



**NANYANG
TECHNOLOGICAL
UNIVERSITY**

School of Mechanical & Aerospace Engineering

Design, Machine, Control, Intelligence

Keynote Speech

Key Steps Toward Development of Humanoid Robots

Acknowledgement

This research is mainly financed by the grants from Future Systems Directorate, Singapore Government

Ming XIE, PhD (France)

mmxie@ntu.edu.sg

<http://personal.ntu.edu.sg/mmxie>

ABOUT NTU

Vision and Mission



A great global university founded on science and technology, nurturing leaders and creating societal impact through interdisciplinary education and research.

Leadership



Professor Ho Teck Hua

President and Distinguished University Professor



Professor Christian Wolfrum

Deputy President and Provost

Ranked Among the Best in the World



3rd

Nature Index
Young University Rankings



1st

Times Higher Education
Young University Rankings



3rd

US News and World Report
Best Global Universities in Asia



4th

Times Higher Education
Asia University Rankings



15th

QS World University Rankings



4th

QS Asia University Rankings



27th

US News and World Report
Best Global University Rankings



30th

Times Higher Education
World University Rankings



10th

QS World's Most Photogenic Universities

Ranked Among the Best in the World



15-Year Sustainability Manifesto



Solidifying the University's position as a global leader in sustainability

- NTU's sustainability manifesto goals: carbon neutrality by 2035, halve net energy utilisation and new sustainability courses
- First university in the world to launch a sustainability-linked bond with an AAA credit rating from Moody's
- Sustainable campus with eight zero-energy buildings, the most amongst organisations in Singapore
- Home to two of Asia's largest wooden buildings, Gaia and The Wave
- Winner of ISCN's Whole Systems Approach Excellence Award in recognition of sustainable practices in the areas of research, education, community engagement, and infrastructure developments

Main Campus



200 hectares



State-of-the-art-facilities



25 halls of residence

The NTU Smart Campus is a living testbed of tomorrow's technologies and frequently named among the most beautiful campuses in the world.

Medical Campus



School of Medicine

Learning and research

Sports and recreation

Home to the Lee Kong Chian School of Medicine in Novena, Singapore's healthcare district. The school aims to be a model for innovative medical education and a centre for transformative research.

At a Glance



35,400 students

24,800 undergraduates
10,600 postgraduates

8,000

faculty, researchers and
staff from 73 countries

300,900 alumni

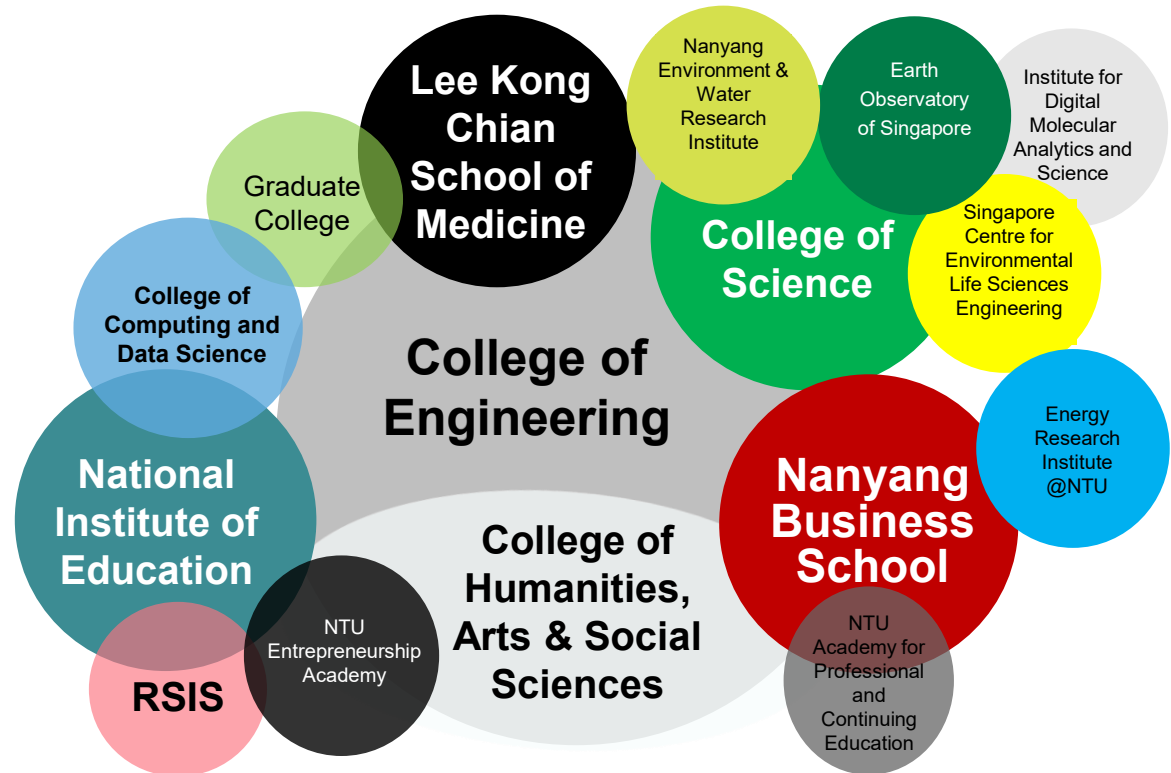
representing 172 nationalities

At a Glance

6
Colleges

15
Schools

**World-class institutes
& research centres**



NTU Academy for Professional and Continuing Education



- Consolidates continuing education and training capabilities and expertise within the University
- Enriches the lifelong learning experience of adult learners, including the University's alumni, making it easier for them to take charge of their own continuing education
- The FlexiMasters programme for continuing education at the Master's degree level, launched in 2020, has grown to more than 35 curricular offerings from all parts of the University

