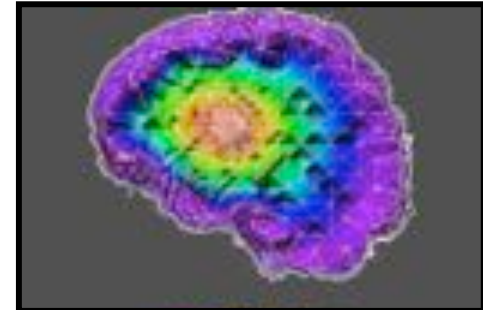
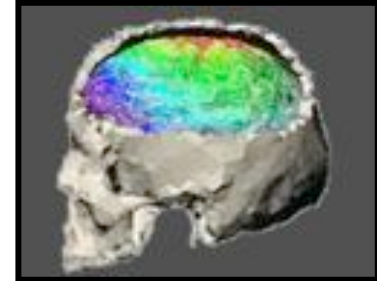


Computer Graphics Group



Simulation/animation:
how does the world *behave*?

Computer Graphics Group



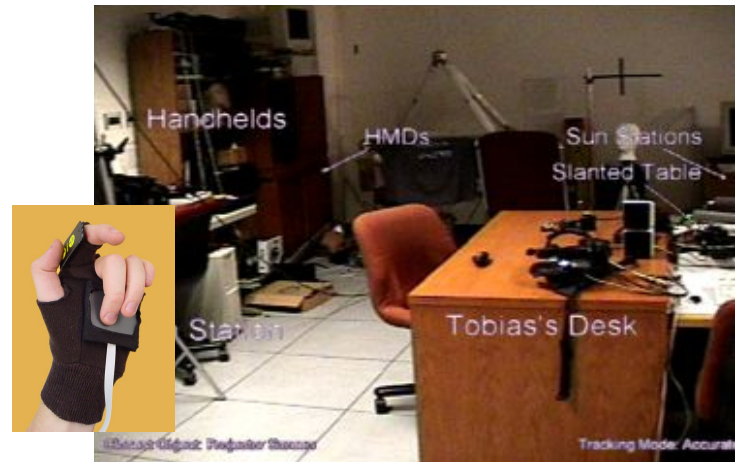
geometric modeling:
representing and computing on geometric objects

Computer Graphics and User Interfaces Lab

S. Feiner, H. Benko, G. Blaskó, S. Güven, D. Hallaway,
E. Ishak, S. White



- Wearable UIs
- Augmented reality
- Virtual reality



CS overview - Fall 2008

Computer Graphics and User Interfaces Lab

S. Feiner, H. Benko, G. Blaskó, S. Güven, D. Hallaway,
E. Ishak, S. White



- Automated generation of graphics
- Display layout
- Coordination with text generation

Catherine Miller

Age: 76
Gender: Female
MRN: 1010101

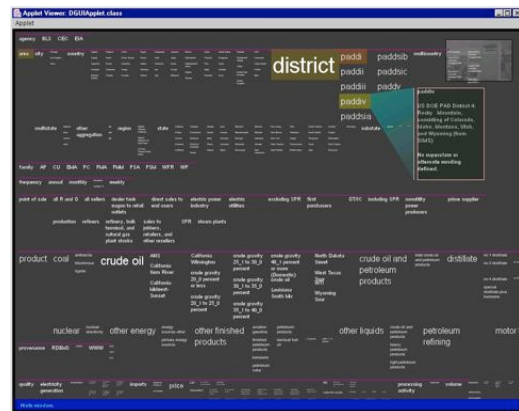
Operation: Tricuspid Valve Repair
Mitral Valve Replacement
Aortic Valve Replacement

MedHistory: moderate tricuspid regurgitation
stenosis
rheumatic heart disease

Surgeon: Jerome Green
Weight: 59 kg
Height: 164 cm

Swan-Ganz
Levophed: 20 cc/hr
Aprotinin: 25 cc/hr

Arterial



PERSONAL - AR - CGUI Lab - Columbia University

How is it treated?

By James Beckerman M.D. Bacterial endocarditis is an infection of the heart's inner lining (endocardium) or the heart valves.

a positive blood culture (doctor takes some blood and puts on a special plate; if bacteria grow on it, patient may have Endocarditis) a positive echocardiogram - a transmission of sound waves through the heart which produces an image of the functioning heart. Other tests:

echocardiography
one of the most widely used techniques in diagnosing heart disease because it is noninvasive, uses no x-rays, and provides excellent imaging.

endocarditis

Patients who already have some kind of heart problem have a greater risk. Endocarditis rarely occurs in people with normal hearts. IV Drug Users have a much higher risk of getting endocarditis. Some congenital cardiac defects, including a ventricular septal defect, an aortic septal defect or a patent ductus arteriosus, can be successfully repaired surgically.

atrial septal defect
a hole between the two upper chambers of the heart

mitral valve prolapse
a condition in which the valve between the upper and lower chambers of the left side of the heart closes imperfectly.

