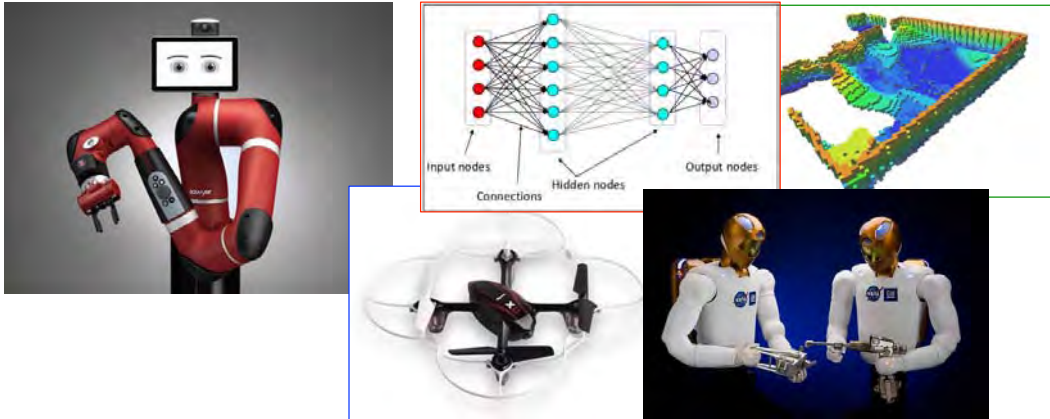


Robotics and Intelligent Systems

Robert Stengel

Robotics and Intelligent Systems
MAE 345 Princeton University, 2017



www.princeton.edu/~stengel/MAE345.html

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<http://www.princeton.edu/~stengel/MAE345.html>

1



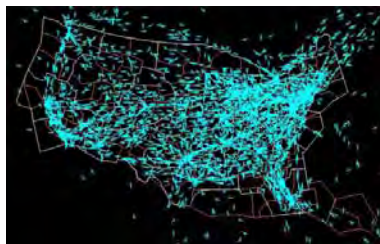
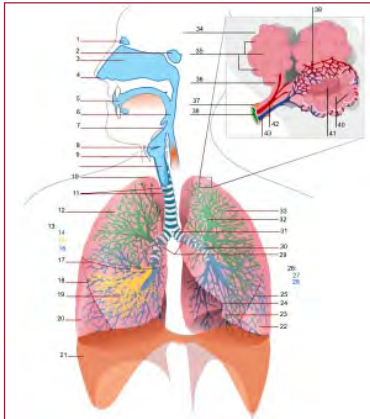
Robots and Robotics



- 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

2

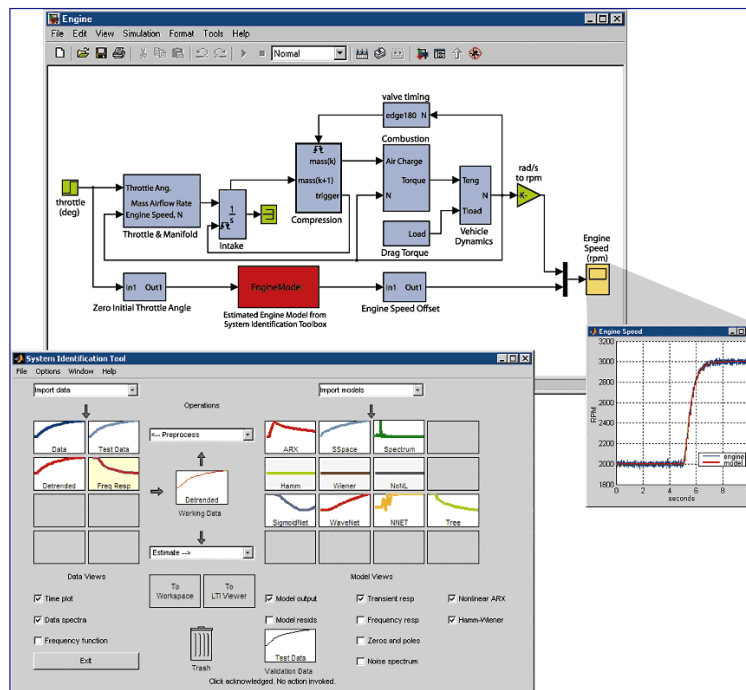
What are Systems?