Global Alliance of Industries @ NTU



- Catalysing new university-industry partnerships through multiple consortia, corporate laboratories, multidisciplinary institutes and technology invention disclosures
- Over 250 industry partners and 20 corporate and joint labs with global entities such as Alibaba, Continental, Hewlett-Packard, Nanofilm Technologies, Rolls-Royce and Schaeffler

Top Industry Partners



Top Academic Partners





**NANYANG
TECHNOLOGICAL
UNIVERSITY**

School of Mechanical & Aerospace Engineering

Design, Machine, Control, Intelligence



Welcome You to NTU

ABOUT SPEAKER



Professor Xie Ming has been:

- Dean/Professor, School of Electrical Engineering and Control Science, Nanjing Tech University, China.
- Guest Professor, Huazhong University of Science and Technology, China.

Professor Xie Ming is now:

- President, Robotics Society of Singapore
- Editor-in-Chief, International Journal of Humanoid Robotics.
- Associate Professor, Nanyang Technological University, Singapore.

Professor Xie Ming has published:

- Three books in English
- Two edited books in English
- Two books in Chinese
- Over 40 International Journal Papers
- Over 100 International Conference Papers

Professor Xie Ming has received many awards and over 10 granted patents.

Ming XIE

Associate Professor (1999 - present)

<http://personal.ntu.edu.sg/mmxie>



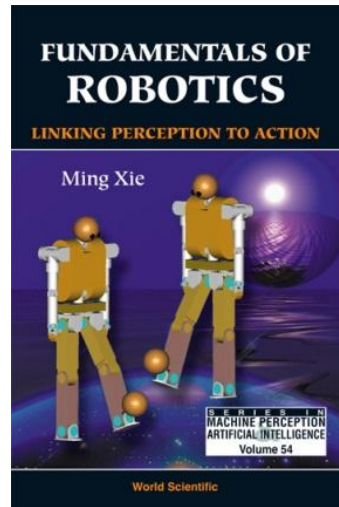
1984: B.Eng (China)

1986: Msc (France)

1989: Ph.D (France)

Recipient of Chinese Government's Overseas Scholarship (1984 - 1989)

2003



Knowledge Innovation

2008



Product Innovation

(Robot Driver)

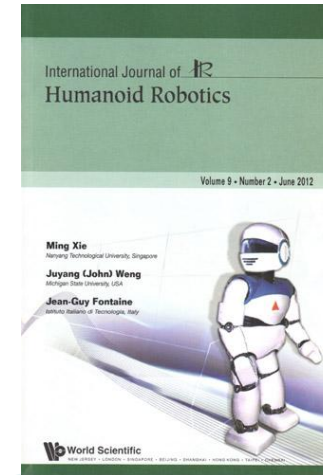
(Robot Worker)