If you've been told you have a congenital heart defect, a heart murmur, mitral valve prolapse or other heart valve problems, ask your doctor if you're at increased risk for bacterial endocarditis. The Council on Dental Therapeutics of the American Dental Association has approved the American Heart Association's statement as it relates to dentistry.

CS overview - Fall 2008



Research

**Interacting with
Humans
(5)**

Spoken Language Processing Lab

Who we are:

Julia Hirschberg, Stefan Benus, Fadi Biadisy, Frank Enos, Agus Gravano, Jackson Liscombe, Sameer Maskey, Andrew Rosenberg



What we do:

- *Recognize and generate different speaker states – emotions (anger, uncertainty 🗣️), charisma 🗣️🗣️, deception*
- *Summarize spoken ‘documents’*
- *Study spoken dialogue systems*
- *‘Translate’ prosody between English and Mandarin*

Research

**Systems
(11)**

Gail Kaiser: Programming Systems Lab

enable (vt) : to make possible, practical, or easy

PSL

PROGRAMMING SYSTEMS LAB
COLUMBIA UNIVERSITY

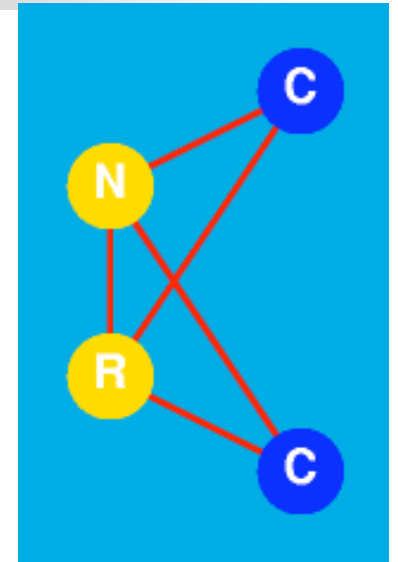
<http://www.psl.cs.columbia.edu/>

- Develop and empirically evaluate methodologies and technologies to enable "*better, faster, cheaper*" deployment and maintenance of large-scale software systems
- Seeking PhD, MS or advanced undergraduate students with substantial "real world" experience in any of compilers, operating systems, databases, computer security, networking, system administration
- Also seeking students interested in applied machine learning, power engineering, compbio (no experience required, just sincere interest)
- self-managing systems ("autonomic computing")
- software testing for emerging applications (e.g., for machine learning algorithms, bioinformatics databases, electrical distribution systems)
- novel architectures for special-purpose pub/sub event systems
- computer security
- software development environments and tools
- Multi-disciplinary projects



Networking research at Columbia University

- Columbia Networking Research Center
- spans EE + CS
- 15 faculty – one of the largest networking research groups in the US
- about 40 PhDs
- spanning optical networks to operating systems and applications
- theory (performance analysis) to systems (software, protocols)



Network Computing Laboratory

<http://www.ncl.cs.columbia.edu>

- Operating Systems
- Distributed Systems
- Scheduling and Resource Management
- Thin-Client and Network Computing
- Web and Multimedia Systems
- Performance Evaluation

