

# Robotics and Intelligent Systems

**Robert Stengel**

Robotics and Intelligent Systems  
MAE 345 Princeton University, 2015



[www.princeton.edu/~stengel/MAE345.html](http://www.princeton.edu/~stengel/MAE345.html)

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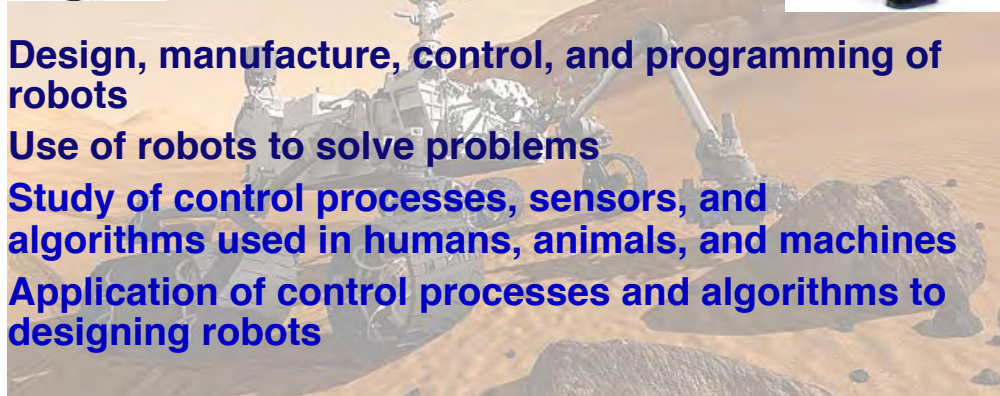
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## Robots and Robotics

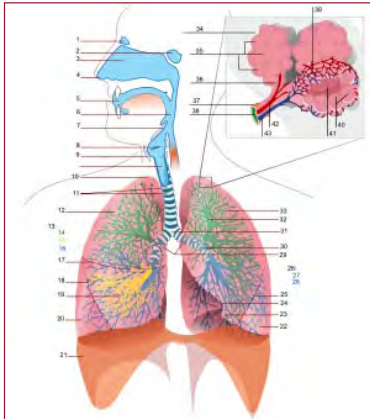


- Design, manufacture, control, and programming of robots
- Use of robots to solve problems
- Study of control processes, sensors, and algorithms used in humans, animals, and machines
- Application of control processes and algorithms to designing robots



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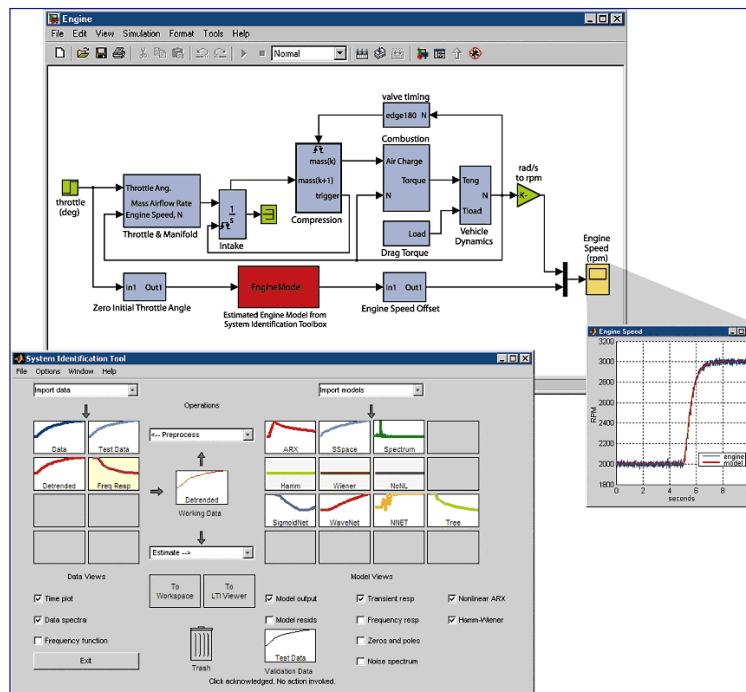
# What are Systems?



- **Assemblages of parts with structure, connectivity, and behavior**
- **Modules that relate to each other**
- **Interacting entities with common goals**
- **Objects with defined boundaries within some environment**
- **Objects that respond to inputs from externalities**
- **Objects that create outputs to externalities**

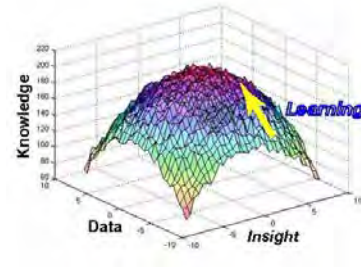
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## Representing Dynamic Systems and Their Performance



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# Intelligent Systems

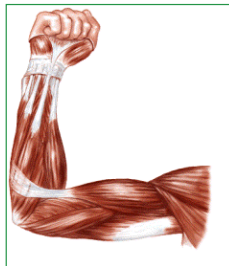


- **Systems that**
  - perform useful functions driven by desired goals and current knowledge
  - emulate biological and cognitive processes
  - process information to achieve objectives
  - **learn by example or from experience**
  - **adapt functions to a changing environment**

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## Biomimetics (Bionics)

- **Understanding biological principles and applying them to system design**
  - **Configuration**
  - **Structure**
  - **Behavior**
  - **Dynamics**
  - **Control**



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# Syllabus

- Overview and Preliminaries
- Coordinates and Kinematics
- Mobile Robots
- Path Planning
- Articulated Robots
- Rigid-Body Dynamics
- Dynamic Effects of Feedback Control
- Analog and Digital Control Systems
- Sensors and Actuators
- Introduction to Optimization
- Numerical Optimization
- Dynamic Optimal Control
- Formal Logic, Algorithms, and Incompleteness
- Computers, Computing, and Sets
- Probability and Statistics
- State and Parameter Estimation
- Stochastic and Adaptive Control
- Classification of Data Sets
- Neural Networks
- Communication, Information, and Machine Learning
- Expert Systems
- Task Planning and Multi-Agent Systems