Technology Innovation

Teaching Portfolio

1. Sensors
2. Robotics
3. Microprocessors
4. Machine Intelligence

2004

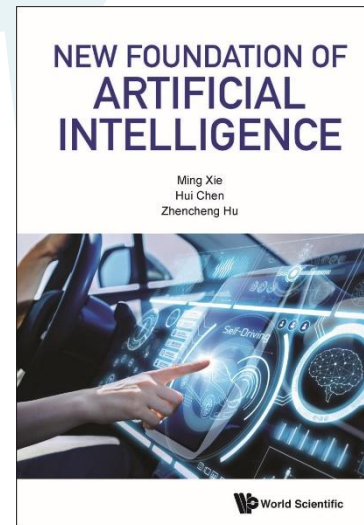


Social Service

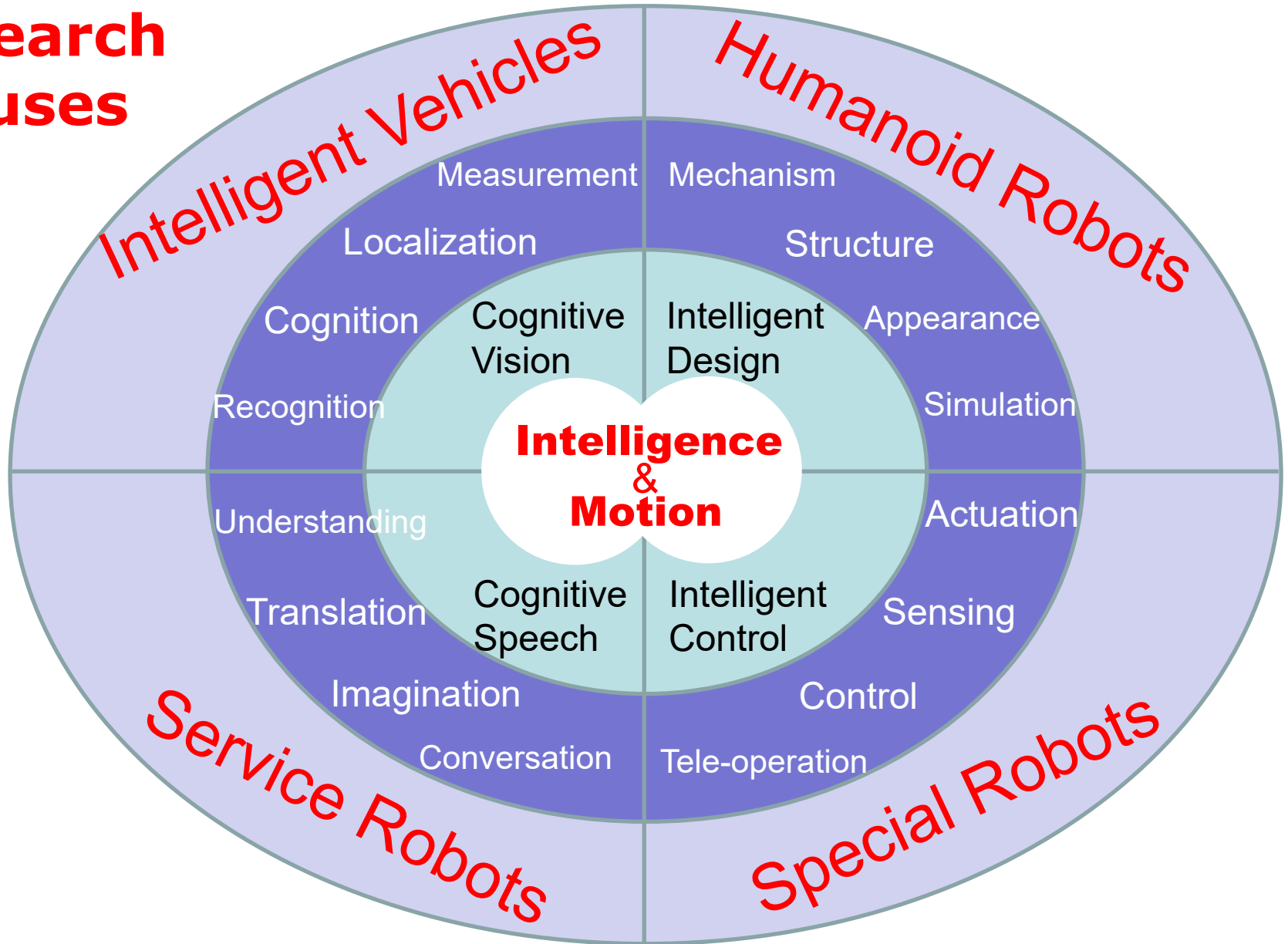
2010



2021



Research Focuses

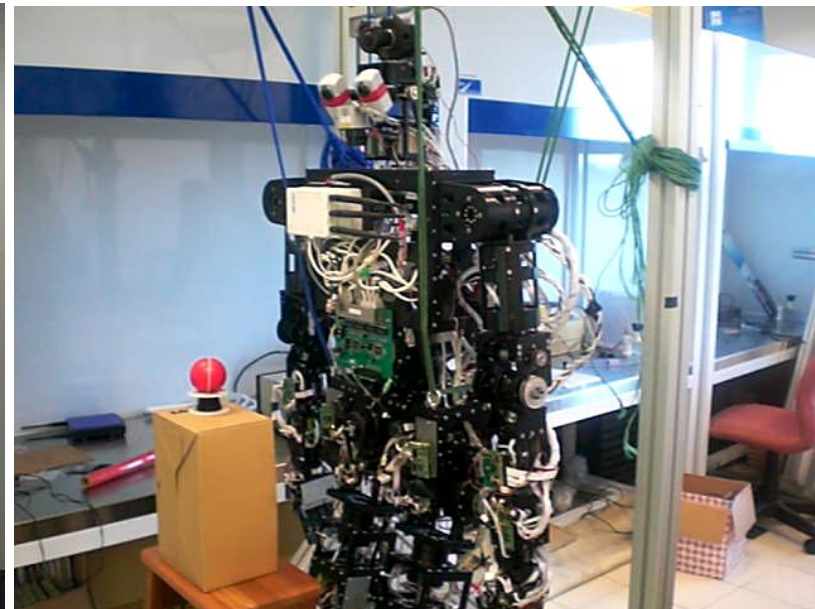
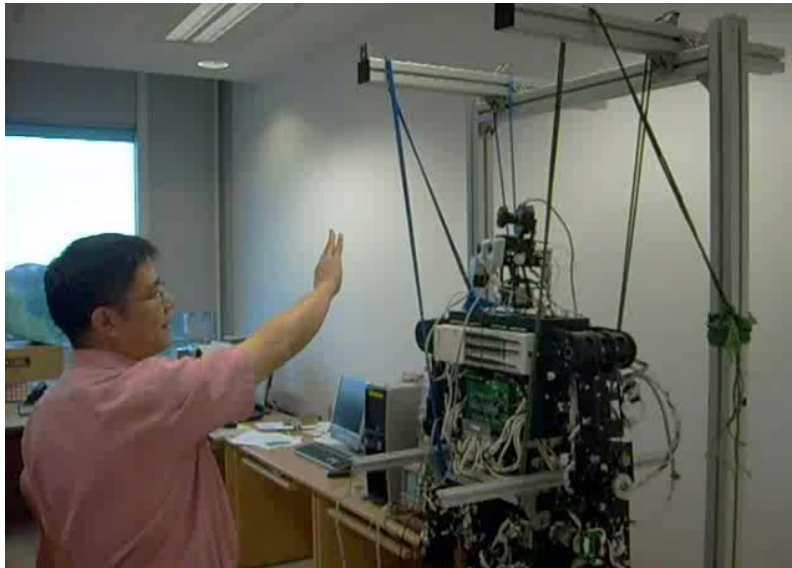




Nanyang Technological University



Some Demonstrations ...



Key Takeaways: Understanding of ...

