

# The Science of Information Meets the Liberal Arts

*Sanjeev Kulkarni*

*Professor, Department of Electrical Engineering*

*Director, Keller Center*

*Center for Science of Information*

*kulkarni@princeton.edu*

*October 26, 2012*



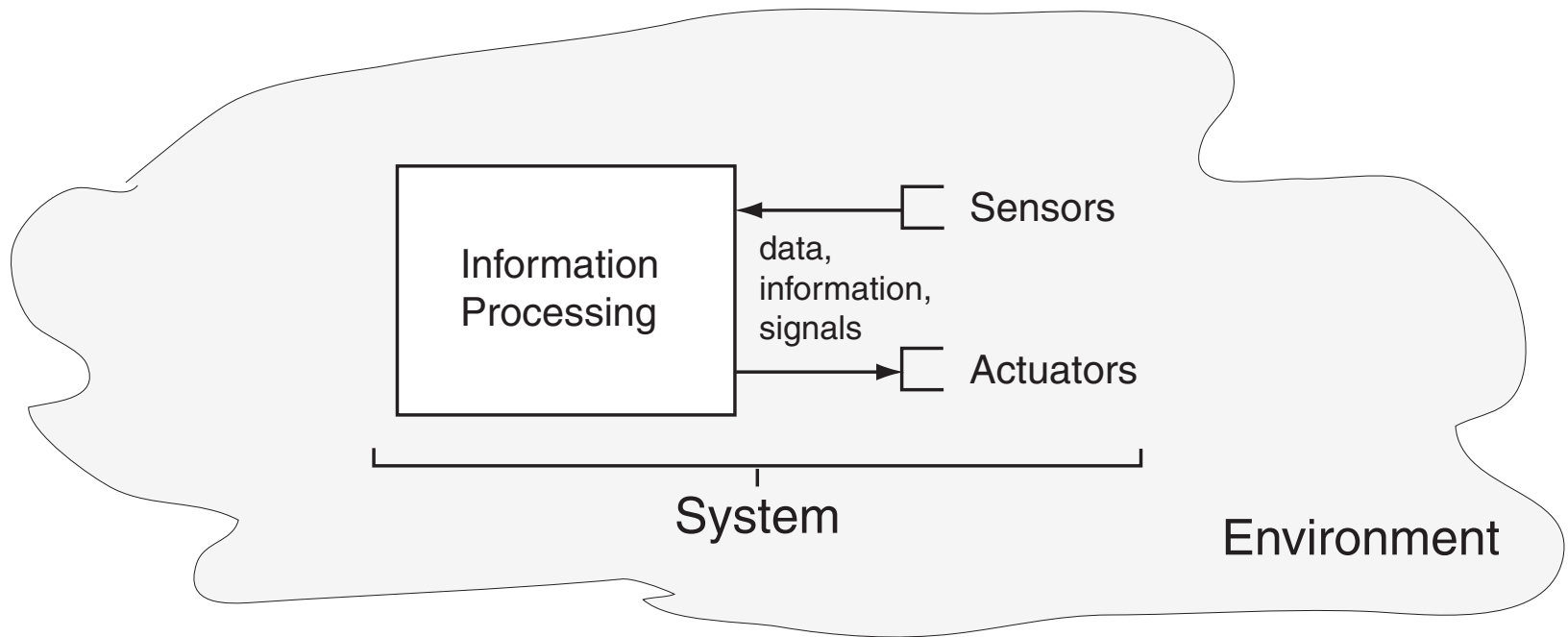
# The Science of Information Meets the Liberal Arts

- A Broad View of the Science of Information
- Three Courses
  - Making Technical Material Accessible  
*Introduction to Electrical Signals & Systems*
  - Two Inherently Blended Fields  
*Learning Theory and Epistemology*
  - Technology in its Societal Context  
*The Wireless Revolution*
- Certificate in Information Technology and Society