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## Preliminaries

- **Office Hours**
  - Mon Wed, 1:30-3pm
- **Assistant in Instruction:**
  - **Sheng Yang**
    - Office hours: TBD
    - Precepts, tutorials: TBD
- **MATLAB / SimuLink / SimMechanics**
- **Course Home Page, Syllabus, and Links**
  - [www.princeton.edu/~stengel/MAE345.html](http://www.princeton.edu/~stengel/MAE345.html)
- **On-Line Resources**
  - **Blackboard** (<https://blackboard.princeton.edu/webapps/login>)
    - Lecture Slides
    - Suggested Reading (E-Reserves, E-Journals, and Web Pages)
    - Virtual Reference Book

- **~GRADING**
  - Class participation: 15%
  - Assignments: 55%
  - Term Paper: 30%
  - Late policy: 10% reduction/day

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## ***Electronic Devices in Class***

- *Silence all cellphones and computer alarms*
- *Don't check e-mail or send text, tweets, etc.*
- *If you must make a call or send a message, you may leave the room to do so*
- *Tablets/laptops for class-related material ONLY*

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## **Collaborative Learning**

- **Significant student participation in most classes, Q&A**
- **Slides will be available before each class**
- **Discussion of slides by students**
- **Randomly assigned teams for some assignments**
- **Single grade for each team**

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## ***Background Reading***

- ***Chapters, sections, and pages from various books and papers***
  - ***Electronic Reserves: 'E-Reserves' on Blackboard sidebar***
  - ***Hard copies on Engineering Library Reserve Shelf***
- ***Technical journal papers***
  - ***E-Journals:***  
***[http://sfx.princeton.edu:9003/sfx\\_pul/az](http://sfx.princeton.edu:9003/sfx_pul/az)***

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## ***Additional Information:*** ***Virtual Reference Book***

***Links to web pages describing material related to the course***

***Entries marked by asterisks (\*) are especially relevant***

***Arranged to correspond to course lectures***  
***Predominantly Wikipedia entries***

***<http://www.princeton.edu/~stengel/RISVirText.html>***

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# Written Assignment Reporting Format

- *Assignments will evolve toward Technical Reports*
- *Write-ups should present explanations, not just numbers, graphs, or computer code*
- *Orderliness and neatness count*
- *Don't forget your name, date, and assignment title or number*

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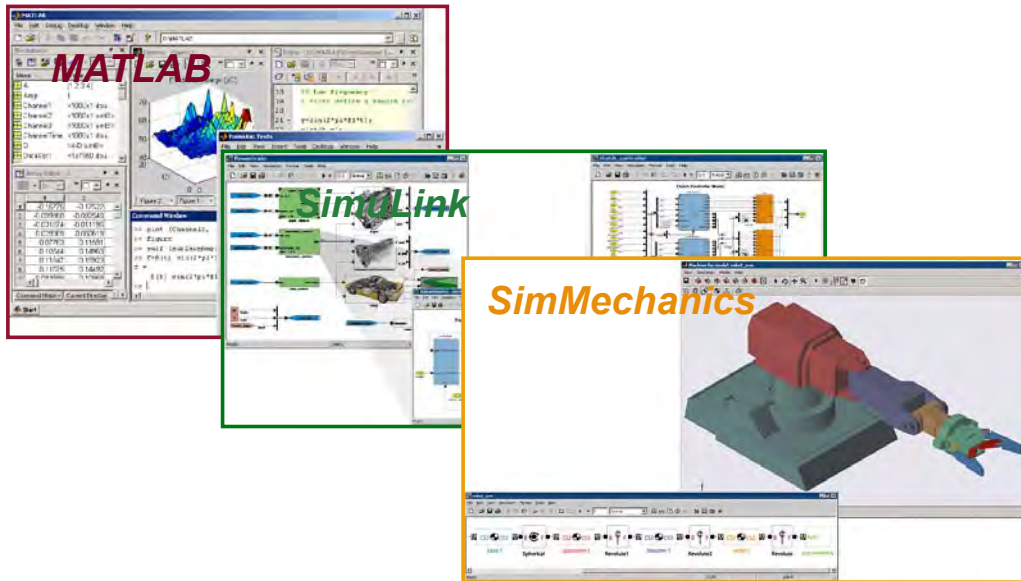
## **Assignment # 1** **due: September 24, 2015**

- 1) Describe a specific, existing robotic system in about 750 words.
- 2) Describe an existing or hypothetical intelligent system in about 500 words.

[Submit via Blackboard](#)



# Computational Tools

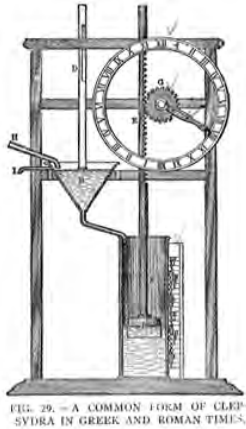


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## A Little Historical Background

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## Robotic Antecedents: Antiquity

- **Aristotle, 4<sup>th</sup> c. BC**
  - “If every instrument could accomplish its own work, obeying or anticipating the will of others ... chief workmen would not need servants.”
- **Toys, gadgets, and clocks**
  - Puppets, various cultures, BC
  - Water-driven clock, 2<sup>nd</sup> c. BC
  - Automata, clock works, *et al* (da Vinci's Lion, 15<sup>th</sup> c. BC ; Zytgloggeturm, Bern, 12<sup>th</sup> and 16<sup>th</sup> c.)
- **Elektro, 1939 NY World's Fair**



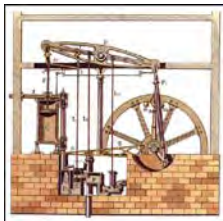
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## Robotic Antecedents: Science Fiction

- **“Robot” = “worker” in Slavic**
  - Karel Capek's 1921 play, *RUR* (*Rossum's Universal Robots*), in which machines took over the world
- Short story in collection, *I, Robot*, Isaac Asimov, 1942
  - Code of ethics for robots
- Victorian pulp fiction (Frank Reade's *Electric Man*, the *Electric Horse*)