- One Definition: Robot with Outlook of Human Being
- Three Domains of Knowledge: Body, Brain and Mind
- Five Key Steps of Development: They are the effective ways to translate the three domains of know-hows into the achievements of these five layers of:
 - **Material Flow** Inside Humanoid Robots
 - **Energy Flow** Inside Humanoid Robots
 - **Signal Flow** Inside Humanoid Robots
 - **Motion Flow** Inside Humanoid Robots
 - **Knowledge Flow** Inside Humanoid Robots

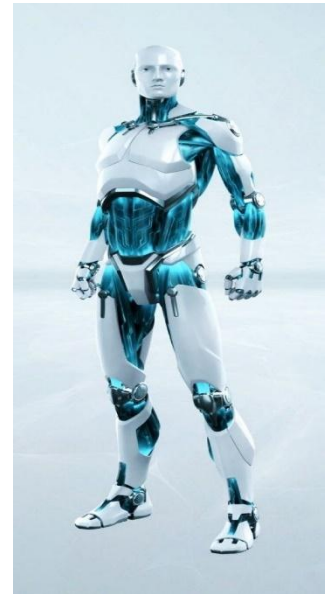
Outline of Today's Talk

- What is humanoid robot?
- What are the domain knowledge behind humanoid robot?
- What are the key steps toward development of humanoid robot?
 - Material Flow Inside Humanoid Robots
 - Energy Flow Inside Humanoid Robots
 - Signal Flow Inside Humanoid Robots
 - Motion Flow Inside Humanoid Robots
 - Knowledge Flow Inside Humanoid Robots
- Concluding Remarks



Outline of Today's Talk

- What is humanoid robot?
- What are the domain knowledge behind humanoid robot?
- What are the key steps toward development of humanoid robot?
 - Material Flow Inside Humanoid Robots
 - Energy Flow Inside Humanoid Robots
 - Signal Flow Inside Humanoid Robots
 - Motion Flow Inside Humanoid Robots
 - Knowledge Flow Inside Humanoid Robots
- Concluding Remarks