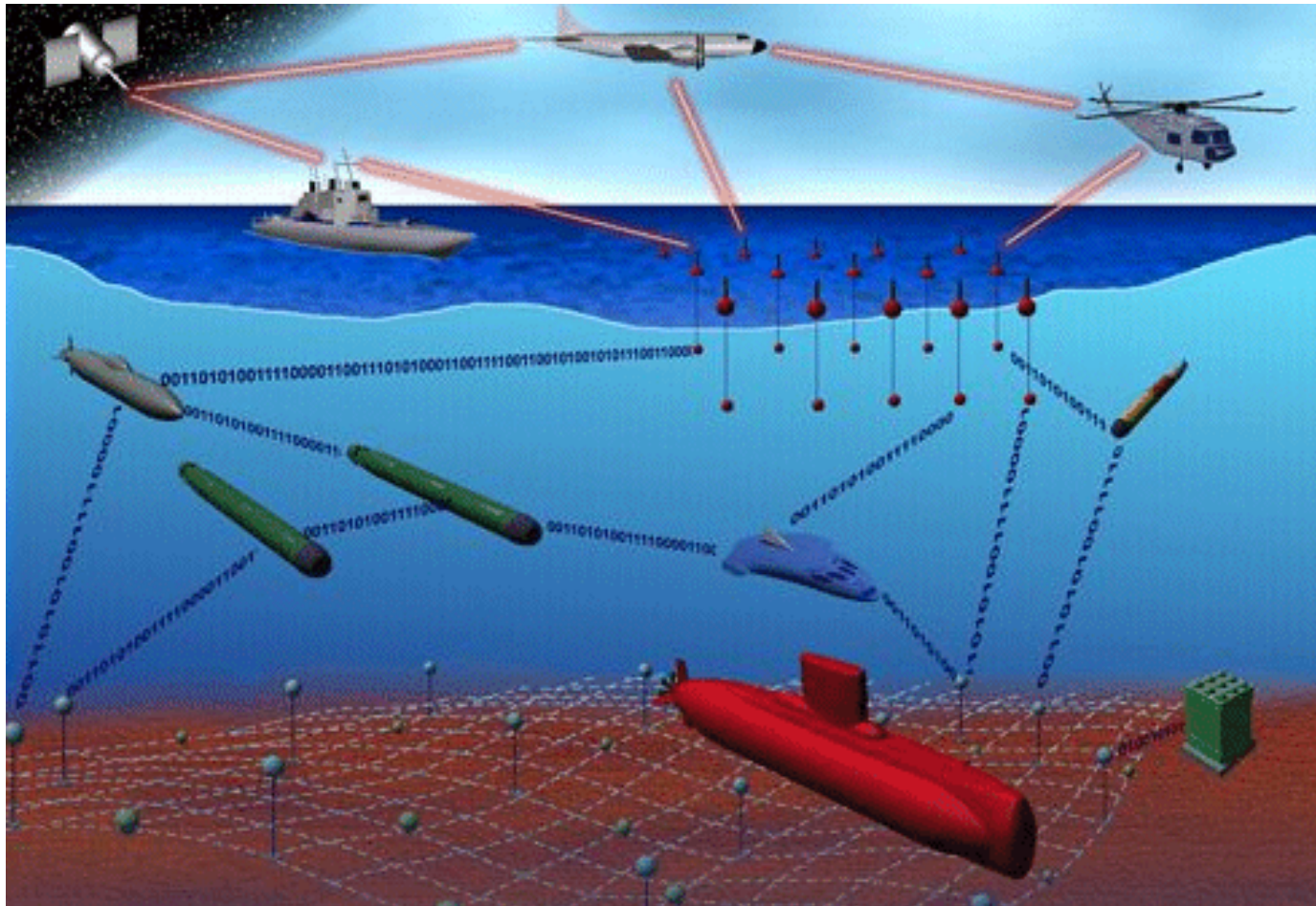


# A Broad View of the Science of Information

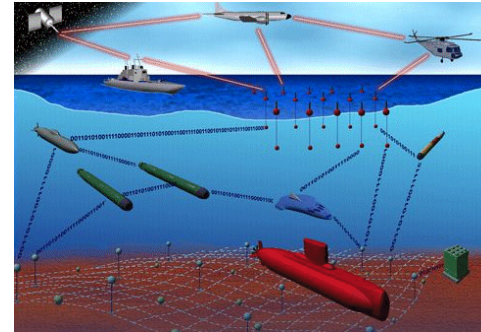
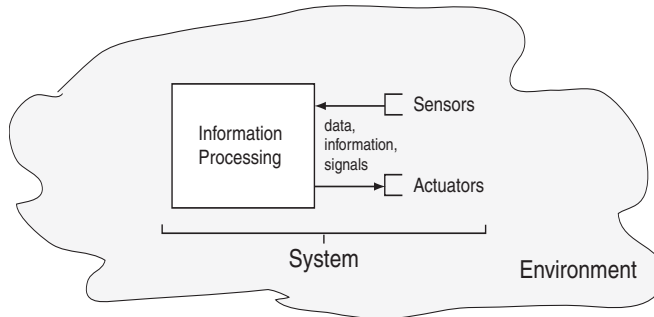
## Information-based Paradigm for Designing Systems



# System may be Complex, Dynamic, Distributed

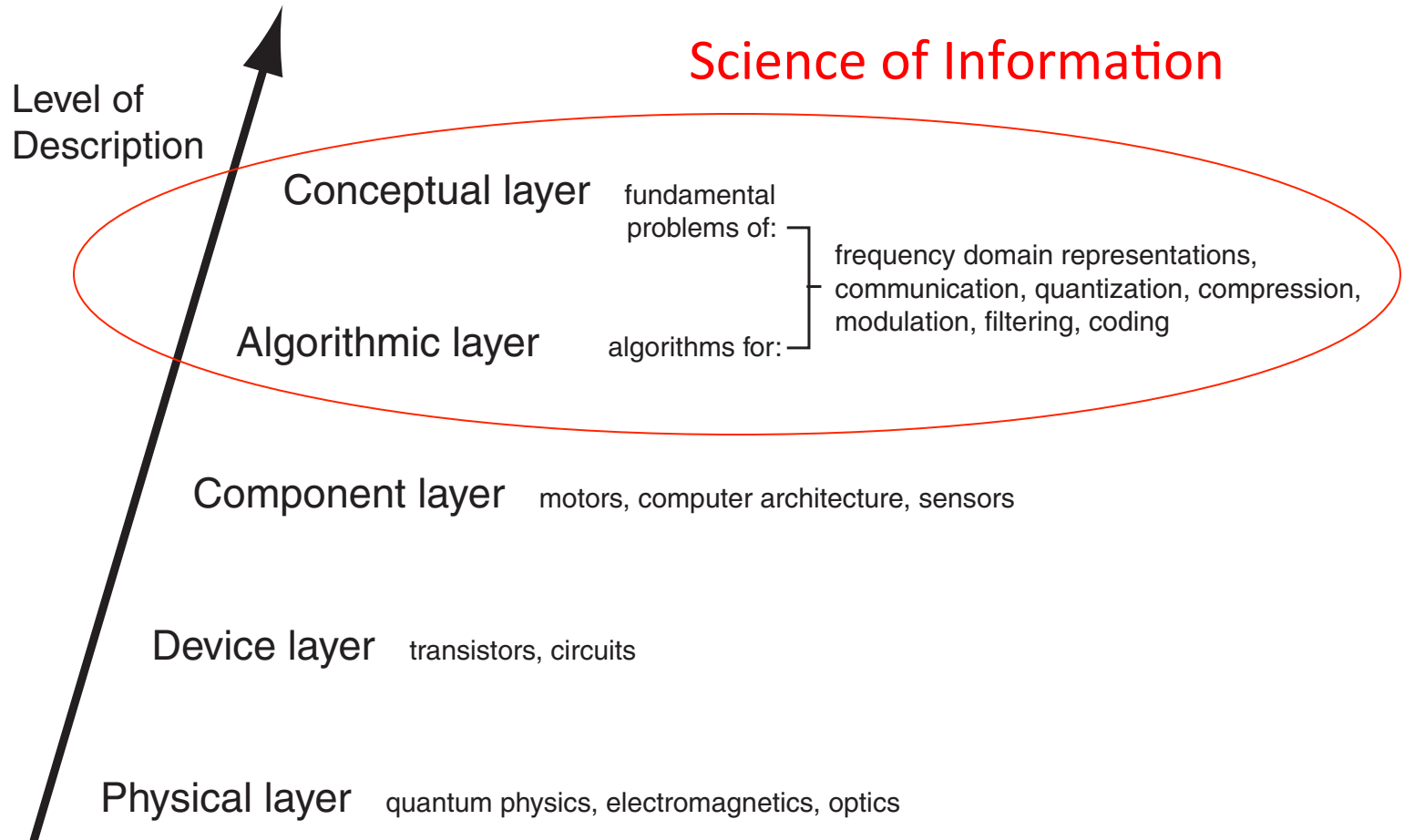


# Some Information-Processing Tasks



- Sensing
- Sampling, Quantization (& D/A)
- Filtering
- **Storage and Representation**
- Search and retrieval
- **Compression**
- General purpose computation
- **Communication, Data Transmission**
- **Error Detection/Correcton**
- Cryptography
- Digital Rights Management
- Learning and Inference
- Control
- Actuation

# Breakdown by Level of Description



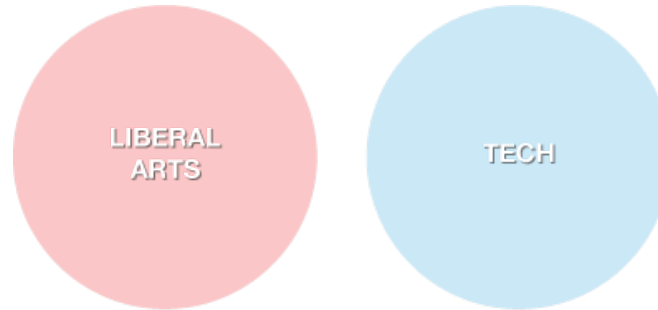
# Where and Why to Meet the Liberal Arts

- Science of information overlaps with liberal arts in many areas:
  - mathematics, statistics, psychology, philosophy, economics, politics, public policy, physics, biology, linguistics, etc.
- All of our students use and are affected by information technology, and many will work in fields related to technology.
- A liberal arts education in the 21<sup>st</sup> century should include some basic understanding of technology (including information technology)
- It's all around us and it's interesting!

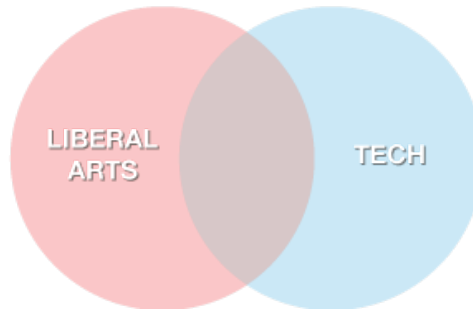


# Liberal Arts Then/Now and How to Meet

Then



Now



How to teach at the intersection?