Network Computing Laboratory

Recent Research Projects

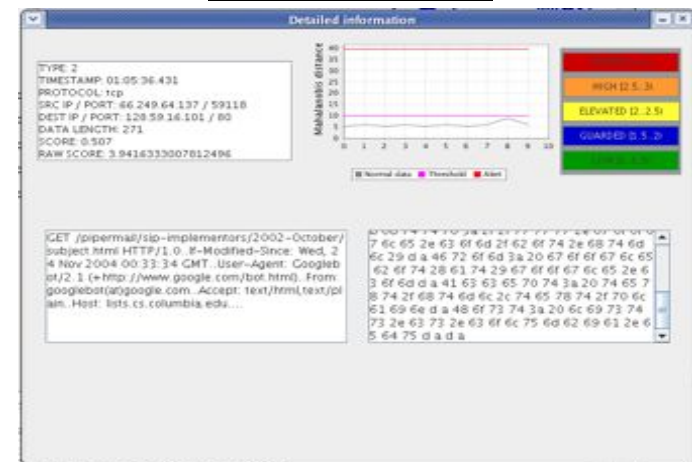
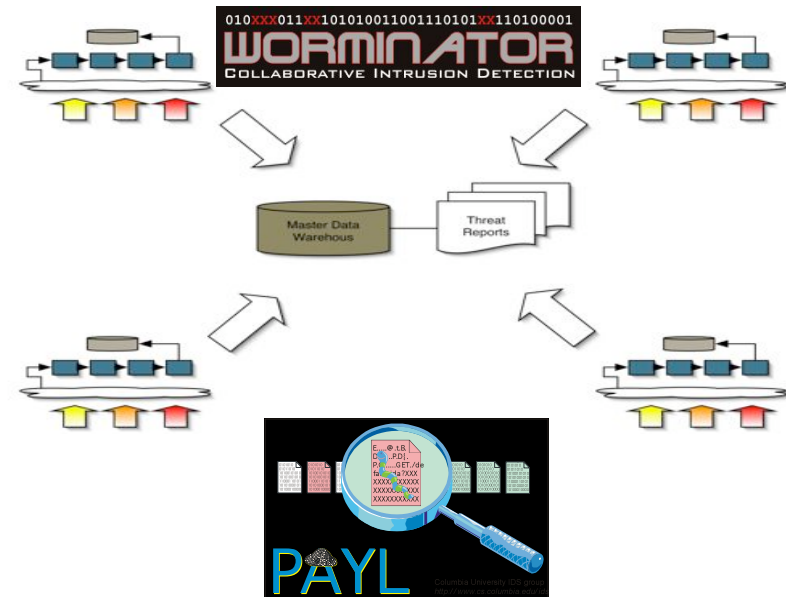
- Zap: Transparent process migration
- VNAT: Mobile networking
- GR3: $O(1)$ proportional share scheduling
- Thinc: WAN remote display protocol
- Certes: Inferring web client response times

Columbia Intrusion Detection Lab (Sal Stolfo)

- Attackers continue to improve techniques undeterred –
 - Present COTS security defenses are porous and suffer from the false negative problem
- There is no one monolithic security solution; security is a design criteria at all layers of the stack and across multiple sites
- Behavior-based computer security will substantially raise the bar
- Columbia conducts a broad spectrum of research related to securing critical infrastructure in close collaboration with industry and government with attention to practical and deployable results
- Visit: <http://www.cs.columbia.edu/faculty>
 - <http://www.cs.columbia.edu/ids>
 - <http://worminator.cs.columbia.edu>

Columbia Intrusion Detection Lab: Anomaly Detection for Zero-Day Attack

- **Worminator**
 - Cross Domain Security Alert Sharing infrastructure
 - Modeling of attacker intent, and precursors to attack
- **PAYL – Payload Anomaly Detection**
 - Behavior-based detection of “abnormal” traffic
 - Zero-day exploits detected in network packet data flows
- **EMT – Email Mining Toolkit**
 - Forensic analysis of email logs for profile and model generation
 - Comparison of profiles/models
 - Detect malicious users/groups and aliases



EMT: Email Mining Forensic Analysis

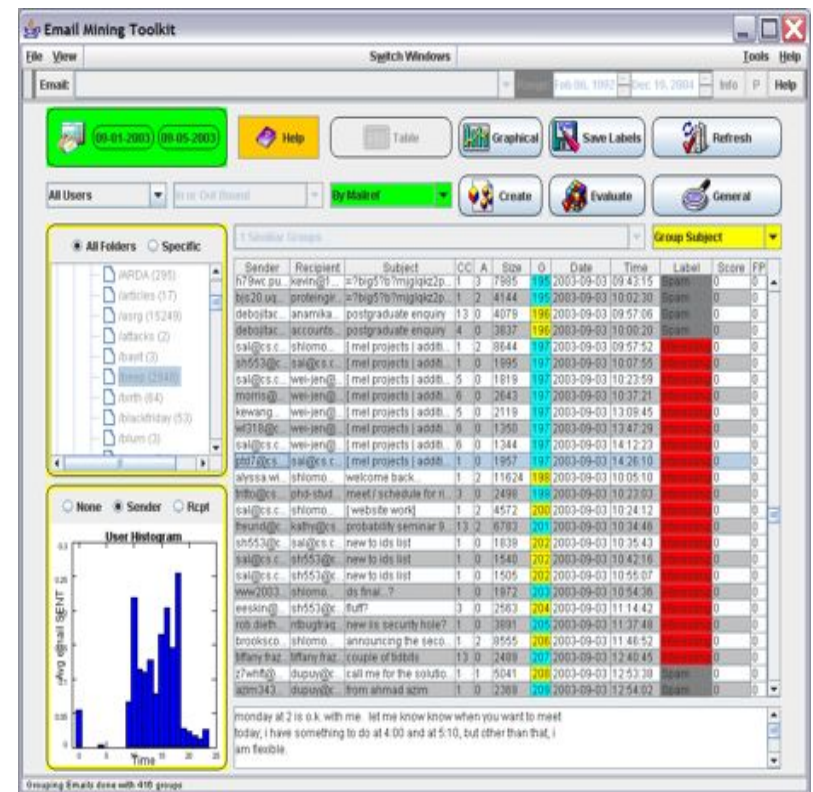
Prof Sal Stolfo
Columbia University
Computer Science Department