- **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**

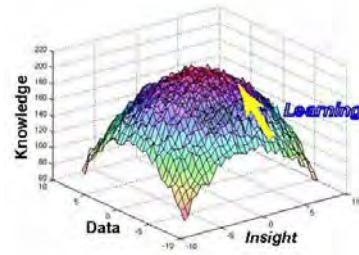
3

Representing Dynamic Systems and Their Performance



4

Intelligent Systems

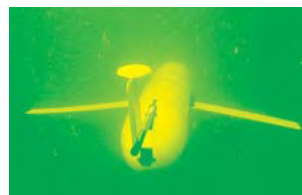


- **Systems that**
 - perform useful functions driven by desired goals and current knowledge
 - emulate biological and cognitive processes
 - process information to achieve objectives
 - learn by example or from experience
 - adapt functions to a changing environment
- **Learning: Data + Insight → Knowledge**

5

Biomimetics (Bionics)

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



6

Syllabus

- Overview and Preliminaries
- Coordinates and Kinematics
- Mobile Robots
- Path Planning
- Articulated Robots
- Rigid-Body Dynamics
- Dynamic Effects of Feedback Control
- 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
- Classification of Data Sets
- Neural Networks
- Machine Learning, Communication, and Information
- Expert Systems
- State and Parameter Estimation
- Stochastic and Adaptive Control
- Task Planning and Multi-Agent Systems

7

Preliminaries

- **Office Hours**
 - *Mon Wed, 1:30-3pm*
- **Assistant in Instruction:**
- **MATLAB / SimuLink / SimMechanics**
- **Course Home Page, Syllabus, and Links**
 - 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*

<ul style="list-style-type: none">● ~GRADING<ul style="list-style-type: none">- Class participation: 15%- Quick Quizzes: 10%- Assignments: 45%- Term Paper: 30%- Late policy: 10% reduction/day

8

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 (unrelated surfing is negative participation)***

9

Collaborative Learning

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

10

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://getit.princeton.edu/>

11

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>

12

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*

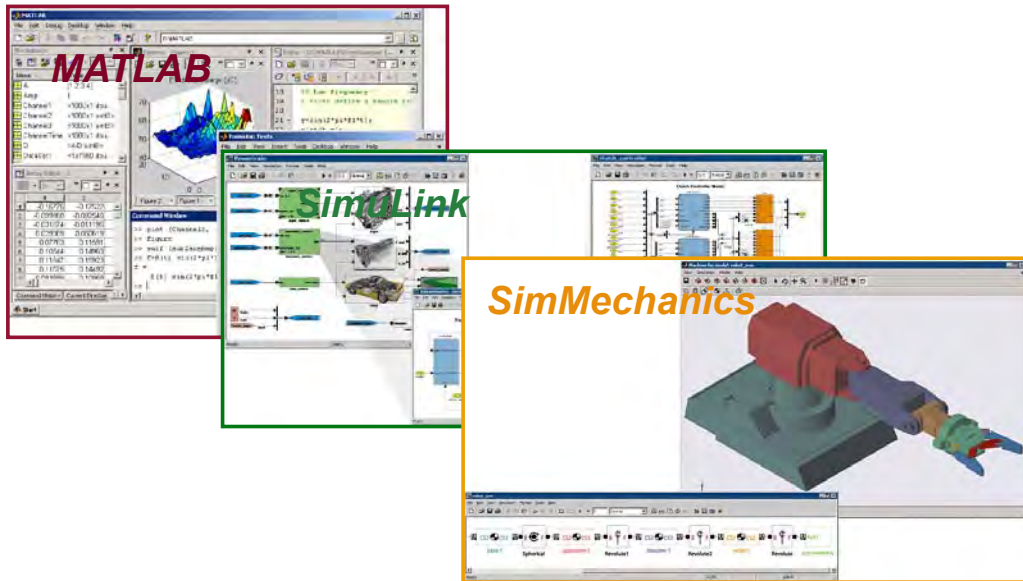
13

Assignment # 1 **due: September 22, 2017**

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

Submit via Blackboard

Computational Tools



15

A Little Historical Background

16



Robotic Antecedents: Antiquity

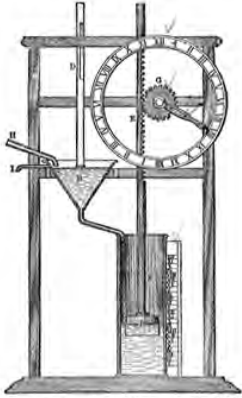


FIG. 29. — A COMMON FORM OF CLEPSYDRA IN GREEK AND ROMAN TIMES.