- Make technical subject matter accessible
- Teach material that inherently blends two or more fields
- Address technology in its broader societal context



# *Making technical material accessible*

ELE 201 Introduction to Electrical Signals and Systems



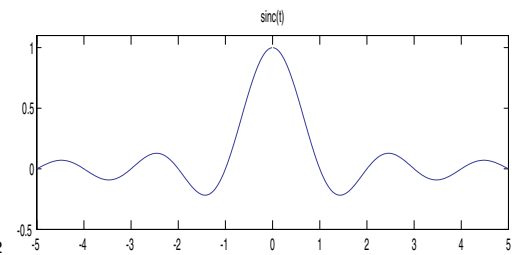
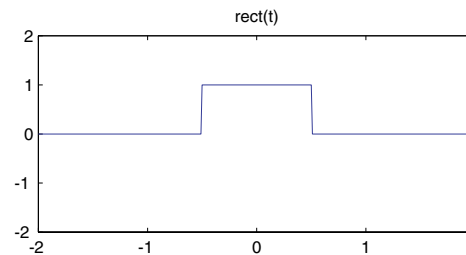
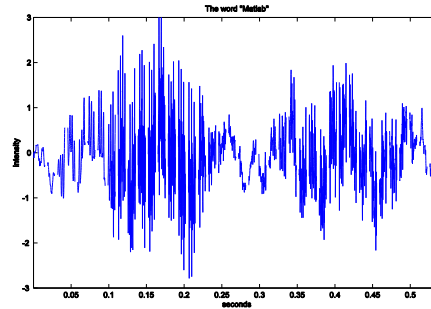
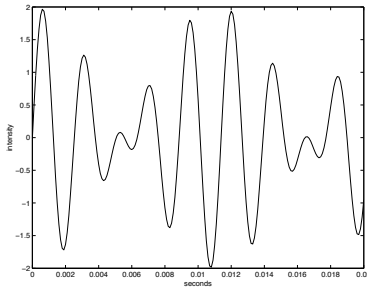
## ELE 201 Introduction to Electrical Signals and Systems

*Making technical material accessible*

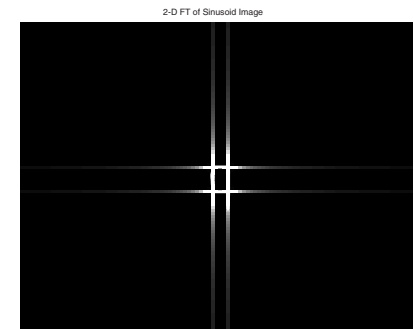
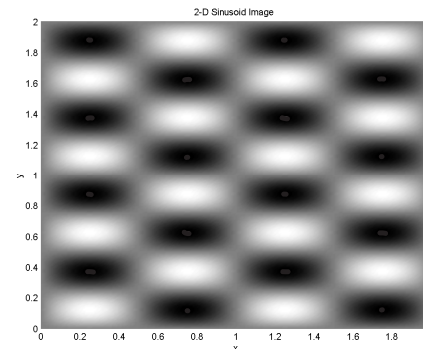
- Required core sophomore-level Electrical Engineering course.
- Open to all students with Calculus as only prerequisite. Also opened to qualified high-school students.
- Cover basics of signals, systems, and information theory.
- Has a lab component using Matlab working with audio and images.
- Now more than half of class is non-EE's, including many AB's and many undecided freshman.



# Signals, Systems, Frequency Domain



- What are signals?
- What are systems?
- Linear time-invariant systems
- $\delta$ -function, impulse response
- Convolution
- Frequency response
- Fourier transforms



# Sampling



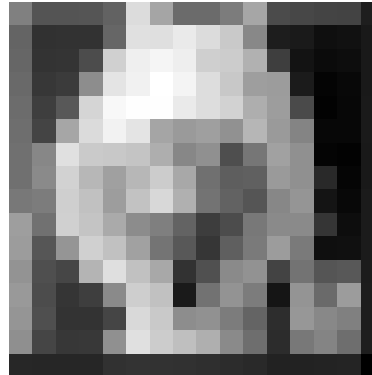
No subsampling



4 x 4 blocks



8 x 8 blocks



16 x 16 blocks

- Bandlimited signals
- Sampling theorem
- Explaining sampling rate for digital audio and video

# Quantization and Halftoning



256 levels

32 levels

16 levels



8 levels



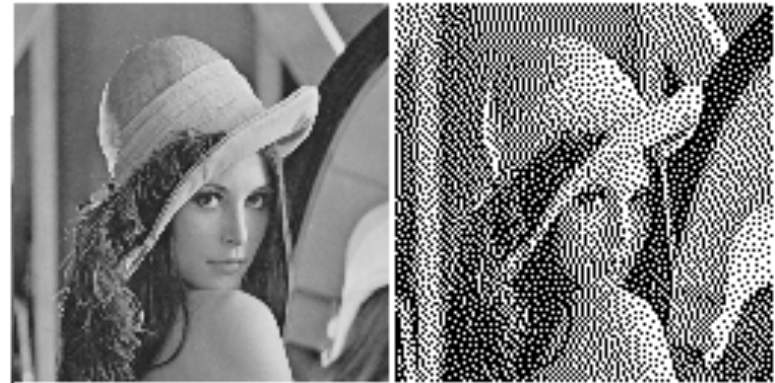
4 levels



2 levels

Original

Halftoned



# Filtering

original



added noise



average



median



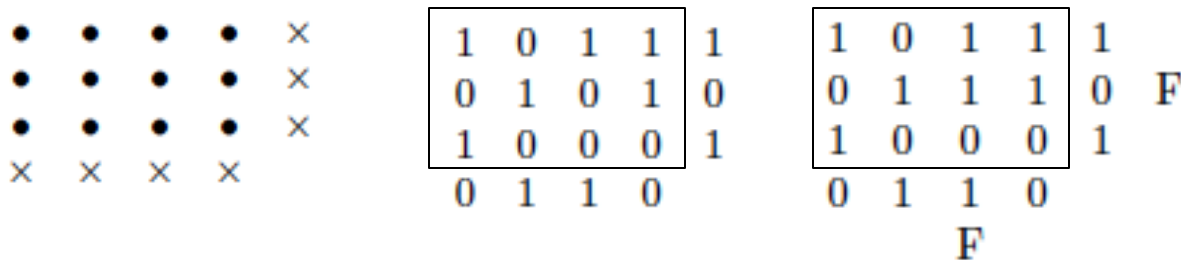
# Data Compression

- Need for compression
  - Text:  $(1000 \text{ pages})(50 \text{ lines/page})(100 \text{ characters/line}) = 5 \text{ MB}$
  - Audio:  $(44100 \text{ samples/sec})(16 \text{ bits/sample}) = 88 \text{ kB/sec}$
  - Image:  $(512 \times 512 \text{ pixels})(1 \text{ B/pixel}) = 0.26 \text{ MB}$
  - Video: 30 frames/sec gives 7.86 MB/sec
- Storage and transmission both need compression.
- Ability to compress based on exploiting redundancy. Fundamental limit based on inherent randomness (entropy).
- The more we know about the source, the better we can compress.
- Huffman coding, universal methods (zip), methods for specific types of data (JPEG, MPEG)



# Error Detection and Correction

- Compression squeezes out redundancy
- To detect or correct errors, we add back *highly structured* redundancy
- Parity check bit for error detection: 0010110  $\rightarrow$  00101101
- More parity checks can allow correction:



- Also discuss better methods and fundamental limits





# Some Comments

- Lab component (audio and images in Matlab) is popular.
- Blend of theory, hands-on, and real applications.
- Leads to substantive understanding.
- Demystifies technology.
- No exclusive domain for scientists/engineers.
- Biggest challenge is differing mathematical backgrounds.