212.939.7080/sal@cs.columbia.edu

EMT Forensics

- Automatic system to acquire email data for study in a forensic environment
- Scalable to 100,000's of emails and attachments
- Automatically supports forensic tasks to be completed in seconds with analyst control over all variables and features
- Java-based application for email collection, analysis, and reporting in one integrated solution
- Pluggable architecture with API for easy customized extensions

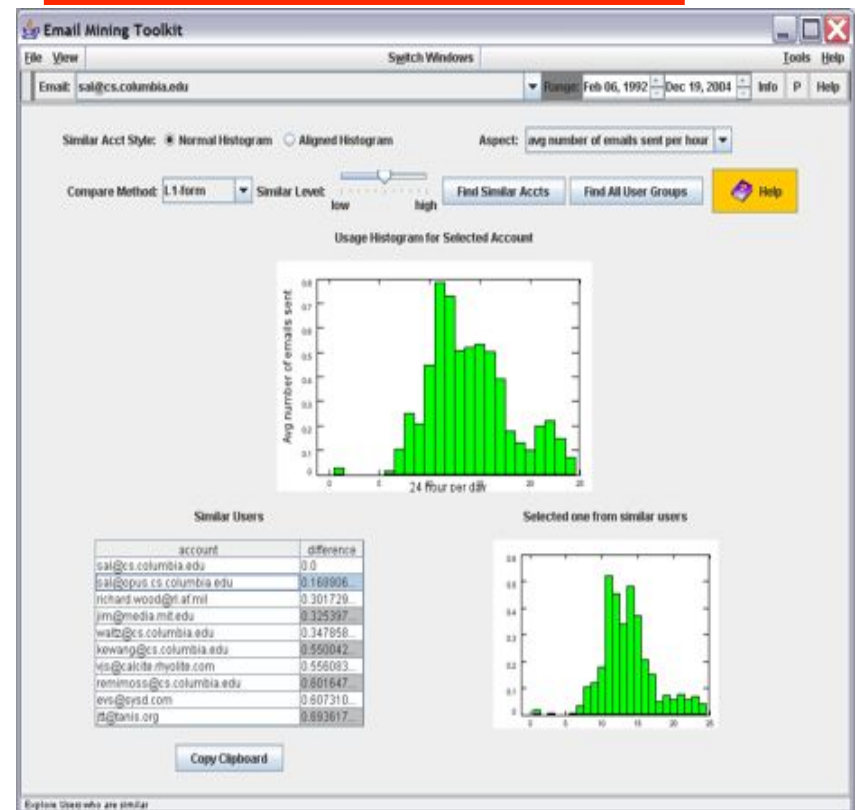
Main View of Email Archive



What might EMT do...

- Forensic analysis tasks for regulatory compliance
 - Which accounts are most important
 - Which accounts are behaving anomalously
 - Interesting behaviors between members of a social clique (clique violation or usage violation)
 - Who belongs to very many cliques