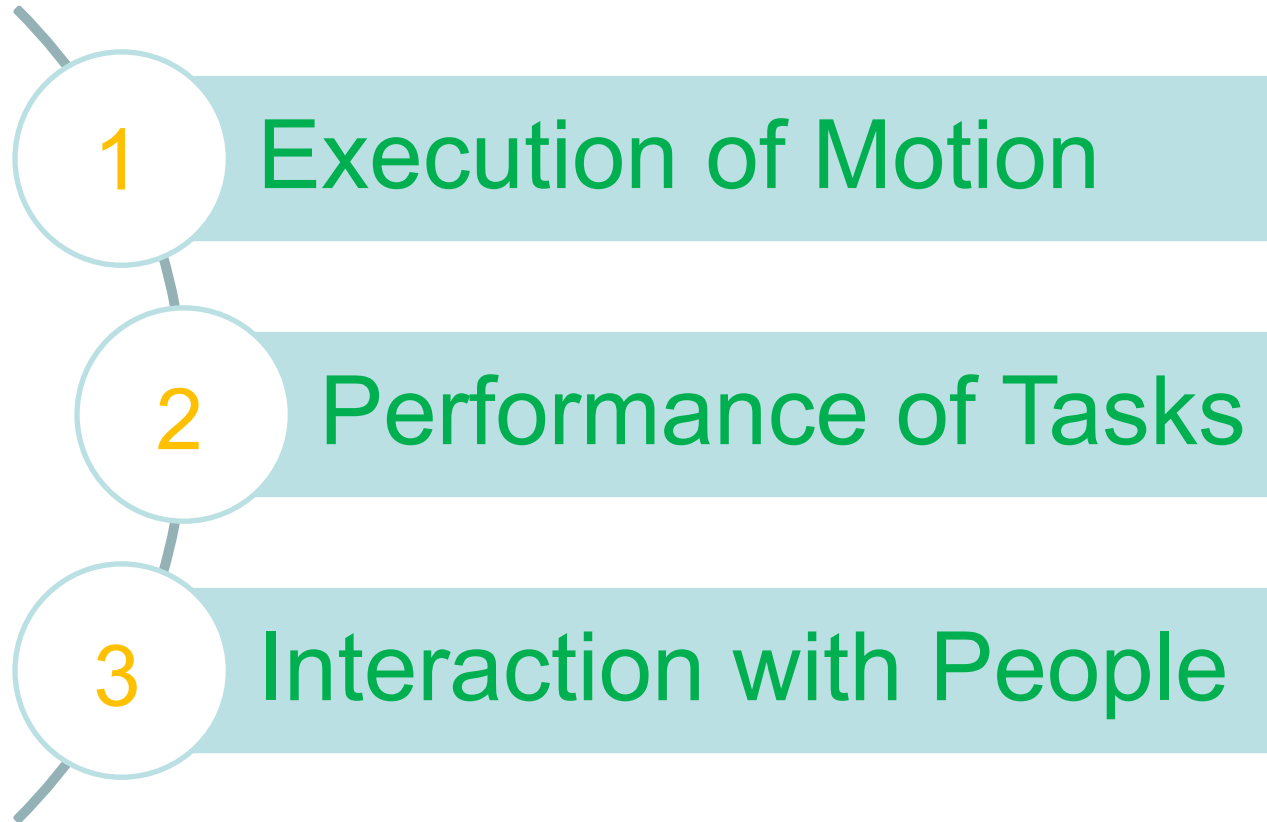


Three Big Questions

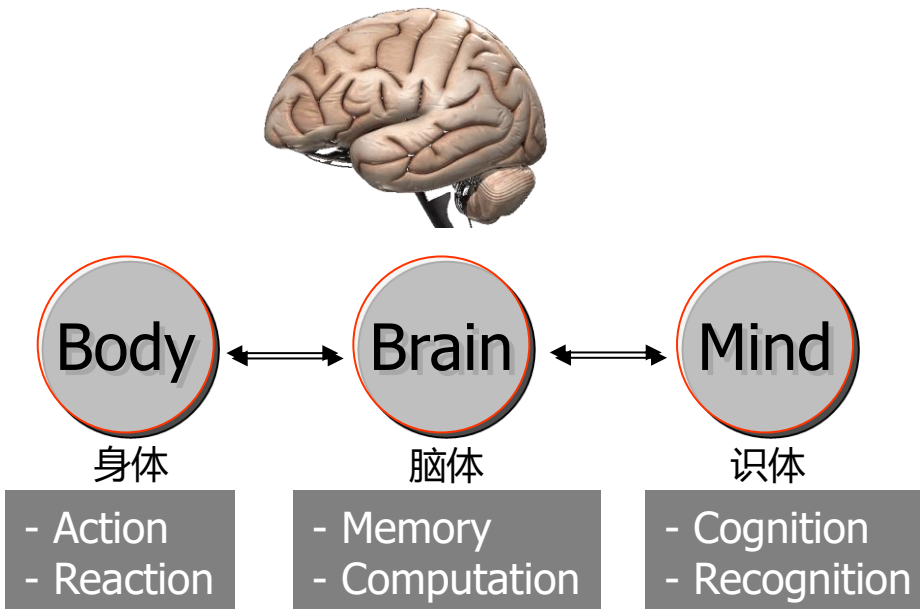
- What is humanoid robot by definition?
- What is humanoid robot from the viewpoint of applications?
- Why are humanoid robots so special and so important?

Definition of Humanoid Robots

- A humanoid robot is a human-made creature which includes human-like **body**, human-like **brain**, and human-like **mind**, for the purpose of doing:

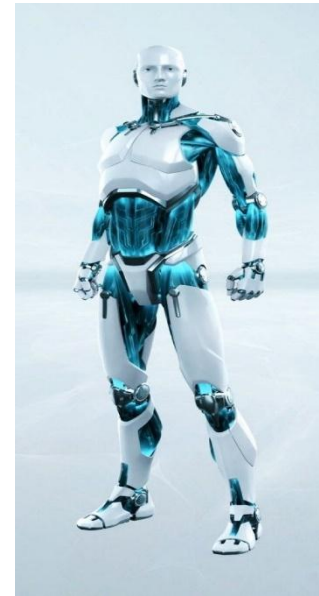


Why to explicitly separate brain from mind?



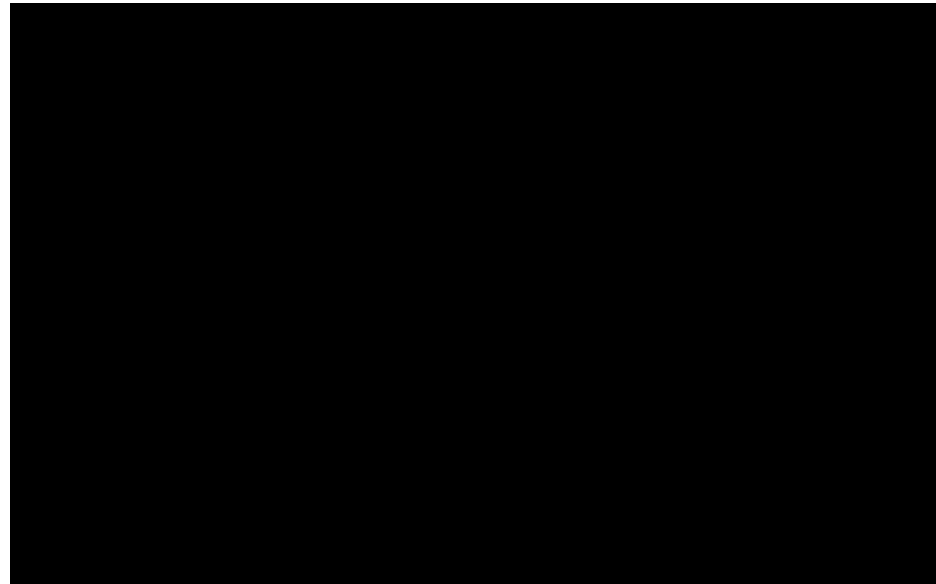
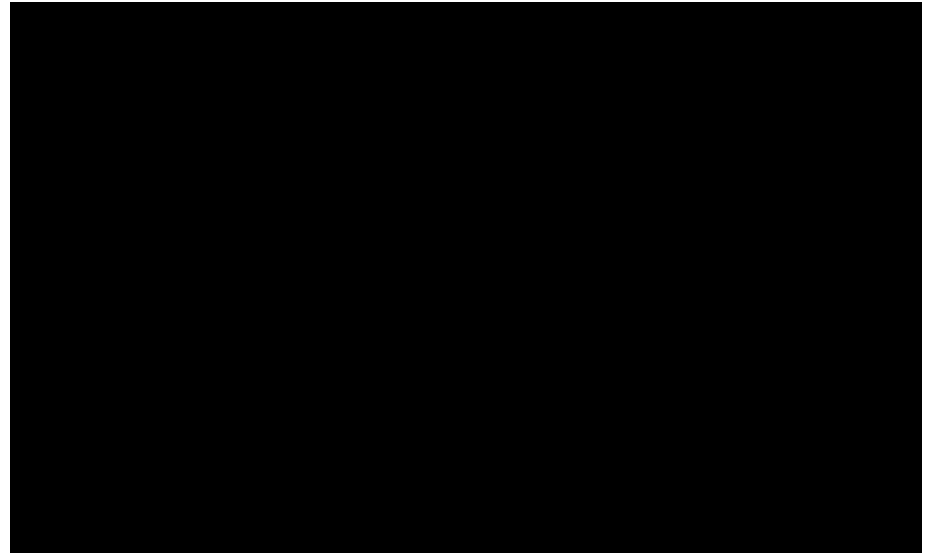
Discoveries in Religion