# *Two inherently blended fields*

ELE/PHI 218 Learning Theory and Epistemology



# ELE/PHI 218 Learning Theory and Epistemology

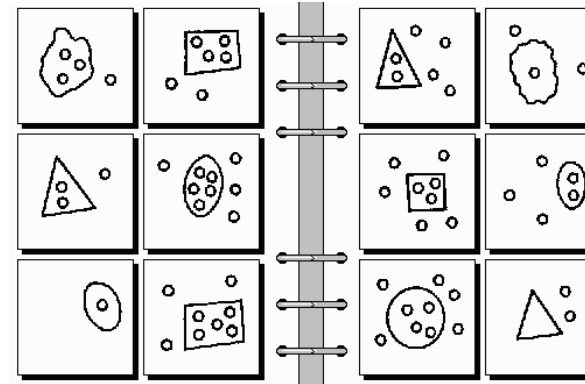
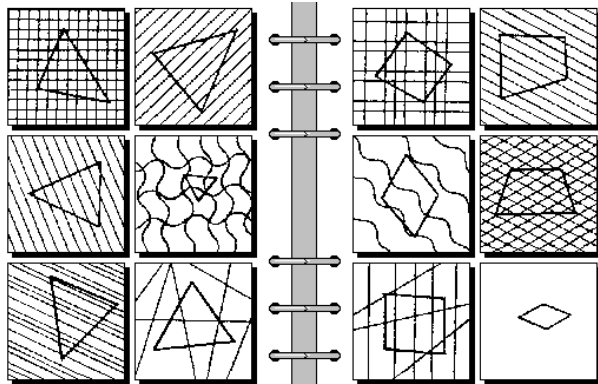
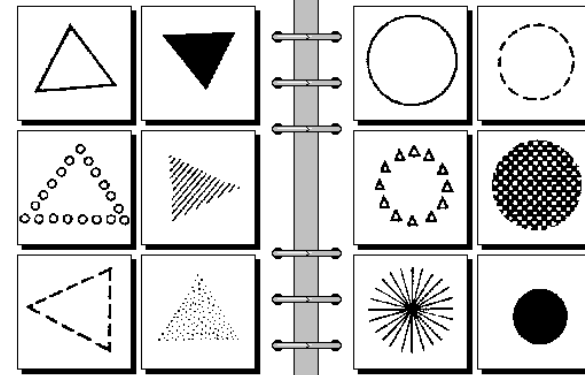
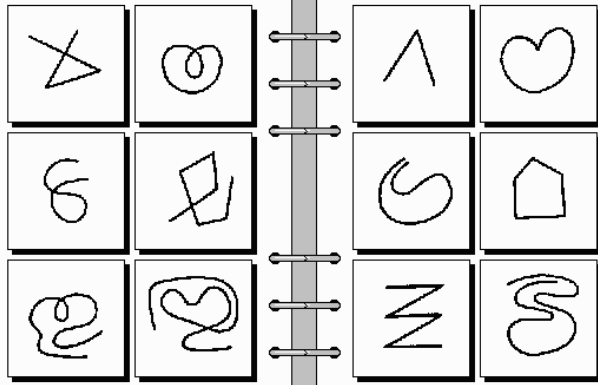
*Two inherently blended fields*

- Co-teach with Prof. Gil Harman in Philosophy.
- Students from wide range of departments and all levels (freshmen through seniors).
- Calculus is only prerequisite.
- Learning theory: Studies the fundamental limitations of learning (machine learning, pattern recognition). Are some learning/pattern recognition problems inherently hard? How can we design good algorithms?
- Epistemology: The branch of philosophy that deals with the nature and limitations of knowledge. What do we know and how do we know it?



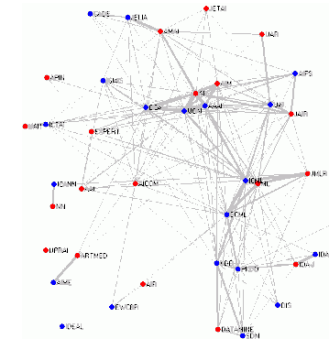
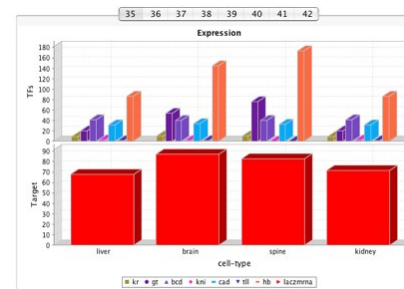
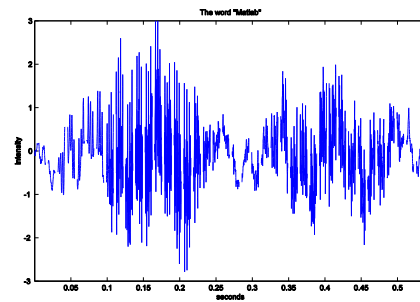
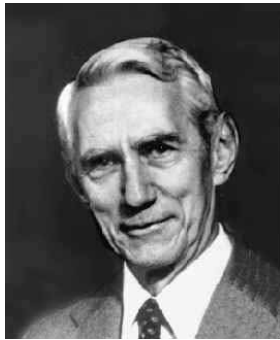
# Pattern Recognition: Learning from Examples

From M. Bongard, Pattern Recognition, 1970



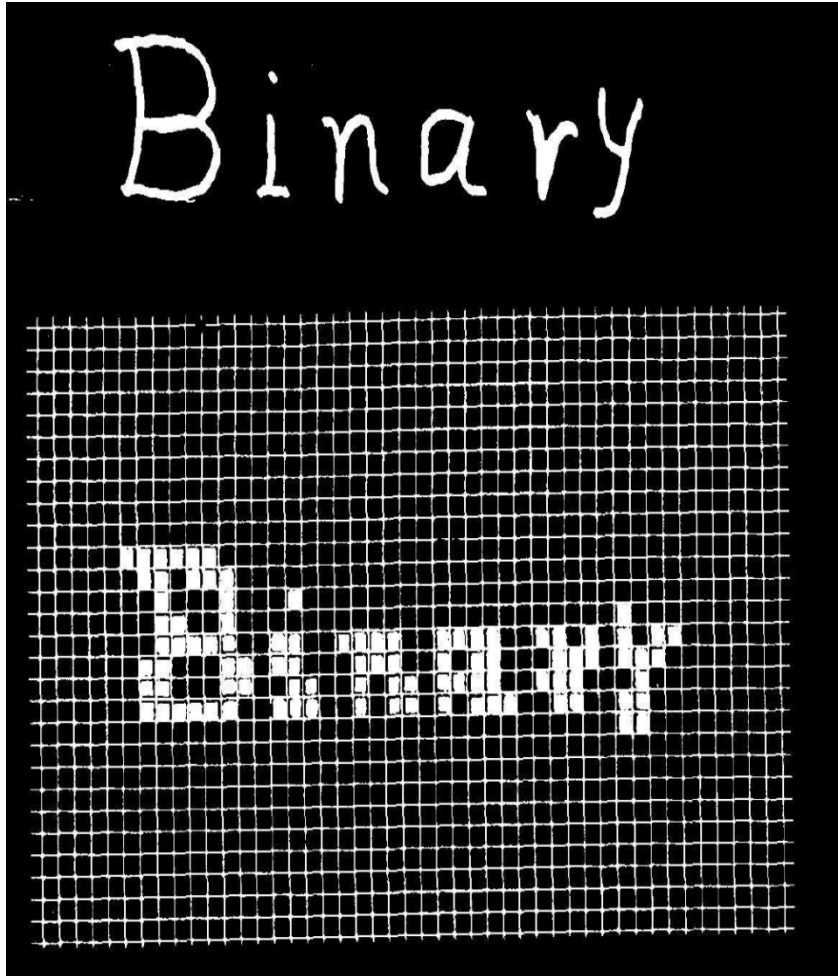
# Machine Learning/Pattern Recognition

- Often don't know how to design good rules for classification or estimation.
- Learning can replace this knowledge, allow adaptation, and robustness to changing conditions.