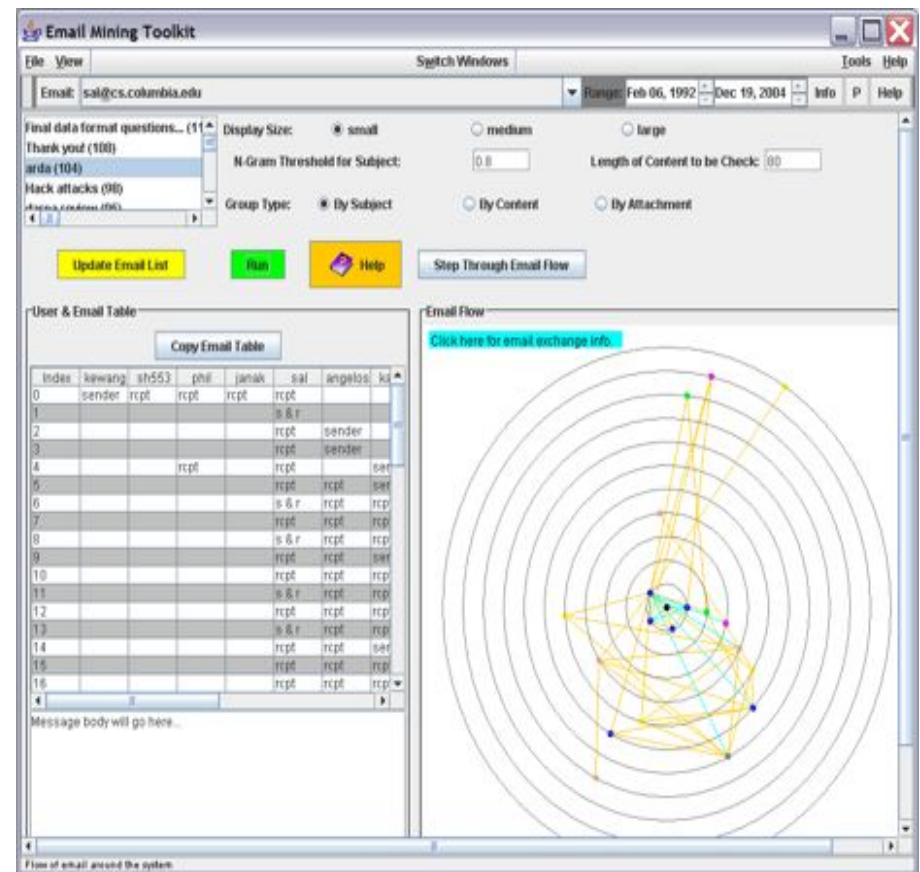
Who are the most important people in an organization and how do they behave?



What might EMT do...

- Managing organization information flow
 - Who communicates regularly with whom
 - Who has read my email
 - How does email flow through my organization

How does email flow over time?



Network Security Lab

Prof. Angelos D. Keromytis

- Applied research in security, networking, operating systems
 - Emphasis on systems and on building stuff
- Main research projects
 - Self-healing software and software security
- Application on countering network viruses/worms
 - Network denial of service
- Currently 6 Ph.D. students (Cook, Locasto, Burnside, Stavrou, Sidiroglou, Androulaki)
- Closely affiliated faculty: Stolfo, Bellovin, Ioannidis (CCLS), Yung

<http://nsl.cs.columbia.edu/>



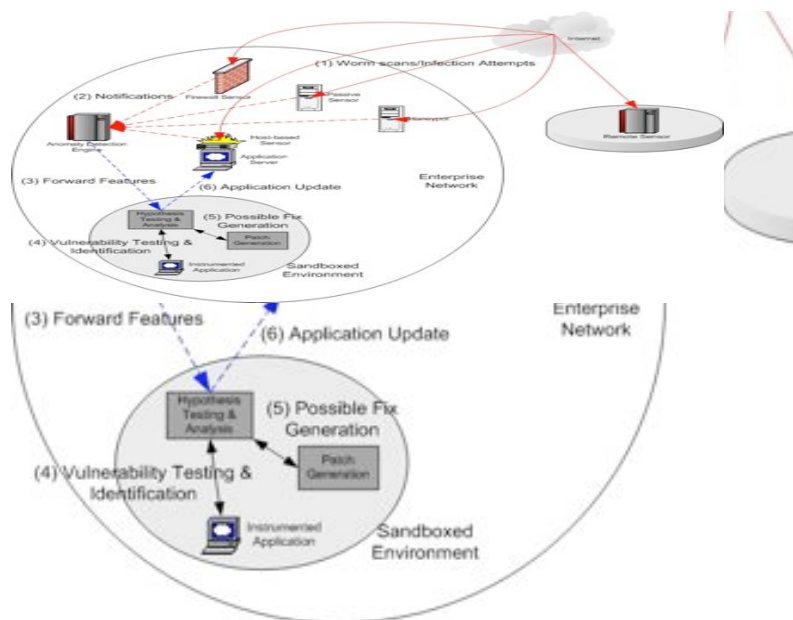
NSL Projects

- Self-healing software
 - Enable legacy software to learn from its failures and improve itself over time, without human intervention!
- Network Worm Vaccine
 - Limit worm infection rate via anomaly detection engine and automatic patching of vulnerable software, based on self-healing concepts
- Resilience Against Denial of Service Attacks
 - Use network overlays as a mechanism for separating good and “bad” traffic
- High-speed I/O: The Operating System As a Signaling Mechanism
 - New OS architecture - remove memory and CPU from data path
- Efficient Cryptography
 - Design and implementation of ciphers for specific environments - use of graphics cards, variable size block ciphers, IXP processor
- Collaborative Distributed Intrusion Detection
 - Identifying global attack activity as well as “low and slow” scans via shared intrusion alerts across administrative domains