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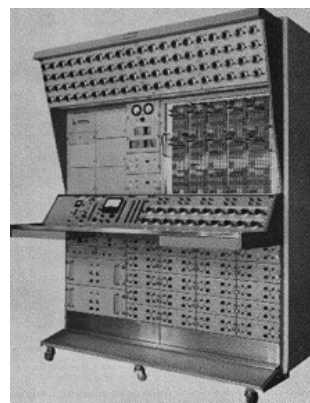
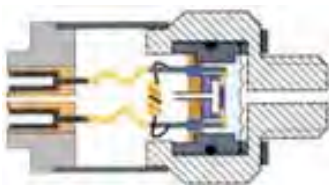


## Robotic Antecedents: Industry

- **18<sup>th</sup> c.: Industrial Revolution**
  - Jacquard loom (punched cards)
  - Watt steam engine (regulator)

- **1930s: Enabling Technologies**

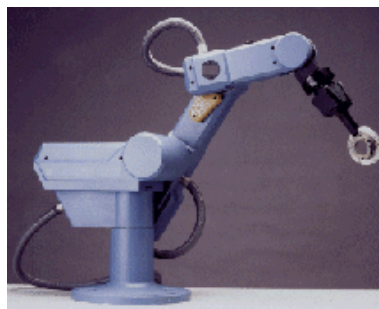
- Electric motors
- Hydraulic/pneumatic actuators
- Sensors
- Analog computation
- Control theory



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## Toward Autonomous Robots

- **1940s: World War II**
  - Teleoperators
  - Fire control systems
  - Aerial drones
  - Numerically controlled machines
  - Chemical process control
- **1950s: Cold War**
  - Guided multi-stage missiles
- **1960s: Space Age**
  - Uninhabited spacecraft
  - Industrial robots
  - “Boston Arm” (Mann, MIT)
- **1970s: Energy and the Environment**
  - Computer-machine integration
  - Entertainment

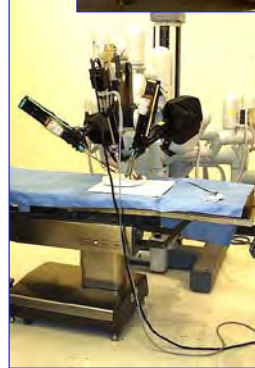


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# Elements of Robotic Devices

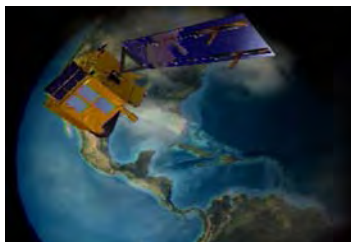
- Structure
- Power source
- Actuation
- Sensing
- Locomotion
- Environmental Interaction
- Human-machine interaction
- Guidance
- Navigation
- Control



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## Autonomous Robots

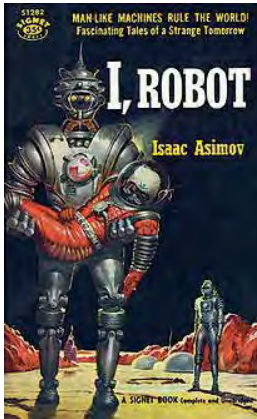
- Self control
- Self maintenance
- Awareness of environment
- Task orientation
- Mission specificity
- Power source
- Cooperation and collaboration
- = Intelligence?
- Self replication?
- Ethical issues



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# Ethics of Robotics



- **Three Laws of Robotics** (Asimov, "Runaround", in *Astounding Science Fiction*, 1942)
  - **1:** A robot may not injure a human being or, through inaction, allow a human being to come to harm.
  - **2:** A robot must obey any orders given to it by human beings, except where orders conflict with the **First Law**.
  - **3:** A robot must protect its own existence as long as protection does not conflict with **First or Second Law**.

- **RoboEthics = Human-Centered Ethics?**

- Human dignity, respect, privacy, and rights
- Equality and justice
- Benefit and harm
- Discrimination and diversity
- Individual autonomy and social responsibility

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# Ethics of Robotics

## RoboEthics = Human-Centered Ethics?

Human dignity, respect, privacy, and rights

Equality and justice

Benefit and harm

Discrimination and diversity

Individual autonomy and social responsibility



# Intelligent System Antecedents: Language and Communication

- Information to communicate
  - Meaningful utterances (proto-languages, 100,000-200,000 years ago, ~age of homo sapiens)
  - Music and mimicry (e.g., talking drum: “the tones of the syllables of conventional phrases”\*)
  - Culturally distinct oral languages
  - Subject-Object-Verb order
  - Storytelling

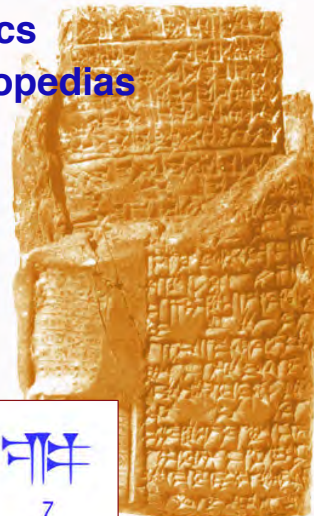


\* Roger Clarke, missionary, ~1840, in *The Information*, J. Gleick

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# Intelligent System Antecedents: Drawing, Symbols, and Writing

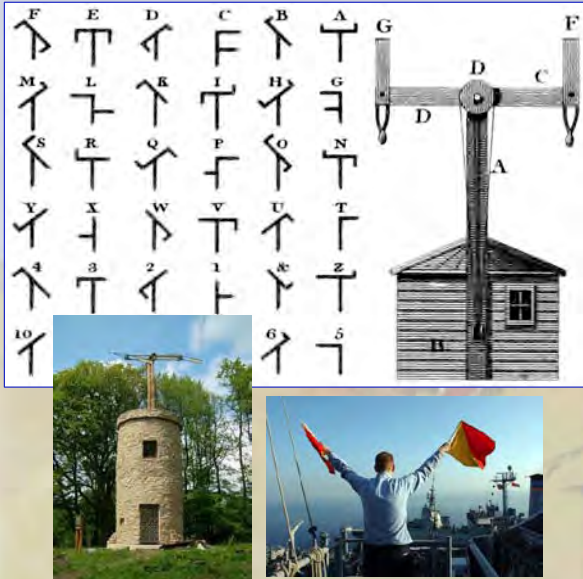
- Pictures -> pictographs -> cuneiform
- Alphabets, written words, and grammar
- Numbers, logic, and mathematics
- Books -> dictionaries -> encyclopedias