- Applications to recognition of images (faces, targets, etc.), speech, handwriting, medical diagnosis, spam, fraud, etc.
- Design effective algorithms
- Understand fundamental limits. What can be learned? What can't? Why?

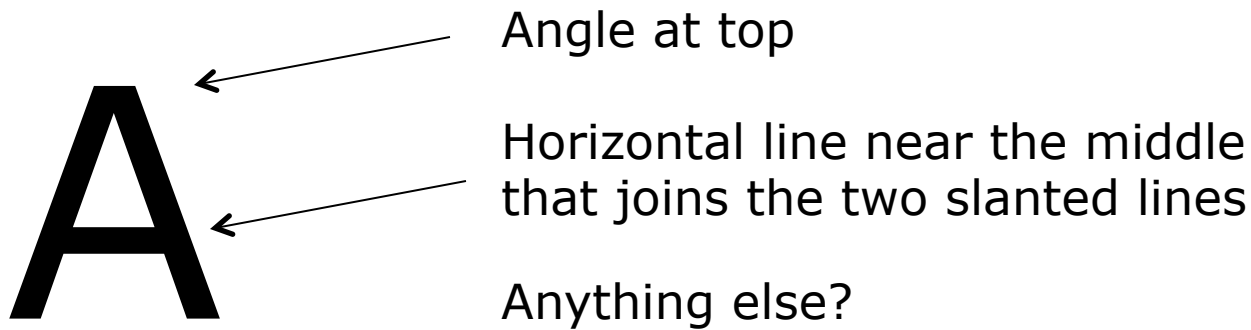
## Example: Character Recognition



- Try to automatically recognize handwritten characters.
- Digitize characters to get a digital image.
- Segment into individual characters.
- Find features that distinguish each character.

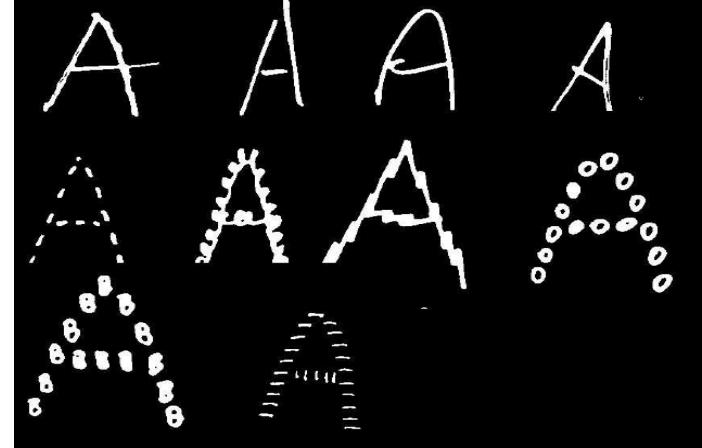
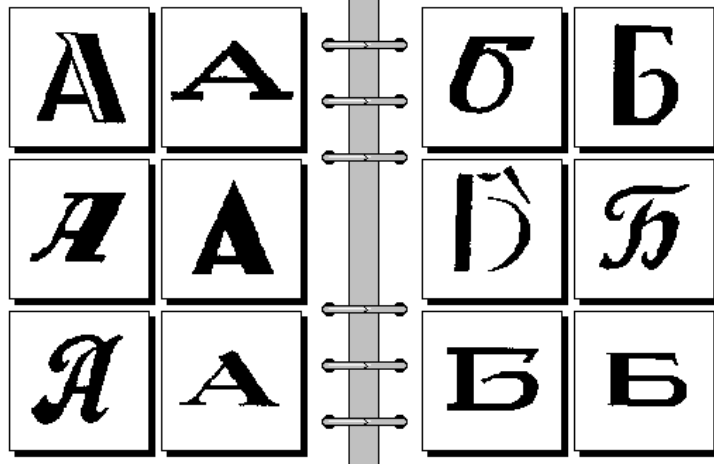
# Feature Extraction

- What are good features for recognizing characters?
- For example, what makes an “A” an “A”?



- Can we come up with good features for each letter and number?
- Even if can, how do we extract these features?

## Problems With This Approach

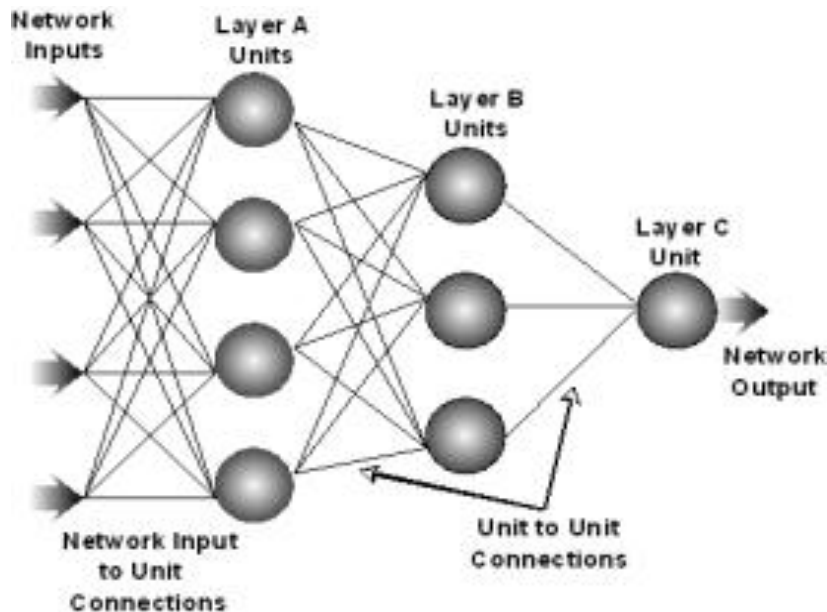


- Robust features are extremely difficult to identify and precisely define.
- And very difficult to extract.
- This is definitely not how humans learn!



# A Different Approach

- Get lots of examples of A's, B's, etc.
- Use these training examples to come up with a rule.
- This is supervised learning.
- And this is closer to how humans learn.