- **Aristotle, 4th 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, 2nd c. BC
 - Automata, clock works, *et al* (da Vinci's Lion, 15th c. BC ; Zytgloggeturm, Bern, 12th and 16th c.)
- **Elektro, 1939 NY World's Fair**



17

Robotic Antecedents: Science Fiction

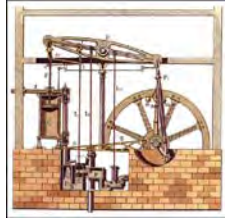
- **“Robot” = “worker” in Slavic**
 - Karel Capek's 1921 play, *RUR* (*Rossum's Universal Robots*), in which machines took over the world
- **Short story in collection, *I, Robot*, Isaac Asimov, 1942**
 - Code of ethics for robots
- **Victorian pulp fiction (Frank Reade's *Electric Man*, the *Electric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



WITH: Scott Hicks, Julie Ann Myers, Michael Miyazaki, Steve Whitte, Michael Mack, Ron Woods, Kim Curtis, Karen Mitchell, Sara H. Truog and Joshua Barrett
 DESIGNERS: Gregory Brian, Azura Hassan, Veronika Szilus, Christopher Kahle, Amy Anderson and Kristin Guss. STAFF: Nicole M. McTain, David Marshall, Tadas Osmolskis, Joshua Speiser and Mandie Zell. Produced by Karen Mitchell

18

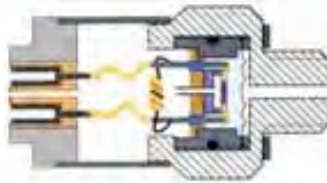
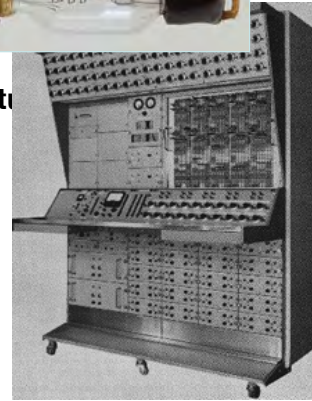
Robotic Antecedents: Industry



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

- **1900-30s: Enabling Technologies**

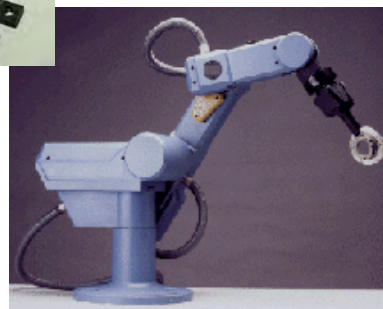
- Vacuum tubes
- Electric motors
- Hydraulic/pneumatic actuators
- Sensors
- Analog computation
- Control theory



19

Toward Autonomous Robots

- **1940s: World War II**
 - Teleoperators
 - Fire control systems
 - Aerial drones
 - Numerically controlled machines
 - Chemical process control
- **1947: Transistor invented**
- **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



20



Elements of Robotic Devices

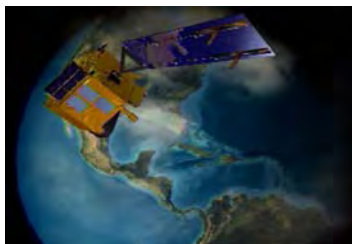
- Structure
- Power source
- Actuation
- Sensing
- Locomotion
- Environmental Interaction
- Human-machine interaction
- Guidance
- Navigation
- Control



21

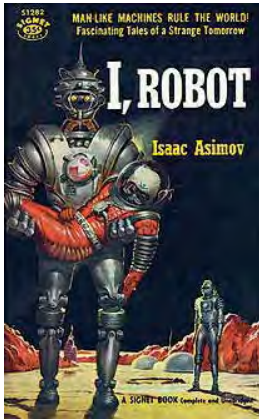
Autonomous Robots

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



22

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



Ethics of Robotics

RoboEthics = Human-Centered Ethics?

Human dignity, respect, privacy, and rights

Equality and justice

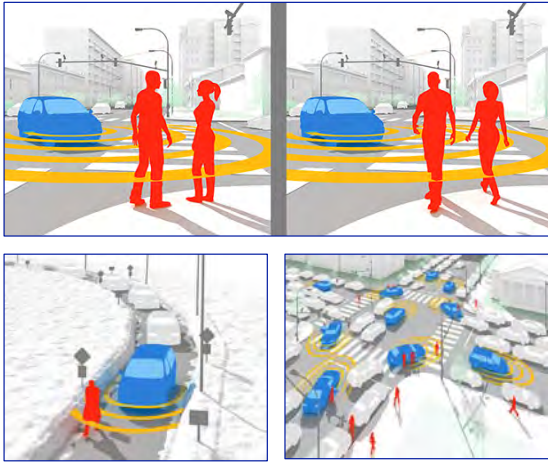
Benefit and harm

Discrimination and diversity

Individual autonomy and social responsibility



Human-Robot Interaction: *Signaling Intent*



The Big Problem With Self-Driving Cars Is People,
Rodney Brooks, *IEEE Spectrum*, Jul/Aug 2017

- What should the autonomous car do in uncertain situations?
- What should pedestrians do to preserve safety and efficient travel?
- How can the mix between human and computer drivers be handled?
- What takes the place of *eye contact*?