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# Intelligent System Antecedents: Codes and Long-Distance Signaling

**Semaphore Line Code**

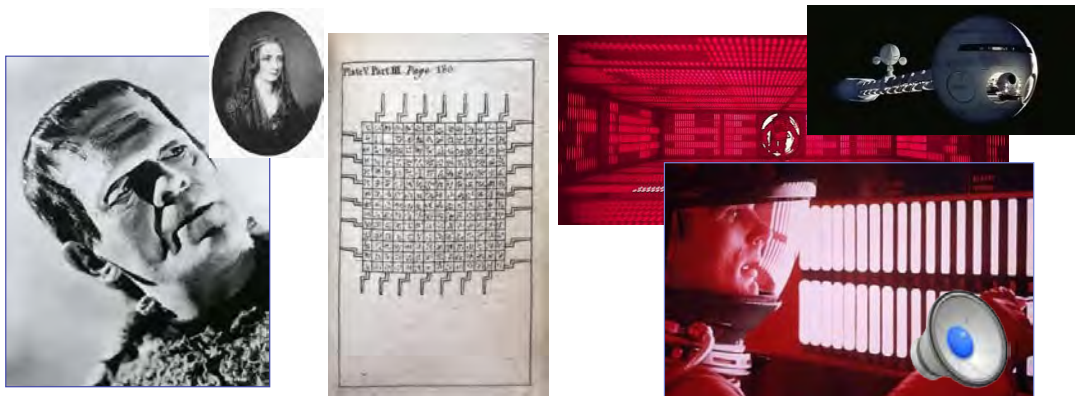


**Morse Code**



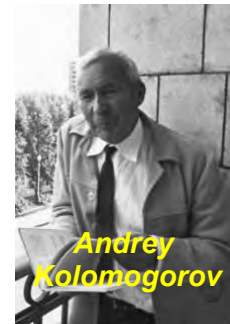
# Intelligent System Antecedents: Science Fiction

- Greek myths, drama, and poetry
- “The Engine”, *Gulliver’s Travels* (1726), Jonathan Swift
- *Dr. Frankenstein’s “Creature”* (1818), **Mary Shelley**: the first artificial human
- **HAL 9000**, in *2001: A Space Odyssey* (1968), Arthur C. Clarke



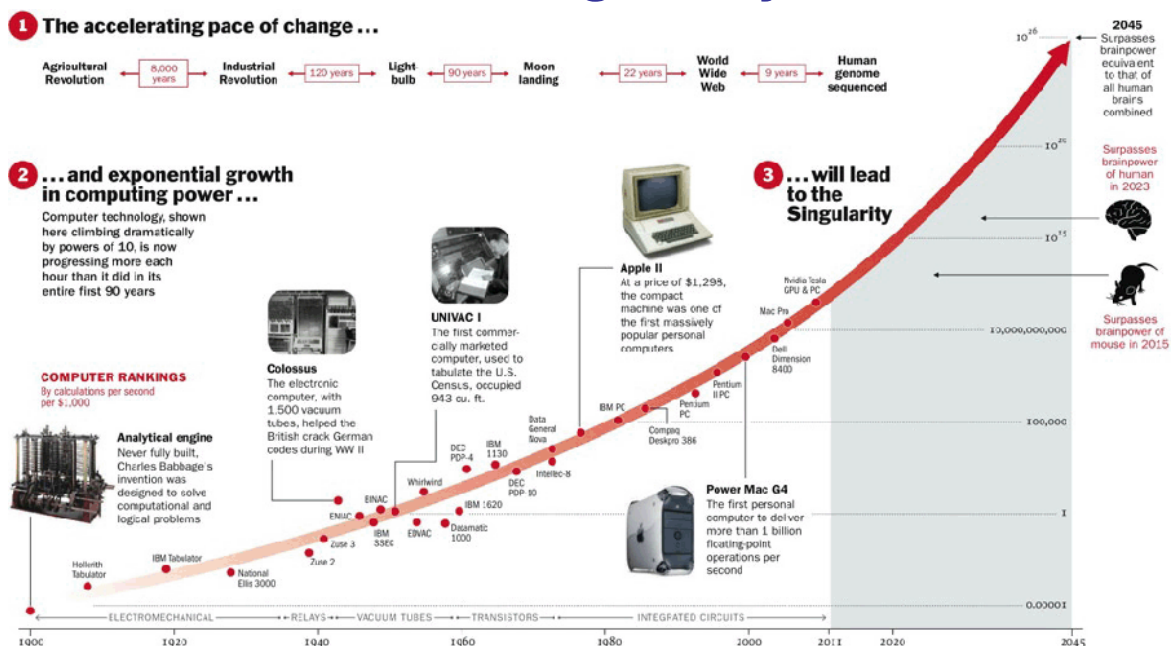


- **Early definitions of what we call “intelligent systems”**
  - “Scientific study of control and communication in the animal and the machine.” (**Norbert Wiener**, 1948)
  - “Science concerned with the study of systems of any nature which are capable of receiving, storing and processing information so as to use it for control.” (**Andrey Kolmogorov**, -)
  - “Art and science of manipulating defensible metaphors.” (**Gordon Pask**, 1961)
- **Other figures in cybernetics**
  - Jay Forrester, **Urban and world dynamics**
  - Warren McCulloch, **neural networks**
  - Walter Pitts, **neural networks**



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# The Singularity\*



\* **Ray Kurzweil, futurist**

# Will autonomous robots rule the world?



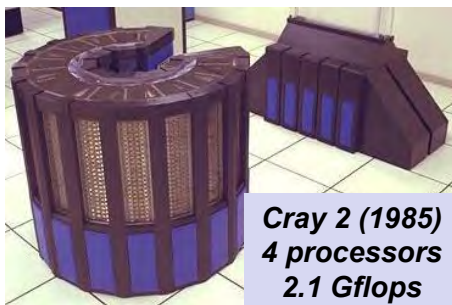
# The Brain vs. The Supercomputer

- **Human brain**
  - $38 \times 10^{15}$  ops/s
  - $3.5 \times 10^{15}$  bytes
  - 100 watts
- **Supercomputer**
  - NUDT Tienhe-2:  $33 \times 10^{15}$  flops
  - ~10 Mwatts
  - ~2,000 Gigafllops/kW
- **Singularity: plausible?**



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## But Wait ....