Self-healing Software Systems

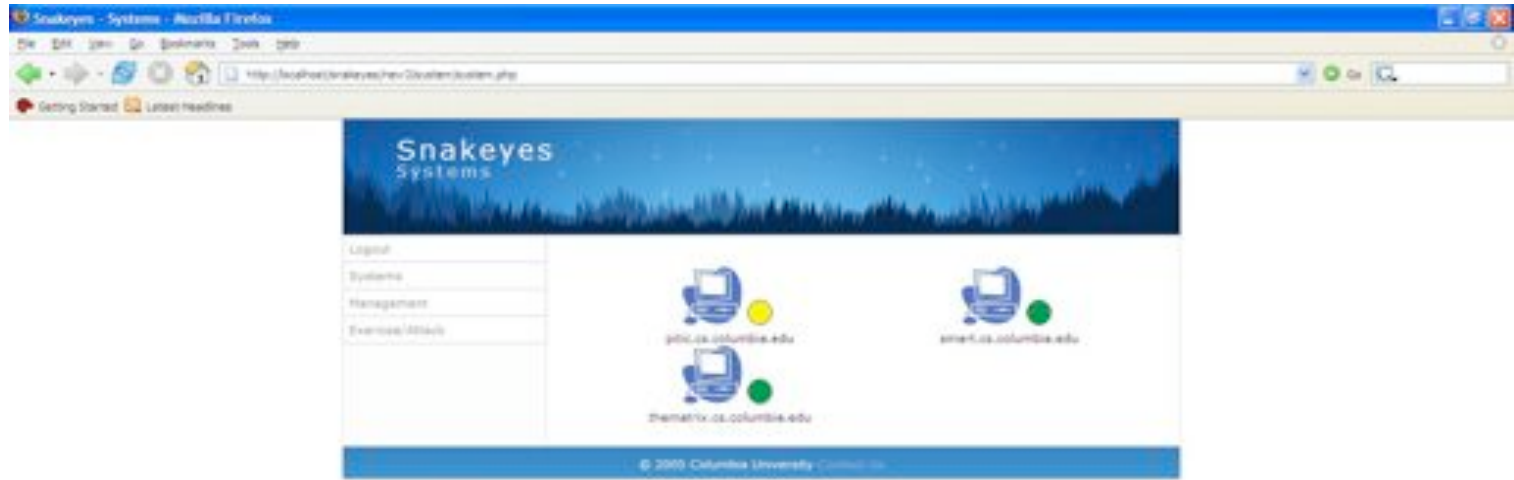
- Novel techniques for software that repairs its failures based on Observe-Orient-Decide-Act (OODA) loop
- Demonstrated concept with two experimental prototypes
 - One aimed at the problem of worms
 - One aimed at software survivability in general
- Application Communities: enable large numbers of identical applications to collaboratively monitor their health and share alerts
 - Software monocultures are useful!

Self-patching Architecture



- Systems approach to creating software that:
 - Detects new attacks/failures
 - Automatically generates and applies appropriate fixes
- Developed *error virtualization* as a generic “band-aid” technique
- Prototypes for open-source and binary-only environments
- Efficient security and high availability mechanism with little performance penalty
- Spin-off: Revive Systems Inc.

Network Worm Vaccine



Network Worm Vaccine

The screenshot displays the Snakeeyes web interface. The header includes the title "Snakeeyes" and the URL "View System: pitic.cs.columbia.edu". The left sidebar contains a navigation menu with sections: "Logged", "Systems", "Management", "Events/Attack", "IP address", "OS platform", "Parent level", "Services", and "Done". The main content area features a table with the following columns: "Start Time", "Service Attached", "Source IP", "Overall status", "Stage", and "Details".