25

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

26

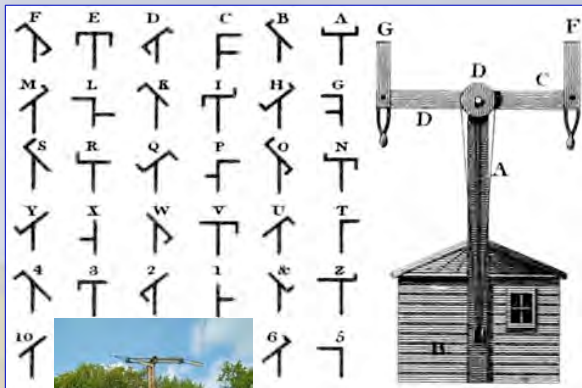
Intelligent System Antecedents: Drawing, Symbols, and Writing

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

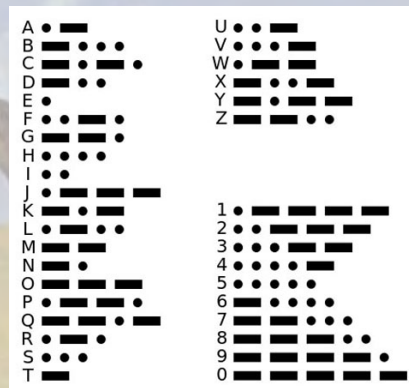


Intelligent System Antecedents: Codes and Long-Distance Signaling

Semaphore Line Code

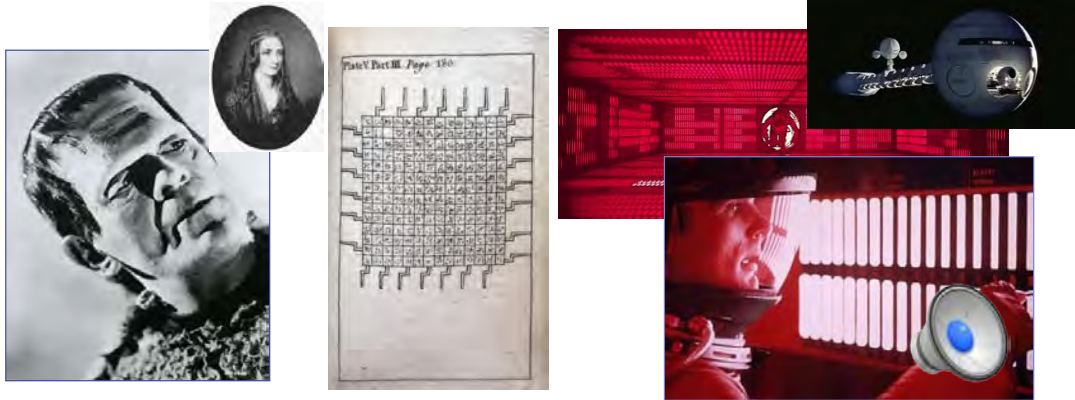


Morse Code



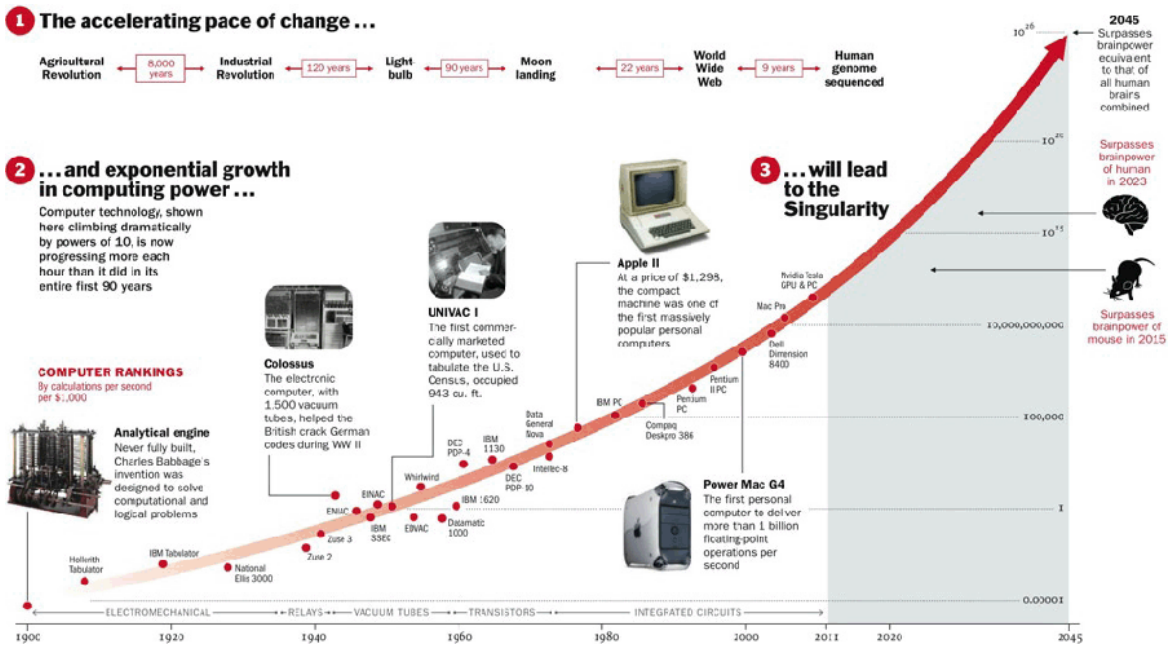
Intelligent System Antecedents: Science Fiction