**Cray 2 (1985)**  
4 processors  
2.1 Gflops  
256 Mwords

=



**iPad Air 2 (2014)**  
Dual core  
Triple-processor: 1.3-8 Gflops  
128 Gbytes

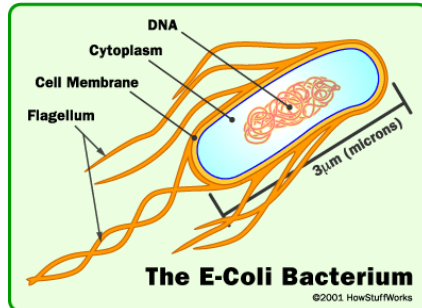
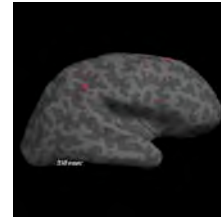
**iPad Air 2/iPhone 6 speed comparable to  
Top 500 List supercomputer in 1998**



**iPhone 6 (2014)**  
Dual core  
1.4-7.5 Gflops  
128 Gbytes  
0.5-2.5 watts

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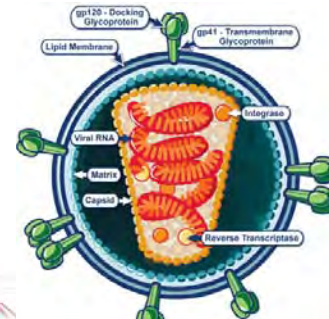
# What Makes A System “Intelligent”?



~1-2  $\mu\text{m}$   
Genome: 5 million base pairs  
No brain



Copepod, 1-2 mm  
Genome: 5 billion base pairs  
Brain: ~100  $\mu\text{m}$



**HIV**  
Genome: 10,000 base pairs  
No brain

**Human Genome:**  
3.2 billion base pairs

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## Some “Artificially Intelligent Systems”

- **Eliza**, Weizenbaum, 1976  
– <http://www.manifestation.com/neurotoys/eliza.php3>
- **SIRI**, voice response systems
- Statistical decision theory
- Symbolic computation (*Mathematica*, *Maple*)
- Theorem-proving s/w
- Chess, checkers, computer games
- Health/Financial Planning s/w
- *MapQuest*, *Google*, *Wikipedia*, *Alpha*
- GPS navigation

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# Ethics of Intelligent Systems

- **“Big Data”, data mining**
- Intellectual property
- Commercial Entities
  - Google
  - Facebook
  - Sqrri
  - Credit card industry
  - Violent video games
- Government Entities
  - NSA
    - Accumulo
    - PRISM



[http://en.wikipedia.org/wiki/PRISM\\_\(surveillance\\_program\)](http://en.wikipedia.org/wiki/PRISM_(surveillance_program))

[http://en.wikipedia.org/wiki/Intellectual\\_property](http://en.wikipedia.org/wiki/Intellectual_property)

[http://en.wikipedia.org/wiki/Blue\\_box](http://en.wikipedia.org/wiki/Blue_box)

[http://en.wikipedia.org/wiki/Anonymous\\_\(group\)](http://en.wikipedia.org/wiki/Anonymous_(group))

- Whistle-Blowing
- WikiLeaks.org
- Private vs. Public Domain
- Privacy vs. security
- Encryption
- Hacking
  - Blue box
  - Anonymous

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[http://en.wikipedia.org/wiki/Nineteen\\_Eighty-Four](http://en.wikipedia.org/wiki/Nineteen_Eighty-Four)

## *Intelligent System Structures*

## Essential Abilities for Intelligence

(Gödel, Escher, Bach, D. Hofstadter, 1979)



- Respond flexibly to unforeseen situations
  - Take advantage of fortuitous circumstances
  - Make sense of ambiguity or contradiction
- Recognize relative importance of information
- Find similarities and differences among things
- Generate novel ideas
  - Synthesize new ideas from old concepts
  - “Think different”

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## Cognitive and Biological Paradigms

### Thinking

- Syntax (form) and Semantics (meaning)
- Algorithmic vs. Non-Algorithmic Behavior
- Consistency, Emotion, "The Collective Subconscious"
- Generating Alternatives
- Randomized Search

### Consciousness

- Self-Awareness and Perception
- Creativity, Wisdom, and Imagination
- Common Sense, Understanding, and Judgment of Truth
- Learning by Example

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# Qualities of Thought

## Conscious Thought

- Awareness
- Focus
- Reflection
- Rehearsal
- **Declarative** Processing of Knowledge or Beliefs

## Unconscious Thought

- **Subconscious Thought**
  - . **Procedural** Processing
  - . Communication
  - . Learned Skills
  - . Subliminal Knowledge Acquisition
- **Preconscious Thought**
  - . Pre-attentive **Declarative** Processing
  - . Subject Selection for Conscious Thought
  - . Learning and Concept Development
  - . Information Pathway to Memory
  - . Intuition

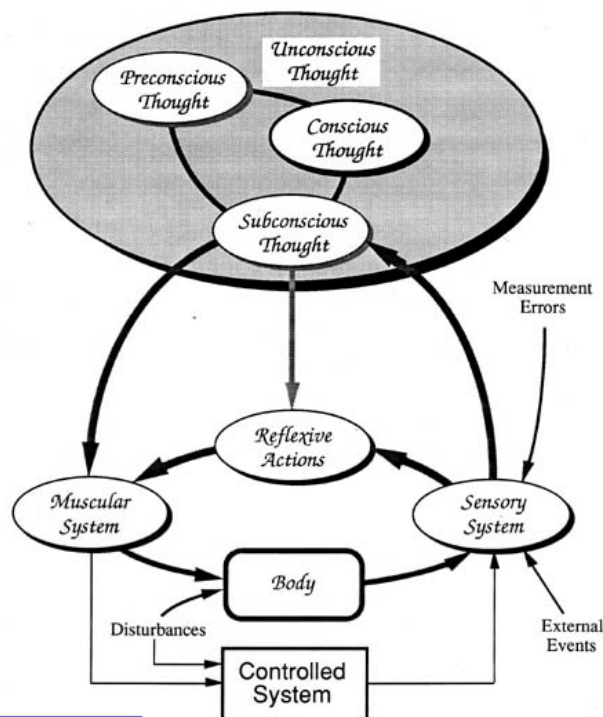
## Reflexive Behavior

- Instantaneous Response to Stimuli
- Elementary, Forceful Actions
- Stabilizing Influence
- Simple Goals