- Coarse Mind
 - Subtle Mind
 - Deep Mind
-
- Intelligence arises from mind
 - Biological body is not life/soul



Astonishing Truths ...

- Life never dies
- Life reincarnates
- One body has one brain
- One brain could house different minds



Astonishing Truths ...

- Life never dies
- Life reincarnates
- One body has one brain
- One brain could house different minds
- **One mind has multiple settings**



Applications of Humanoid Robots

- Humanoid robot is a mini-version of Internet of Things
- Humanoid robot is a mega actuator
- Humanoid robot is a mega sensor
- Humanoid robot is a mega emitter (e.g. to trigger emotions)
- Humanoid robot is a mega speaker (e.g. speech and body language)
- Humanoid robot is a mega performer
- Humanoid robot is a mega worker, driver, and operator, etc.

Importance of Humanoid Robot

- Humanoid robot is the best platform for advancing research in science and engineering.
- Humanoid robot is the best platform for advancing and promoting education.
- Humanoid robot is the best platform for advancing product innovations in industry.

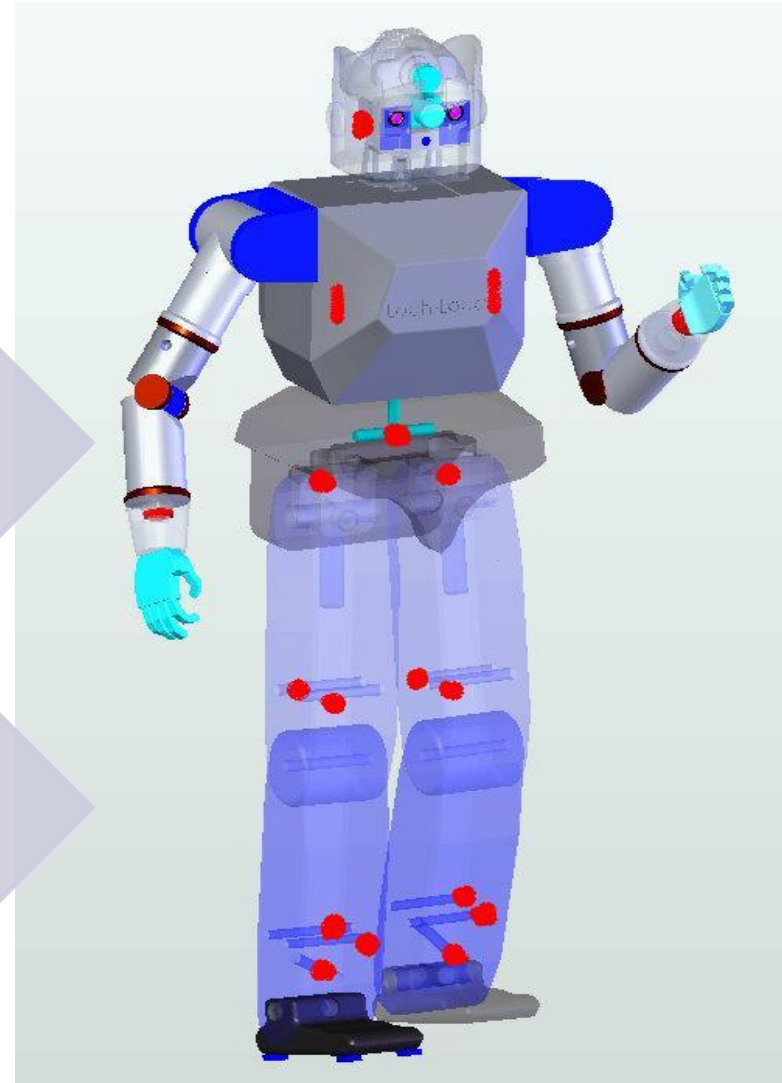
No.1: Humanoid robots are best platforms for research. This is because humanoid robots enable both discoveries and inventions in some better ways.