- 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



29

The Singularity*

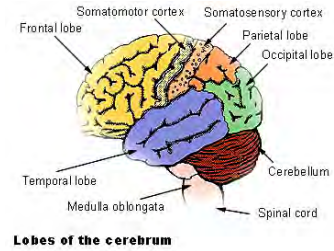


* Ray Kurzweil, futurist **Will autonomous robots rule the world?**

30

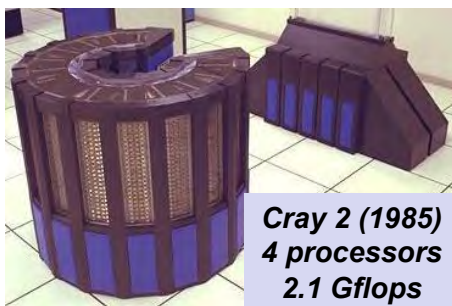
The Brain vs. The Supercomputer

- **Human brain**
 - 38×10^{15} ops/s
 - 3.5×10^{15} bytes
 - 100 watts
- **Supercomputer**
 - NUDT Tienhe-2: 33×10^{15} flops (2012)
 - ~10 Mwatts
 - ~2,000 Gigaflops/kW
- **Singularity: plausible?**



31

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 speed comparable to Top 500 List supercomputer in 1998

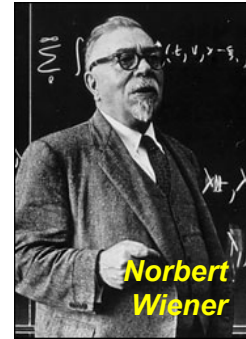


iPhone 8 (2017)
Dual core
5-20 Gflops
256 Gbytes
0.5-2.5 watts

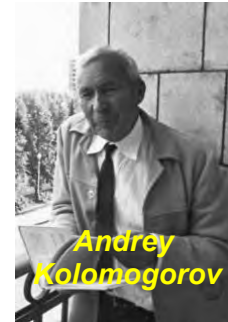
32

Intelligent System Antecedents: Cybernetics

- 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 McCullough, neural networks
 - Walter Pitts, neural networks



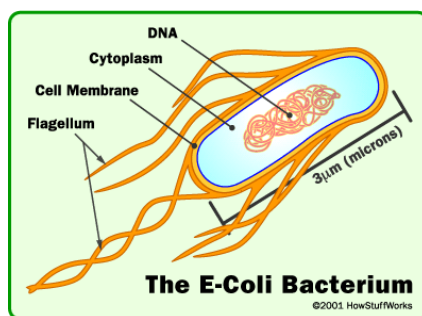
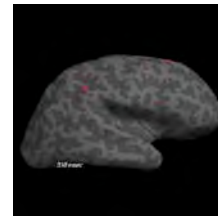
Norbert Wiener



Andrey Kolmogorov

33

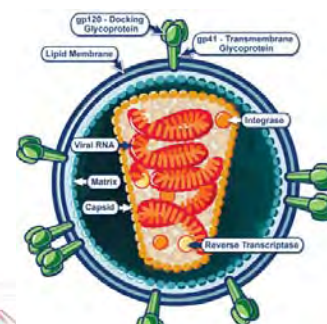
What Makes A System “Intelligent”?



~1-2 μm
Genome: 5 million base pairs
No brain



Copepod, 1-2 mm
Genome: 5 billion base pairs
Brain: ~100 μm



HIV
Genome: 10,000 base pairs
No brain

Human Genome:
3.2 billion base pairs

34

Some “Artificially Intelligent Systems”

- *Eliza*, Weizenbaum, 1976
 - <http://www.manifestation.com/neurotoys/eliza.php3>
- *SIRI, Alexa, Echo*, 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

35

Ethics of Intelligent Systems

- “Big Data”, data mining
- Intellectual property
- Commercial Entities
 - Google
 - Facebook
 - Sqrrl
 - 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/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



http://en.wikipedia.org/wiki/Nineteen_Eighty-Four

36

Intelligent System Structures

37

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”