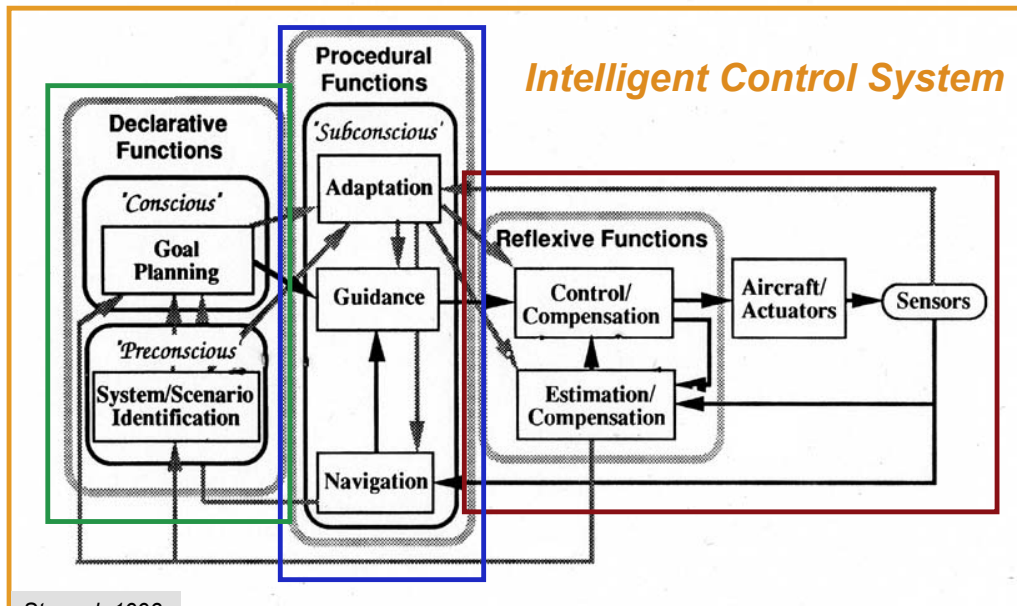
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## Hierarchy of Declarative, Procedural, and Reflexive Actions

- **Conscious Thought**
- **Unconscious Thought**
  - **Subconscious Thought**
  - **Preconscious Thought**
- **Reflexive Behavior**



# Elements of Intelligent Control



Stengel, 1993

**Declarative Functions**  
**Procedural Functions** modeled by  
**Reflexive Functions**

*Expert Systems, Decision Trees*  
*Estimation and Control "Circuits"*  
*Control Laws, Neural Networks*

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## Biological Paradigms for Control

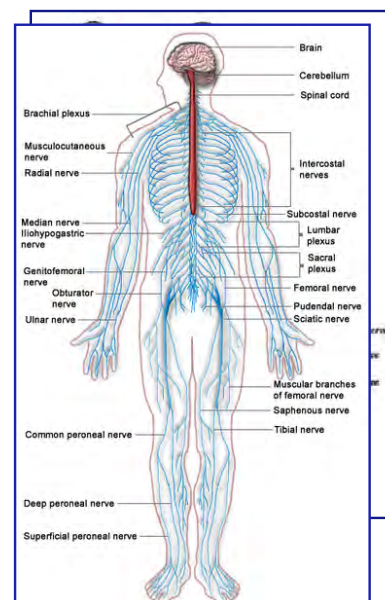
Short, Dedicated, Parallel Channels for  
**High-Bandwidth, High-Resolution**  
 Information (vision, sound, and balance)

**Dissimilar** but Related Sensory Inputs

**Hierarchical and Redundant Structures**

**Pairing** Allows Graceful Degradation of  
 Sensors and Effectors

**Richness** of Sensory Information



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## Math Review

- *Scalars and Vectors*
- *Sums and Multiplication*
- *Inner Product*
- *Derivatives and Integrals*

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## Scalars and Vectors

- **Scalar**: usually lower case:  $a, b, c, \dots, x, y, z$
- **Vector**: usually bold or with underbar:  $\mathbf{x}$  or  $\underline{x}$ 
  - Ordered set
  - Column of scalars
  - Dimension =  $n \times 1$

$$\mathbf{x} = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} ; \quad \mathbf{y} = \begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix}$$

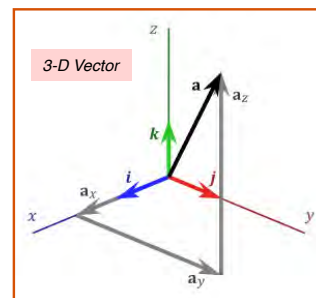
$3 \times 1$

$4 \times 1$

**Transpose**: interchange rows and columns

$$\mathbf{x}^T = \begin{bmatrix} x_1 & x_2 & x_3 \end{bmatrix}$$

$1 \times 3$



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# Multiplication of Vector by Scalar

Multiplication of **vector by scalar** is associative, commutative, and distributive

$$a\mathbf{x} = \mathbf{x}a = \begin{bmatrix} ax_1 \\ ax_2 \\ ax_3 \end{bmatrix}$$

$$a(\mathbf{x} + \mathbf{y}) = (\mathbf{x} + \mathbf{y})a = (a\mathbf{x} + a\mathbf{y})$$

$$\dim(\mathbf{x}) = \dim(\mathbf{y})$$

$$a\mathbf{x}^T = \begin{bmatrix} ax_1 & ax_2 & ax_3 \end{bmatrix}$$

- Could we add  $(\mathbf{x} + a)$  ? • Only if  $\dim(\mathbf{x}) = (1 \times 1)$

- MATLAB allows it as an “overloaded function”  
[https://en.wikipedia.org/wiki/Function\\_overloading](https://en.wikipedia.org/wiki/Function_overloading)