Start Time	Service Attached	Source IP	Overall status	Stage	Details
2009-08-28 22:54:08	Service1	128.59.12.25	completed	dead	[icon]
2009-08-28 22:44:44	Service1	128.1.1.1	in process	patching	[icon]
2009-08-28 21:54:59	Service1	128.1.1.1	in process	detected	[icon]
2009-08-28 21:42:49	Service1	128.1.1.1	completed	wounded	[icon]
2009-08-28 21:41:34	Service1	128.1.1.1	completed	dead	[icon]
2009-08-28 18:36:53	Service1	128.1.1.1	completed	wounded	[icon]
2009-08-28 18:53:08	Service2	128.59.12.113	completed	wounded	[icon]
2009-08-28 18:57:33	Service1	128.59.12.25	completed	wounded	[icon]
2009-08-28 18:30:37	Service1	128.1.1.1	completed	wounded	[icon]
2009-08-28 17:34:08	Service1	128.59.12.113	completed	dead	[icon]
2009-08-25 15:24:21	Service1	128.59.12.25	completed	wounded	[icon]
2009-07-29 02:46:27	Service1	128.59.12.113	completed	wounded	[icon]
2009-07-28 23:09:40	Service1	128.59.12.113	completed	alive	[icon]
2009-07-28 17:02:01	Service1	128.59.12.113	completed	alive	[icon]
2009-07-28 17:00:29	Service1	128.59.12.113	completed	wounded	[icon]
2009-07-26 17:16:07	Service1	128.59.12.113	completed	dead	[icon]
2009-07-26 13:57:55	Service1	128.59.14.39	completed	alive	[icon]
2009-07-26 10:34:07	Service1	128.59.12.113	completed	dead	[icon]
2009-07-25 10:31:14	Service1	128.59.12.113	completed	dead	[icon]
2009-07-24 23:41:55	Service1	128.59.14.39	completed	dead	[icon]
2009-07-24 21:52:01	Service1	128.59.14.39	completed	dead	[icon]
2009-07-23 18:05:15	Service1	128.59.14.39	completed	dead	[icon]

Network Worm Vaccine



IRT real-time laboratory (IRT)

<http://www.cs.columbia.edu/IRT>

- Internet multimedia protocols and systems
 - Internet telephony signaling and services
 - application sharing, 911 systems
 - Ubiquitous communication
 - Peer-to-peer IP telephony
- Wireless and ad-hoc networks
 - VoIP hand-off acceleration
- Quality of service
 - multicast, scalable signaling, ...
- Service discovery and location-based services
- DOS prevention and traceback

Distributed Network Analysis (DNA)

Prof. Vishal Misra, Dan Rubenstein

- Expertise in mathematical modeling of communication/network systems
- Also do prototyping/experimentation to validate theory
- Topics:
 - Resilient and Secure Networking
 - Wireless (802.11, Mesh)
 - Sensor Networks
 - Overlay and P2P Networking
 - Server Farms
- Analytical Techniques
 - Stochastics
 - Algorithms
 - Control Theory, Queueing Theory, Information Theory
 - Whatever else might be needed...

Research

**Designing
Digital Systems
(4)**

Asynchronous Circuits & Systems Group

<http://www.cs.columbia.edu/~nowick>

- Prof. Steven Nowick (nowick@cs.columbia.edu)
- Research in *clockless* digital systems
 - Most digital systems are *synchronous* = have a global clock
 - Potential benefits of asynchronous systems:
 - Modular “plug-and-play” design: assemble components, no global timing concerns
 - Low power: no burning of clock power, components only activated on demand
 - High speed: not restricted by fixed clock speed
 - Challenges: new techniques needed
 - New “CAD” (computer-aided design) software tools to aid designers
 - New circuit design styles



Asynchronous Circuits & Systems Group

- CAD Tools:
 - Software tools + optimization algorithms
 - Allow automated 'push-button' circuit synthesis + optimization
 - For individual controllers (state machines), for entire systems (processors)
- Circuit Designs:
 - New techniques to design asynchronous circuits (adders, multipliers)
 - Interface circuits: for mixing synchronous + asynchronous subsystems
 - Very high-speed pipelines: several GHz

Designing Scalable and Robust Heterogeneous Computer Systems

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Scalable Heterogeneous Computer Systems (Prof. Nowick & Carloni)

Challenges in Future-Generation Computer Systems:

- System complexity (1 billion transistors/chip, multiple processors/chip), design time, lack of reusability
- Variability: large unpredictable communication delays, process variation, global clock distribution
- Lack of CAD tool support: system-level synthesis and optimization, performance analysis, verification
- Heterogeneous timing: robust interfacing of multiple-clock domains, mixed asynchronous/synchronous