38

Cognitive and Biological Paradigms

Thinking

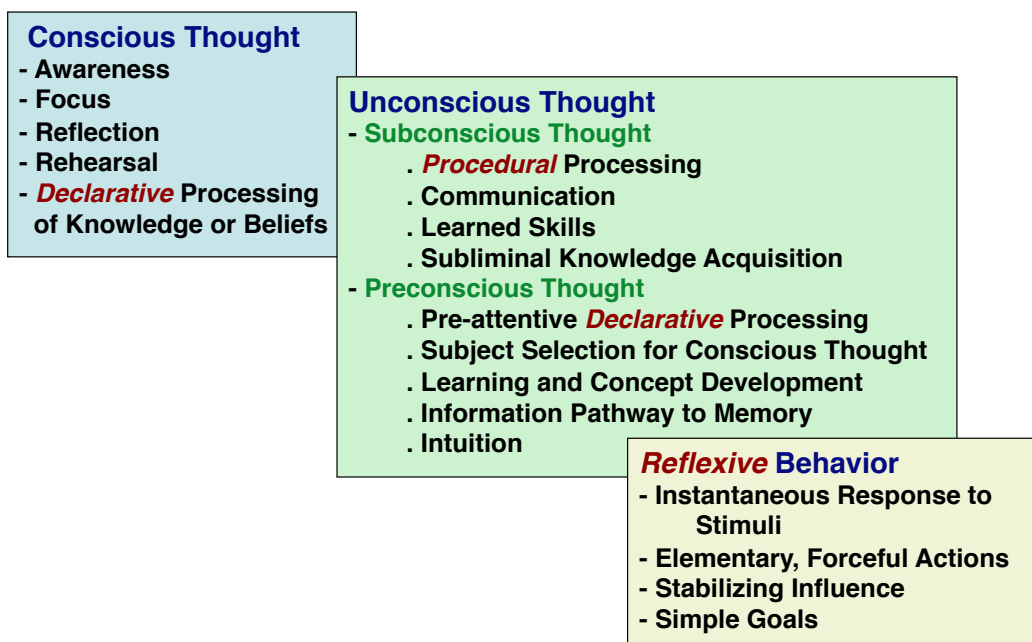
- Syntax (form) and Semantics (meaning)
- Algorithmic vs. Non-Algorithmic Behavior
- Consistency, Emotion, "The Collective Subconscious"
- Generating Alternatives
- Randomized Search