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## Addition

Conformable vectors and matrices are **added term by term**

$$\mathbf{x} = \begin{bmatrix} a \\ b \end{bmatrix} ; \quad \mathbf{z} = \begin{bmatrix} c \\ d \end{bmatrix}$$

$$\mathbf{x} + \mathbf{z} = \begin{bmatrix} a + c \\ b + d \end{bmatrix}$$

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## Inner (Dot) Product

Inner (dot) **product of vectors** produces a scalar result

$$\mathbf{x}^T \mathbf{x} = \mathbf{x} \bullet \mathbf{x} = \begin{bmatrix} x_1 & x_2 & x_3 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$$

$(1 \times m)(m \times 1) = (1 \times 1)$

$$= (x_1^2 + x_2^2 + x_3^2)$$

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## Derivatives and Integrals of Vectors

Derivatives and integrals of vectors are **vectors of derivatives and integrals**

$$\frac{d\mathbf{x}}{dt} = \begin{bmatrix} dx_1/dt \\ dx_2/dt \\ dx_3/dt \end{bmatrix}$$

$$\int \mathbf{x} dt = \begin{bmatrix} \int x_1 dt \\ \int x_2 dt \\ \int x_3 dt \end{bmatrix}$$

$$\mathbf{x}(t) = \begin{bmatrix} 7 \\ 8t \\ 9t^2 \end{bmatrix}; \quad \frac{d\mathbf{x}(t)}{dt} = \begin{bmatrix} 0 \\ 8 \\ 18t \end{bmatrix}$$

$$\mathbf{x}(t) = \begin{bmatrix} 7 \\ 8t \\ 9t^2 \end{bmatrix}; \quad \int \mathbf{x}(t) dt = \begin{bmatrix} 7t + x_1(0) \\ 8t^2/2 + x_2(0) \\ 9t^3/3 + x_3(0) \end{bmatrix}$$

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# MATLAB Code for Math Review

```
% MAE 345 Lecture 1 Math Review
% Rob Stengel

clear
disp(' ')
disp('=====')
disp('>>>MAE 345 Lecture 1 Math Review<<<')
disp('=====')
disp(' ')
disp(['Date and Time are ', num2str(datestr(now))]);
disp(' ')

% Scalars and Vectors
a = 4 % Scalar
x = [1; 2; 3] % Column Vector
y = [4; 5; 6; 7] % Column Vector

% Vector Transpose
xT = x'
yT = y'

% Multiplication by Scalar
w = a * x
v = x * a
wT = a * xT
```

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# MATLAB Code for Math Review

```
% Vector Addition
zz = [8; 9; 10]
u = x + zz

% Inner (Dot) Product
zzz = x' * x

% Symbolic Toolbox
disp(' ')
disp('Symbolic Toolbox')
disp(' ')
syms x y z z1 z2 z3 z4

y = x * x % Define Function
z = diff(y) % Differentiate Function
z1 = int(y) % Integrate Function

z2 = [x; y; z] % Column Vector

z3 = diff(z2) % Derivative of Column Vector
z4 = int(z2) % Integral of Column Vector
```

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# MATLAB Command Window Output for Math Review

<pre>===== &gt;&gt;&gt;MAE 345 Lecture 1 Math Review&lt;&lt;&lt; ===== Date and Time are 24-May-2013 12:31:13  a = 4  x =     1     2     3  y =     4     5     6     7  xT = 1     2     3 yT = 4     5     6     7</pre>	<pre>W =     4     8    12  V =     4     8    12  wT = 4     8    12  zz =     8     9    10  u =     9    11    13  zzz = 14</pre>	<pre>Symbolic Toolbox  y = x^2  z = 2*x  z1 = x^3/3  z2 =     x    x^2   2*x  z3 =     1    2*x     2  z4 =   x^2/2   x^3/3    x^2</pre>
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***Next Time:***  
***Mobile Robots, Position,***  
***and Orientation***

# *Supplemental Material*

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## Philosophical Questions about Machine-Intelligent Control

Must intelligent machines be **better than humans**?

Can machines make decisions without **human  
supervision**?

What information should machines **display to human  
operators**?

May machine-intelligent systems make **mistakes**?

May intelligent systems **gamble** when uncertain?

Can (or Should) intelligent systems exhibit  
**"personality"**?

Can (or Should) intelligent systems express  
**"emotion"**?

Is **on-line learning** necessary or desirable for machine  
intelligence?

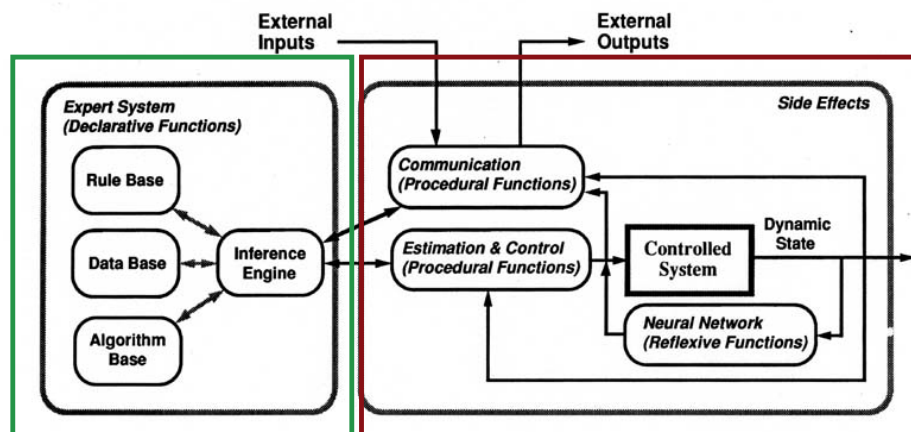
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# Knowledge Acquisition, Behavior, Aging, and Control

Learning Requires **Error or Incompleteness**  
Biological **Adaptation** is a Slow Process  
**Rest** is an Essential Feature  
REM Sleep: **Learning, Consolidating, and Pruning** Knowledge  
**Birth-Life-Death** Cycle  
Central Nervous System **Does Not Regenerate**  
Short-Term Memory Recedes into **Long-Term Memory** or is  
Forgotten  
Humans Form **Chords of Actions**  
**"Knee-Jerk" Reactions**