- A number of learning techniques – e.g., neural networks, SVM's, boosting.
- Very successful in many applications.
- Still quite challenging:
  - Curse of dimensionality.
  - No Free Lunch theorems.
  - Understanding performance

# Exploiting the Limitations

- Captcha – a sort of “anti-Turing test”
- Tell humans and machines apart automatically
  - Prevent spam-bots from automatic email registration
  - Prevent vote-bots from disrupting on-line polls.



smmm

following

finding

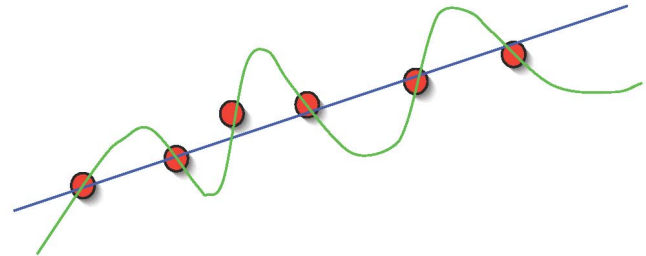
klpsh

3m53

vplz

# *Connections to Many Other Fields and Many Fundamental Questions*

- Mathematics, statistics, optimization.
- Neuroscience, cognitive science, psychology (brain, human learning, neural networks, etc.)
- Philosophy
  - The problem of induction
  - Role of simplicity, Occam's razor
  - Is the mind a computer?
  - Can a computer have a mind?
  - Can a computer be conscious? Be self-aware? Have intent? Feel?
  - If so, what are the ethical implications?



# Some Comments

- Brings together a wide range of students from diverse backgrounds.
- Brings together two very different fields.
- Substantive in-class discussions
- Deep results from several fields
- Key ideas understandable
- Again, differing math backgrounds is biggest challenge



# *Technology in its societal context*

ELE/EGR 391 The Wireless Revolution



# ELE/EGR 391 The Wireless Revolution

## *Technology in its societal context*

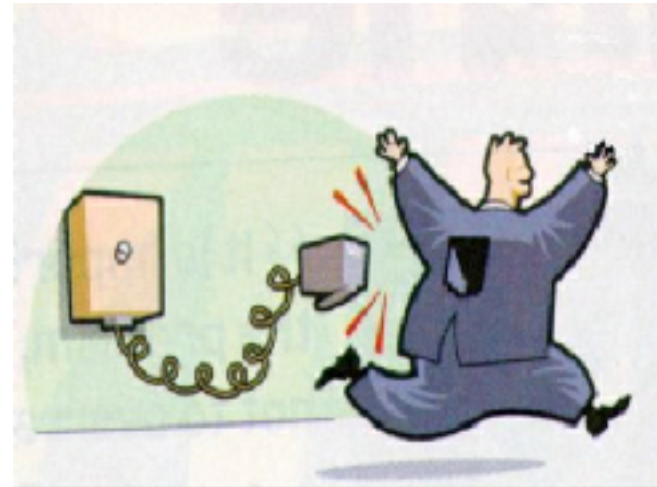
- Introduced by Prof. Vince Poor in 2001.
- No prerequisites. Not open to freshmen.
- Students from wide range of departments and sophomores through seniors.
- Open to engineers, but doesn't satisfy departmental requirement.
- Considering closing to Electrical Engineers
  
- First half: Cover basics of wireless technology.
- Second half: Guest lectures from academia, industry, government.



# What is Wireless? Tetherless (Freedom)

- Wireless means communication by radio.
- Wireless typically implements only the **last link** between an **end device** (telephone, computer, etc.) and an **access point** to a network.
- Wireless usually involves significant wireline infrastructure (the “**backbone**”).
- Wireless affords
  - **mobility**
  - **portability**
  - **ease of connectivity**

i.e., freedom.



# Wireless Challenges

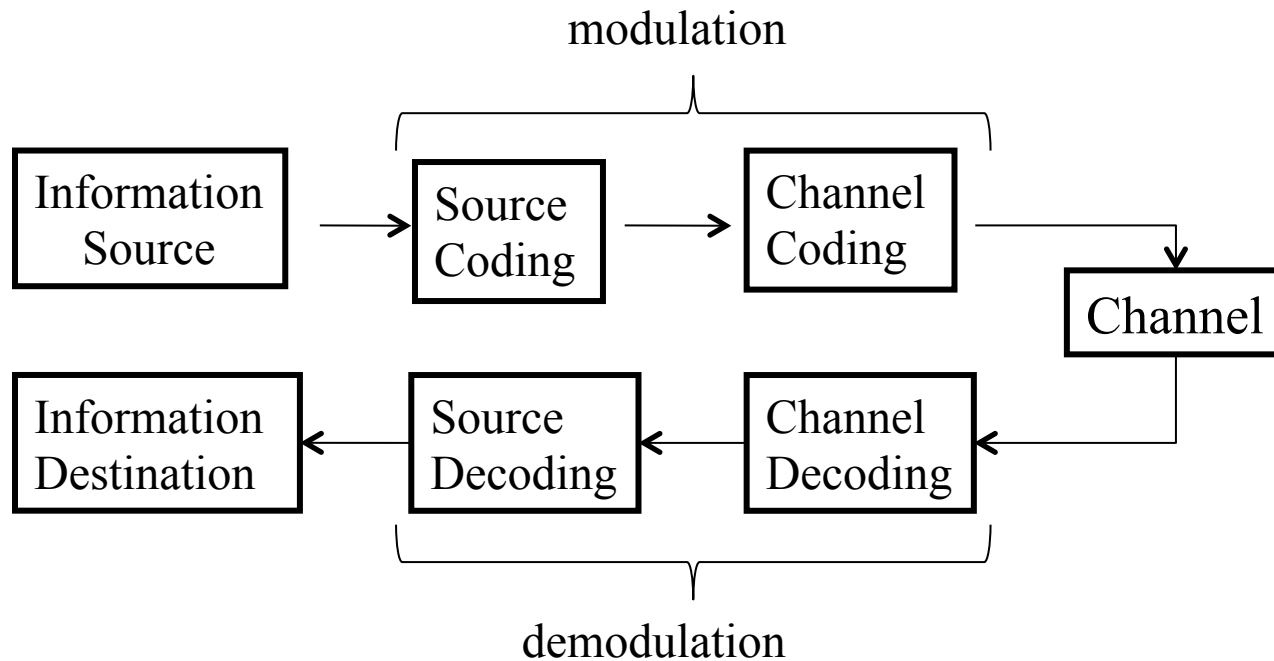
Main Challenge: To provide the services of wireline systems, but with mobility.

- High data rate (multimedia traffic)/greater capacity
- Networking (seamless connectivity)
- Resource allocation (quality of service - QoS)
- Manifold physical impairments
- Mobility (rapidly changing physical channel)
- Portability (battery life)
- Privacy/security (encryption)
- Global standardization (politics & \$\$\$)