Human-like Skills

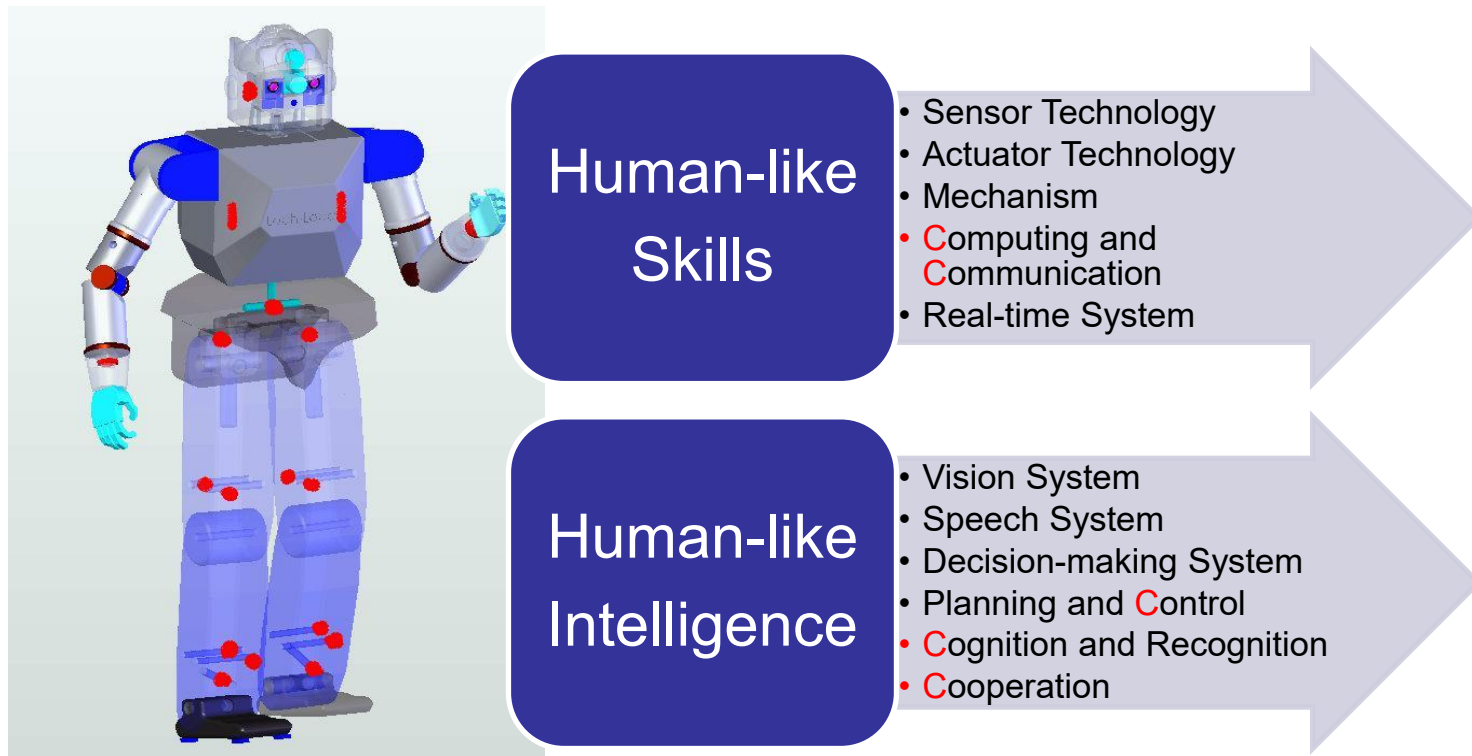
- Sensor Technology
- Actuator Technology
- Mechanism
- Computing
- Communication
- Real-time System

Human-like Intelligence

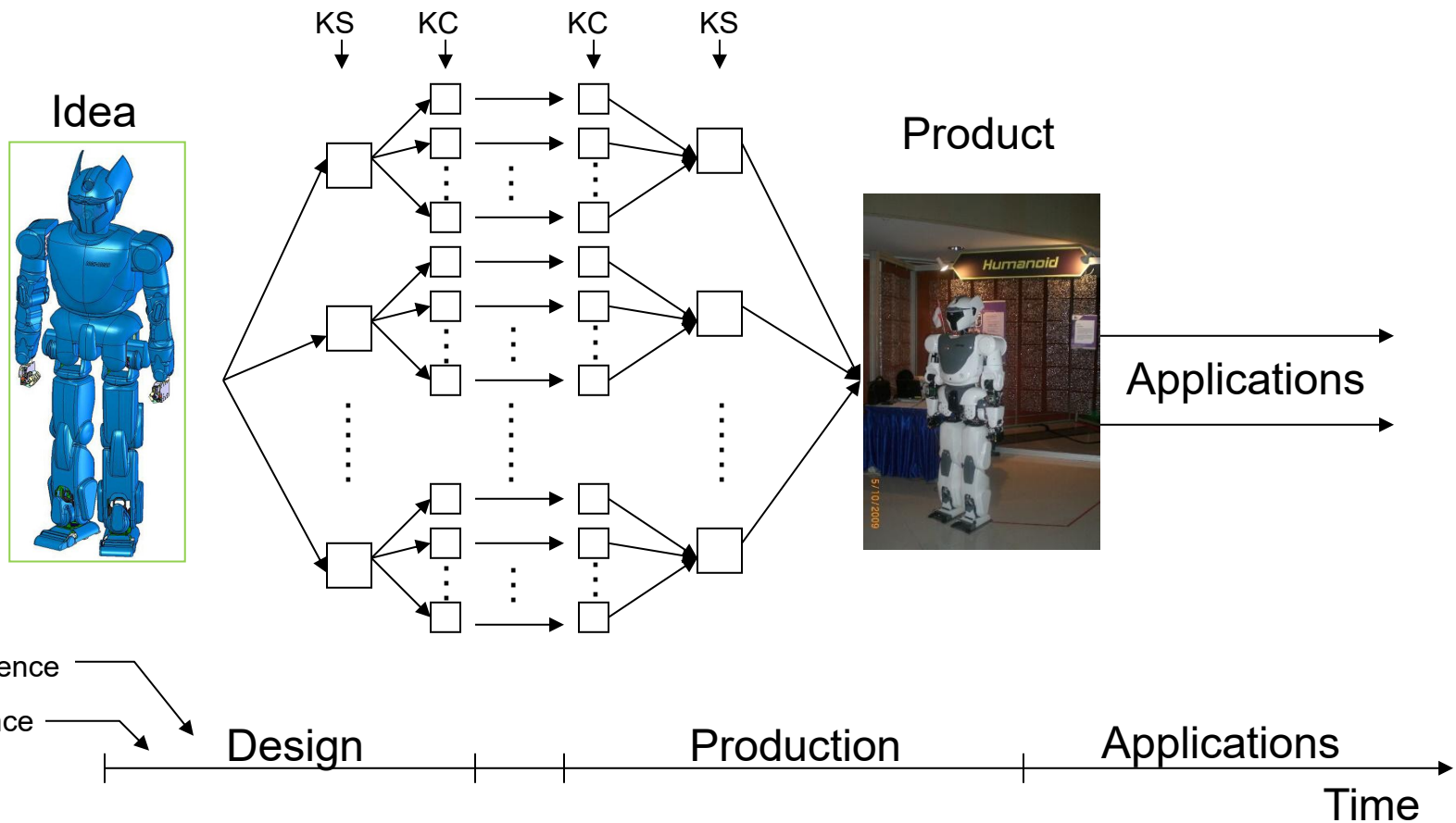
- Vision System
- Speech System
- Decision-making System
- Planning and Control
- Cognition and Recognition
- Cooperation