Consciousness

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

39

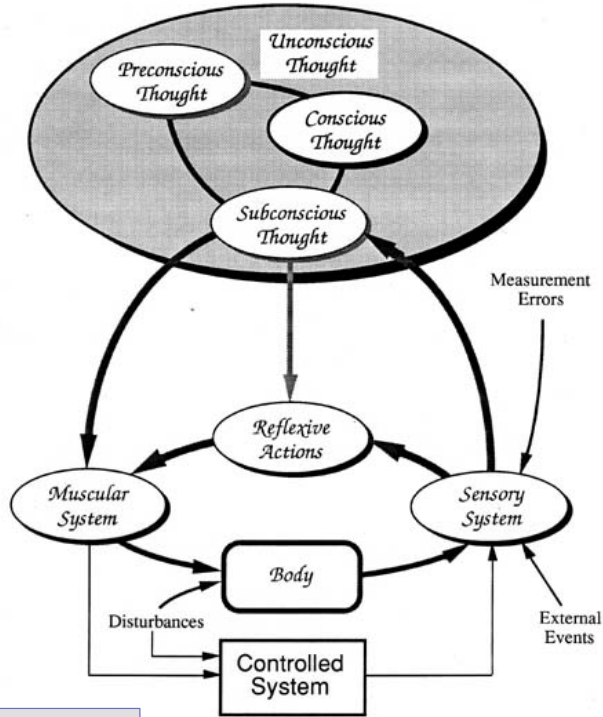
Qualities of Thought



40

Hierarchy of Declarative, Procedural, and Reflexive Actions

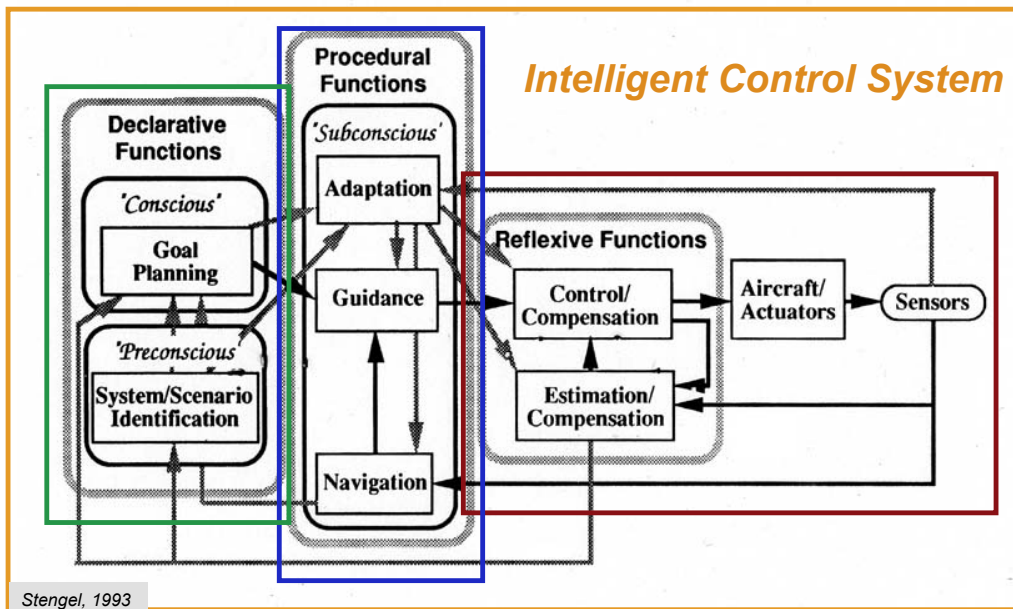
- Conscious Thought
- Unconscious Thought
 - Subconscious Thought
 - Preconscious Thought
- Reflexive Behavior



<http://www.princeton.edu/~stengel/TIFC.pdf>

41

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

42

Biological Paradigms for Control

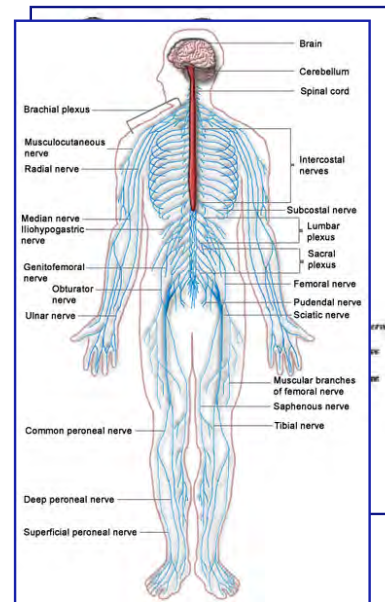
Short, Dedicated, Parallel Channels for **High-Bandwidth, High-Resolution** Information (vision, sound, and balance)

Dissimilar but Related Sensory Inputs

Hierarchical and Redundant Structures

Pairing Allows Graceful Degradation of Sensors and Effectors

Richness of Sensory Information



43

Math Review

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

44

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 = $n \times 1$

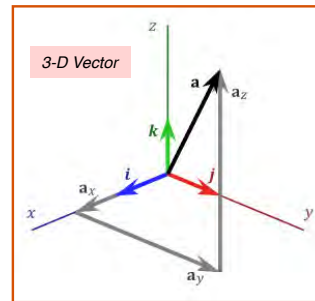
$$\mathbf{x} = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}; \quad \mathbf{y} = \begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix}$$

3×1 4×1

Transpose: interchange rows and columns

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

1×3



45

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

46

Addition

Conformable vectors and matrices are
added term by term

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

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

47

Inner (Dot) Product

Inner (dot) product of vectors produces a scalar result

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

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

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

48

Derivatives and Integrals of Vectors

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

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

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

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

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

49

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
```

50

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

```

51

MATLAB Command Window Output for Math Review

<pre> ===== >>>MAE 345 Lecture 1 Math Review<<< ===== 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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52

***Next Time:
Mobile Robots, Position,
and Orientation***

53

***Supplemental
Material***

54

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.

55

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?