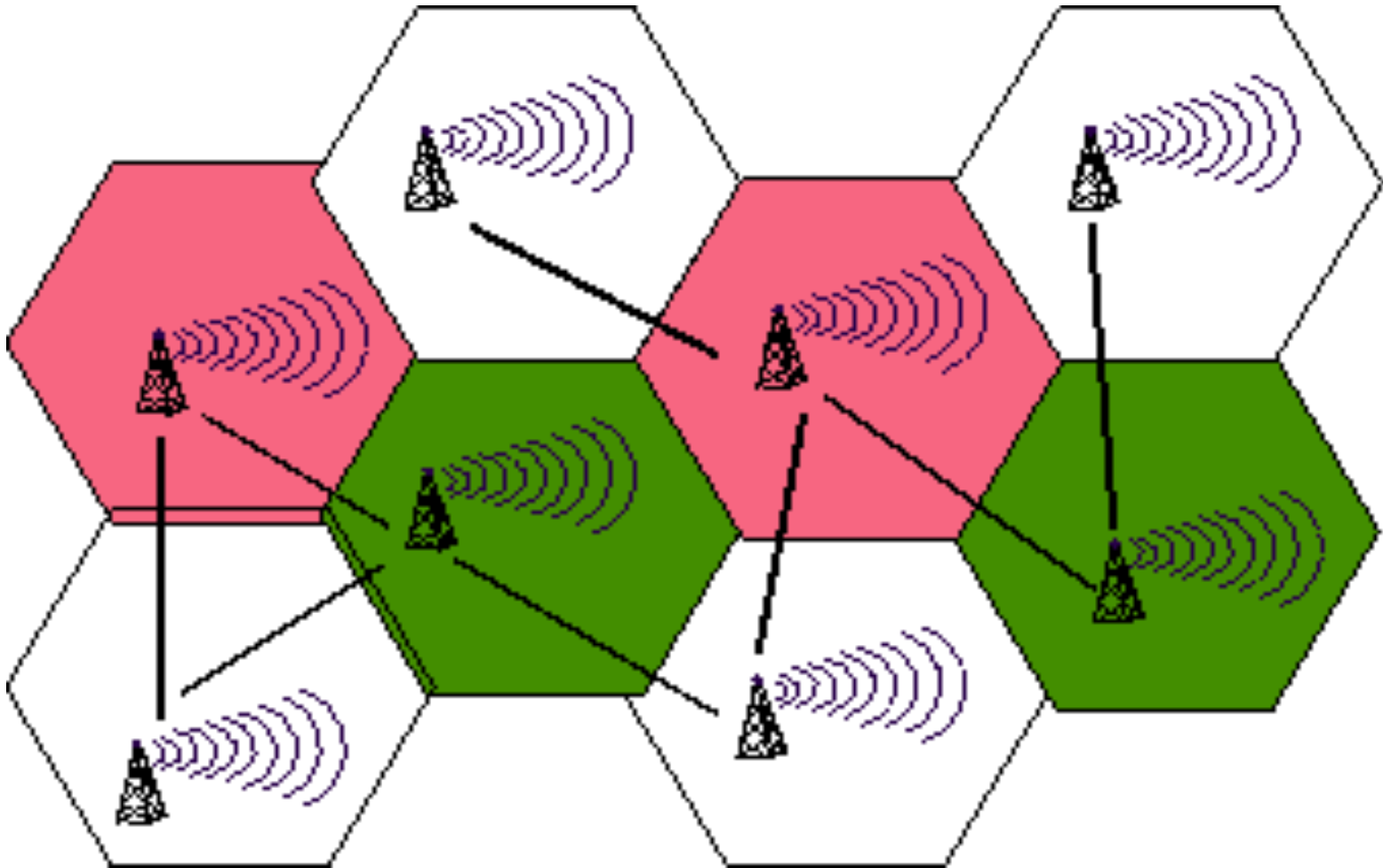


# Point-to-Point Communication Model

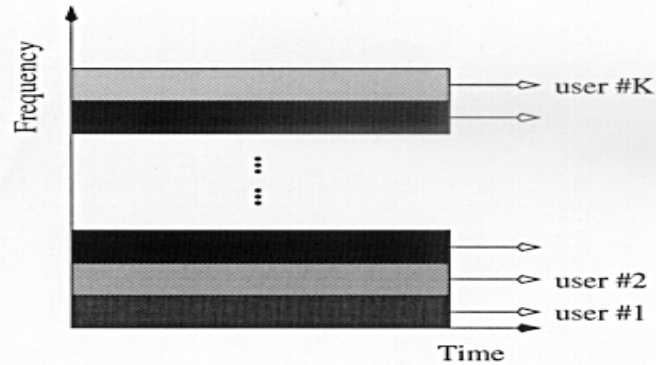


- Key ideas with multiple users
  - Cellular concept
  - Multiaccess techniques
  - Networks and protocols

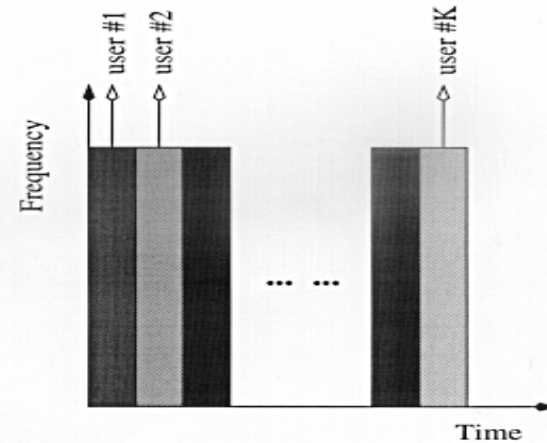
# Cellular Telephony



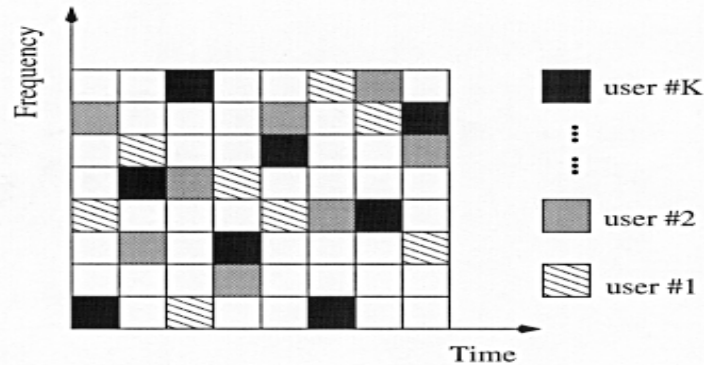
# xDMA Summary



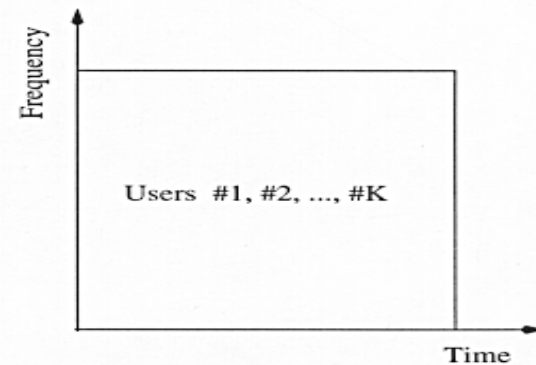
**Frequency-Division Multiple-Access (FDMA)**