1. CAD Tools/Design Methodologies for Asynchronous + Mixed-Timing Systems (Prof. Nowick)

- Provide complete asynchronous design tool suite
- Targeted for use in military & consumer electronics
- Some support for GALS (globally async/locally sync) and mixed-timing systems
- Tools for heterogeneous system-level performance analysis, automated partitioning and optimization

2. CAD Tools/Design Methodologies for “Latency-Insensitive” Synchronous Systems (Prof. Carloni)

- Develop methodology for “elastic” synchronous systems – robustly handle large communication delays
- Modular robust-by-construction assembly: synchronous computing nodes (with wrappers) + adaptable channels
- Communication structure: support dynamic variability, flow control
- Tool development: for synthesis and optimization, physical design

Research

**Computer
Science
Theory
(8)**

Tal Malkin: Cryptography

- Crypto group \subset Theory group \cap Secure Systems Lab
- Crypto = construct computation and communication efficient schemes maintaining desired functionality even in adversarial environment
 - (e.g., public key encryption, secure computation, authentication, contract signing, voting, e-commerce, ...)
- Motivation and Goals \leftarrow security, privacy, social, financial, political needs
- Solutions \leftarrow rigorous, theoretical approach
- Research themes:
 - Definitions (identify, conceptualize, formalize goals)
 - Protocol design (efficiency and provable security)
 - Foundations (complexity, assumptions, limits)
 - \rightarrow Search for both positive and negative results

Tal Malkin: Examples of Research Topics

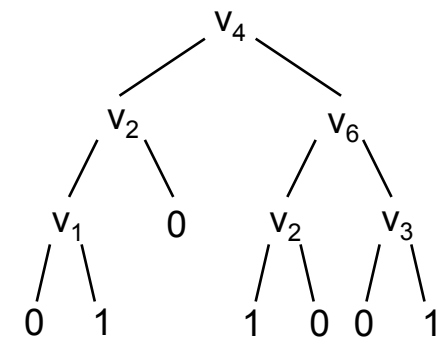
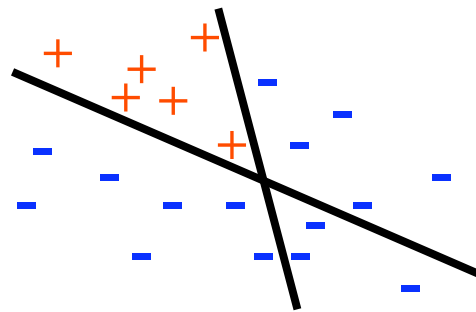
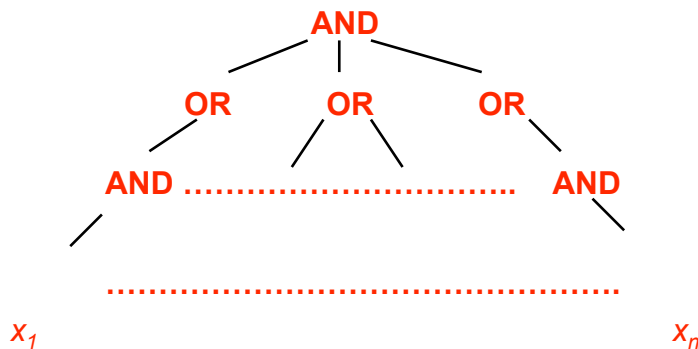
- Protecting against temporal or partial key exposure: key-evolving (e.g., forward-secure) schemes to mitigate damage of key leakage.
- Protecting against key manipulation or tampering attacks: algorithmic defense against physical attacks on keying material.
- Private information retrieval: keep user's interests private even from database holder.
- Relations among cryptographic primitives: reductions and oracle separations; minimal assumptions for cryptographic tasks.
- Secure computation of approximations, completeness for multi-party computation, multicast encryption, anonymous routing, intrusion detection, steganography, ...
- For more information: take crypto class this fall, contact Prof. Malkin, check out <http://www.cs.columbia.edu/~tal>

Rocco Servedio: Theory of Computing

<http://www.cs.columbia.edu/~rocco>



Main research goal: design and analyze provably correct and efficient learning algorithms for interesting and important classes of functions



Boolean formulas

geometric concepts

decision trees

CS overview - Fall 2008

Rocco Servedio: Theory of Computing

- Main approach: explore & exploit connections between computational learning theory and other areas of CS theory
- Complexity theory: representation schemes studied in complexity theory (Fourier representations, polynomial threshold functions) are useful for learning
- Cryptography: basis for robust hardness results for learning problems
- Quantum computation: quantum algorithms can efficiently solve learning problems which classical algorithms provably cannot