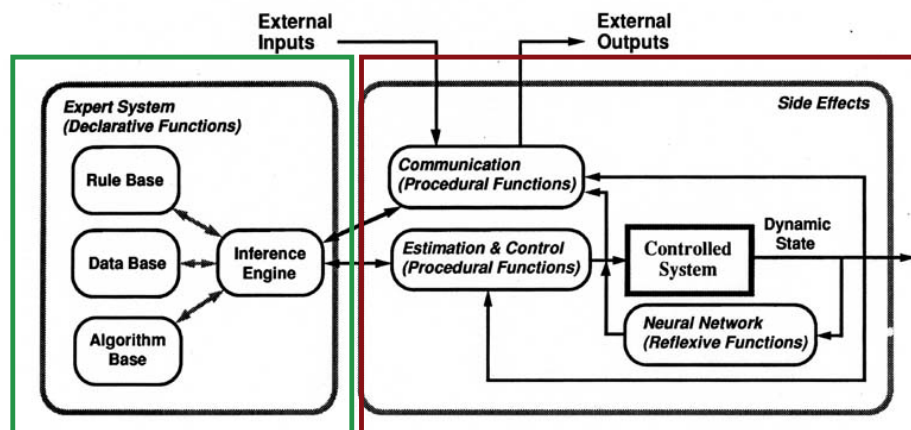
56

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

57

An Artificial Intelligence View of Intelligent Control



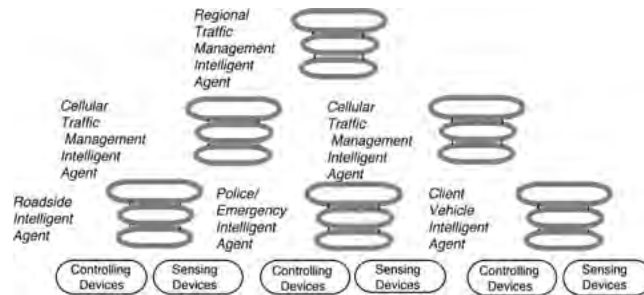
Declarative Functions
Procedural Functions modeled by
Reflexive Functions

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

58

Intelligent Vehicle/ Highway System

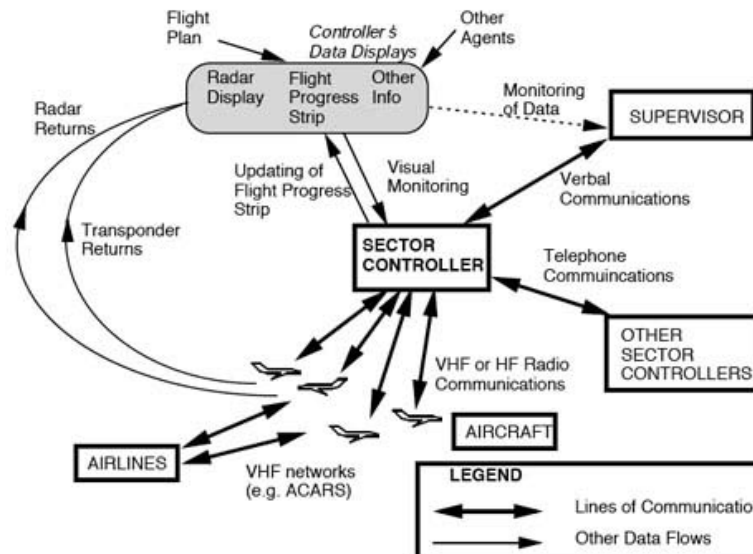
- Taxonomies of Declarative, Procedural, and Reflexive Functions (Chao, 1993)



- **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

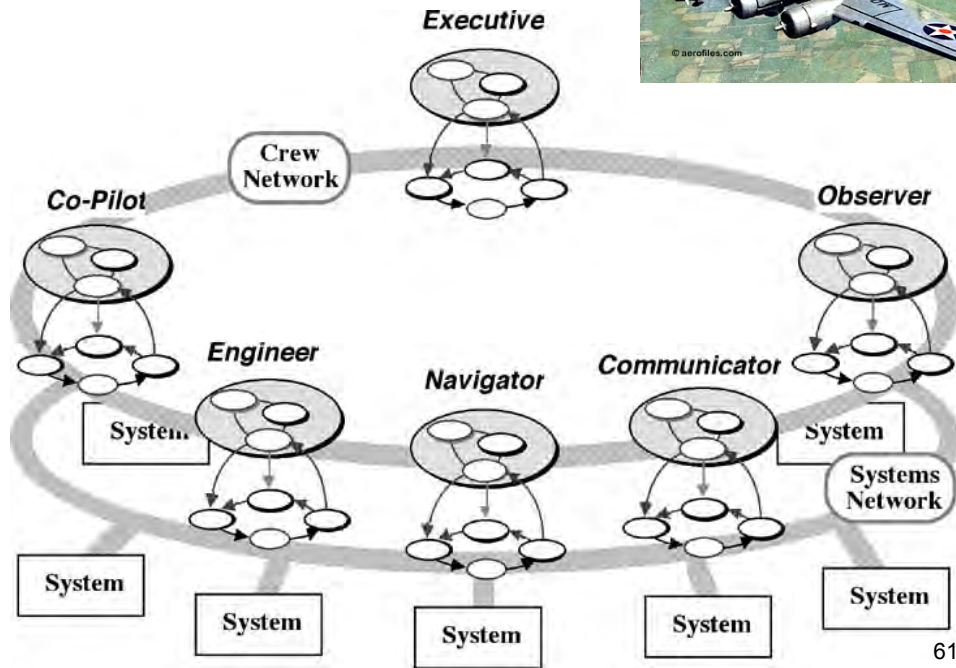
59

Intelligent Aircraft/ Airspace System



60

System of Systems



61

Superheroes, Androids, Gynoids, and Cyborgs

Superman



Androids



Gynoids



Cyborgs



Bionic man and woman



62