**Time-Division Multiple-Access (TDMA)**



**Frequency-Hopping Code-Division Multiple-Access (FH-CDMA)**



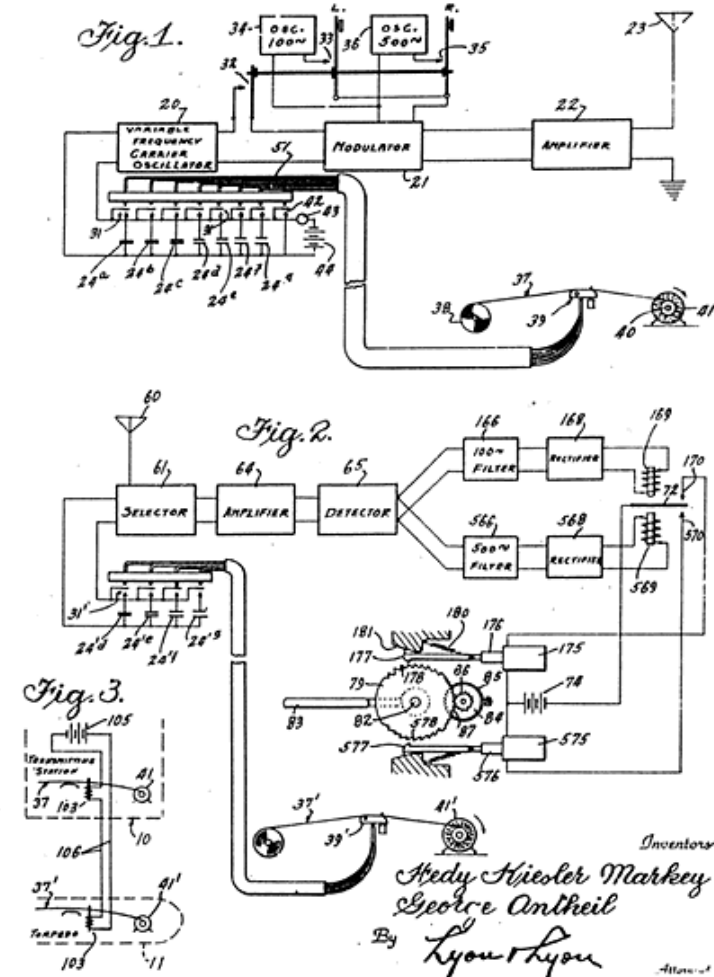
**Direct-Sequence Code-Division Multiple-Access (DS-CDMA)**

# Hedy Lamarr



Photo from *The Economist*, Jan. 25, 2000.

Aug. 11, 1942. H. K. MARKEY ET AL. 2,292,387  
SECRET COMMUNICATION SYSTEM  
Filed June 10, 1941 2 Sheets-Sheet 1



- Co-inventor of FH spread-spectrum.
- Invented in the context of torpedo guidance.



# Packet Switching vs Circuit Switching

- In large data networks (e.g., the Internet), packets are switched through the network from source to destination by routers at the “nodes” of the network.
- This **works like the postal system**, where
  - the **packets** are like **letters**
  - the **links** are like **postal routes** and transportation routes between major cities
  - the **nodes** are like **post offices**
  - the **end devices** are like **mailboxes**
- Avoids need for end-to-end link.



## Part II: Guest Lectures on Business, Regulatory, Social Issues, etc.

- Commercial enterprises/entrepreneurship.
- Wireless standards.
- Investment banking perspectives.
- Impact of regulatory policies/ role of the FCC in USA wireless development.
- Valuation and auctioning of the radio spectrum.
- Applications (e.g., environmental monitoring).
- Security and privacy in wireless networks.
- Social issues in wireless.
- Emerging techniques and the future of wireless.



For some, wireless is easy...

*The wireless telegraph is not difficult to understand. The ordinary telegraph is like a very long cat. You pull the tail in New York, and it meows in Los Angeles.*

- *Albert Einstein*



# For some, wireless is easy...

*The wireless telegraph is not difficult to understand. The ordinary telegraph is like a very long cat. You pull the tail in New York, and it meows in Los Angeles. The wireless telegraph is the same, only without the cat.*

*- Albert Einstein*





# Some Observations

- P/D/F-only levels playing field and promotes exploration outside of comfort zone.
- Understand revolutionary advance.
- Guest lectures are a big hit.
  - Appreciate broader impacts of technology.
  - Meet leaders in variety of areas.
  - Engage alumni.
- Biggest challenge is lining up compelling guest speakers. Differing math backgrounds addressed by P/D/F.



# *A Program of Study*

Certificate in Information Technology and Society



# Certificate in Information Technology and Society

## *Program of Study*

- Jointly sponsored by Keller Center and Center for Information Technology Policy

### **Requirements**

- Core course: EGR/HIS/SOC 277 – Technology and Society
- Two technology courses
- Two societal courses
- A breadth course
- Independent work
- Presentation at annual symposium



# Technology Courses

- COS 109/EGR 109 – Computers in Our World
- COS 126 – General Computer Science
- COS 432 – Information Security
- COS 445 – Networks, Economics and Computing
- COS 455/MOL 455 – Intro to Genomics and Computational MolBio
- COS 597D – Advanced Topics in CS – Info. Privacy Technologies
- ELE 201 – Introduction to Signals and Systems
- ELE 222a/b/EGR 222a/b – The Computing Age
- ELE 381/COS 381 – Networks: Friends, Money, and Bytes
- ELE 386/EGR 386 – Cyber Security
- ELE 391/EGR 391 – The Wireless Revolution
- FRS 125 Friending, Following and Finding
- ORF 401 – Electronic Commerce
- ORF 411 – Operations and Information Engineering



# Societal Courses

- COS 448\* – Innovating Across Technology, Business, & Markets
- COS 495/ART 495 – Modeling the Past – Tech & Excav. in Polis, Cyprus
- COS 586/WWS 586F\* – Information Technology and Public Policy
- FRS 101\* – Facebook: The Social Impact of Social Networks
- FRS 163 – Technology and Policy
- PSY 214 – Human Identity in the Age of Neurosci. and Info. Technology
- PSY 322/ORF 322 – Human Machine Interaction
- SOC 204 – Social Networks
- SOC 214 – Creativity, Innovation, and Society
- SOC 344 – Communications, Culture, and Society
- SOC 357\* – Sociology of Technology
- SOC 409\*/COS 409 – Critical Approaches to Human Comp. Interaction
- WWS 334 – Media and Public Policy (formerly WWS 309)
- WWS 351/SOC 353/COS 351 – Info. Technology and Public Policy
- WWS 571B/NES 584 – New Media & Social Movements



# Breadth Course

- CBE 260/EGR 260 – Ethics and Technology: Eng. in the Real World
- CEE 102a/b/EGR 102a/b – Engineering in the Modern World
- ENV 360\* – Biotech Plants and Animals
- MAE 228/EGR 228/CBE 228 – Energy Solutions for the Next Century
- MAE 244\*/EGR 244 – Intro to Biomedical Innovation and Global Health
- MAE 445/EGR 445 – Entrepreneurial Engineering
- MOL 205 – Genes, Health, and Society
  
- EGR 491/ELE 491 – High-Tech Entrepreneurship
- EGR 492\* – Radical Innovation in Global Markets
- EGR 495 – Special Topics in Entrepreneurship – The Lean LaunchPad
- HIS 292 – Science in the Modern World
- HIS 398 – Technologies and Their Societies: Historical Perspectives
- NES 266\*/ENV 266 – Oil, Energy and The Middle East
- WWS 315 – Bioethics and Public Policy



# Projects and Student Presentations

- “TUBE ( Time dependent Usage based Broadband price Engineering)”
- “Adolescents and Online Bullying”
- “Contested Control: European Data Privacy Regulations and the Assertion of Jurisdiction over American Businesses”
- “Evading Government Censorship; the Labor Movement's Use of the Internet”



# Summary

- Science of Information is extremely broad
- Is embedded throughout our world
- Some understanding of technology should be part of a liberal education
- Many ways to teach at the interface
- Science of Information is a particularly rich area for bringing together engineering, sciences, social sciences, and humanities





The background of the slide is a dark blue color with a complex, abstract pattern of overlapping, wavy white and light blue lines that create a sense of depth and movement, resembling a stylized landscape or a series of concentric, irregular shapes.

*Thank You!*