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## An Artificial Intelligence View of Intelligent Control



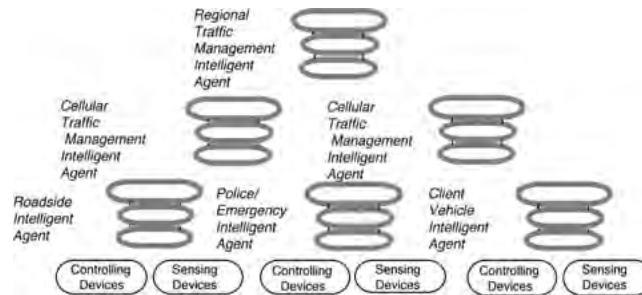
**Declarative Functions**  
**Procedural Functions** modeled by  
**Reflexive Functions**

**Expert Systems, Decision Trees**  
**Estimation and Control "Circuits"**  
**Control Laws, Neural Networks**

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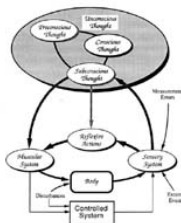
# Intelligent Vehicle/ Highway System

- **Taxonomies of Declarative, Procedural, and Reflexive Functions (Chao, 1993)**

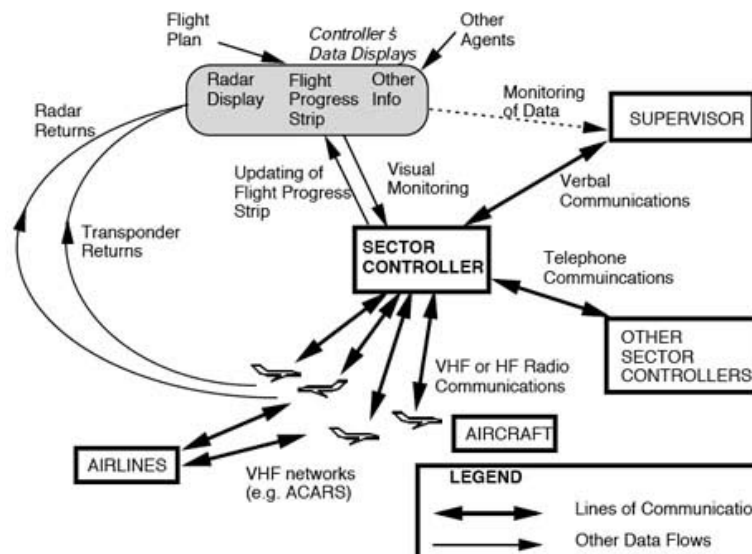


- **Automobile**
  - **Declarative**
    - Determine Destination
    - Traffic Management Advice
  - **Procedural**
    - Lane Change
    - Transmit Information
  - **Reflexive**
    - Steering
    - Speed Control
- **Emergency Management System**
  - **Declarative**
    - Predict Emergency Scenarios
    - Optimize Situation Handling
  - **Procedural**
    - Dispatch Emergency Services
    - Resolve Specific Incidents
  - **Reflexive**
    - Provide Medical Treatment
    - Control Traffic at Scene

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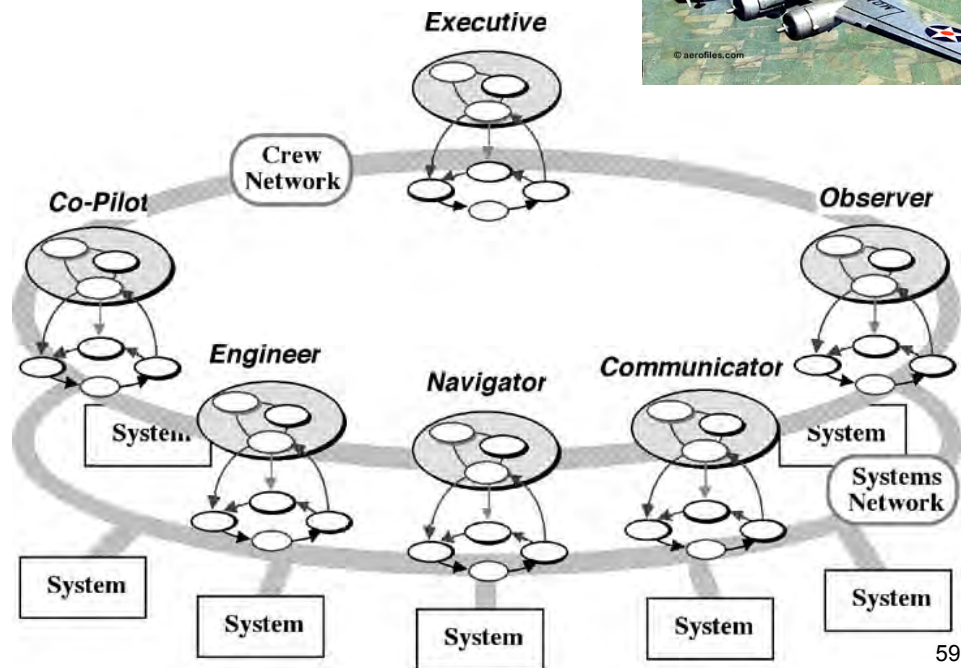
# Intelligent Aircraft/ Airspace System



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# System of Systems



## Superheroes, Androids, Gynoids, and Cyborgs

- Superman



- Androids



- Gynoids



- Cyborgs



- Bionic man and woman



# MAE 345 Course Learning Objectives

- Understanding of the dynamics and control of robotic devices.
- Understanding of cognitive and biological paradigms for system design.
- Ability to estimate quantitatively the behavior of dynamic systems.
- Facility in the application of decision-making concepts, including neural networks, expert systems, and genetic algorithms.
- Familiarity with the components of systems for decision-making and control, such as sensors, actuators, and computers.
- Ability to apply a systems-engineering approach to the analysis, design, and testing of robotic devices.
- Demonstration of computational problem-solving, through thorough knowledge, application, and development of analytical software.
- Appreciation of the historical context within which robotics and intelligent systems have evolved.
- Appreciation of the global and ethical impact of robotics and intelligent systems in the context of contemporary society.
- Competence in presenting ideas orally and in writing.