No.2: Humanoid robots are best platforms for education.
This is because humanoid robots facilitate learning and teaching STEM in schools.



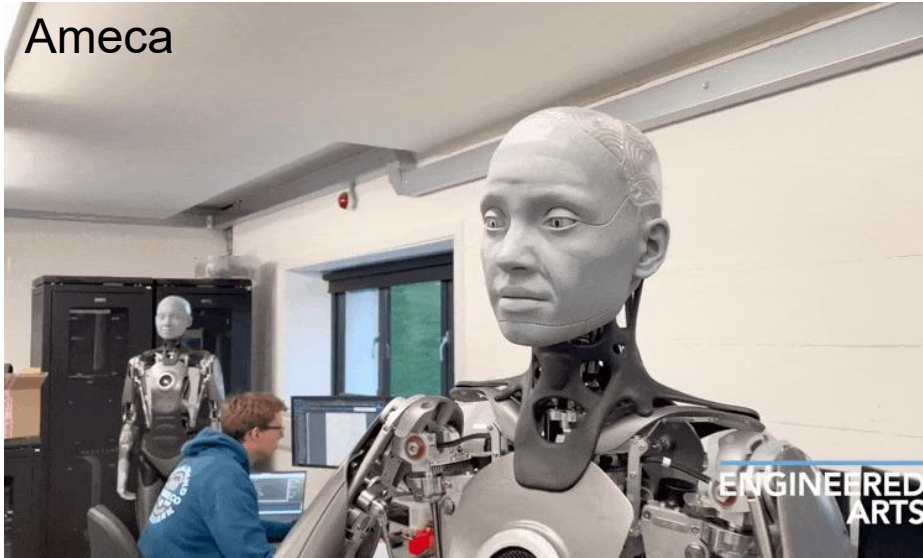
No3: Humanoid robots are best platforms for prototyping.
This is because humanoid robots' technologies enable the upgrade of existing industries, and also the creation of new products and new services.



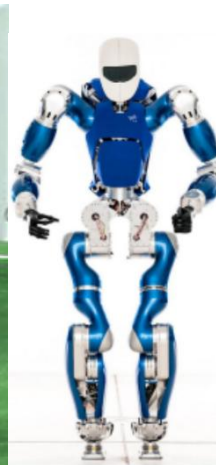
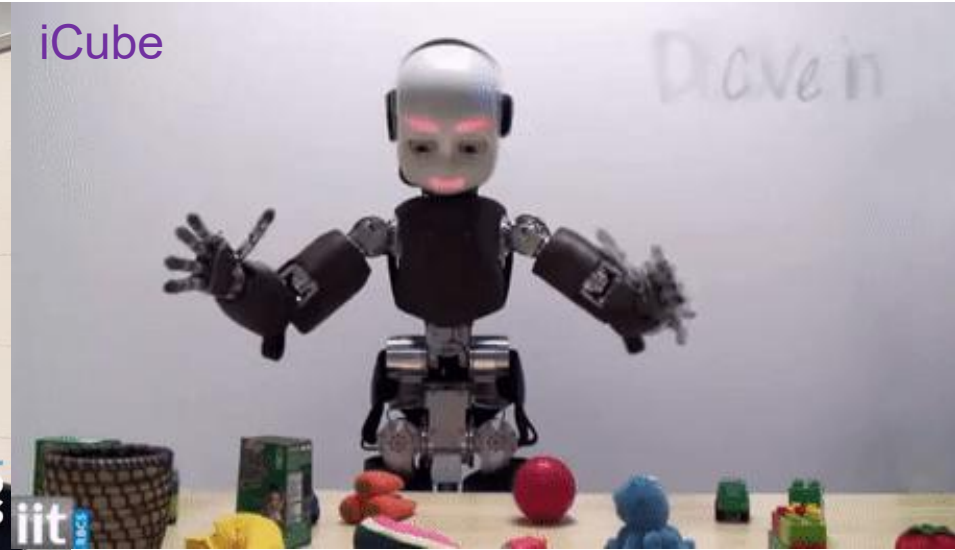
Top Players of Humanoid Robots (1)

France, Italy, United Kingdom, Germany

Ameca



iCube



Top Players of Humanoid Robots (2)

Japan, South Korea, China

ASIMO



HUBO



Top Players of Humanoid Robots (3)

United States

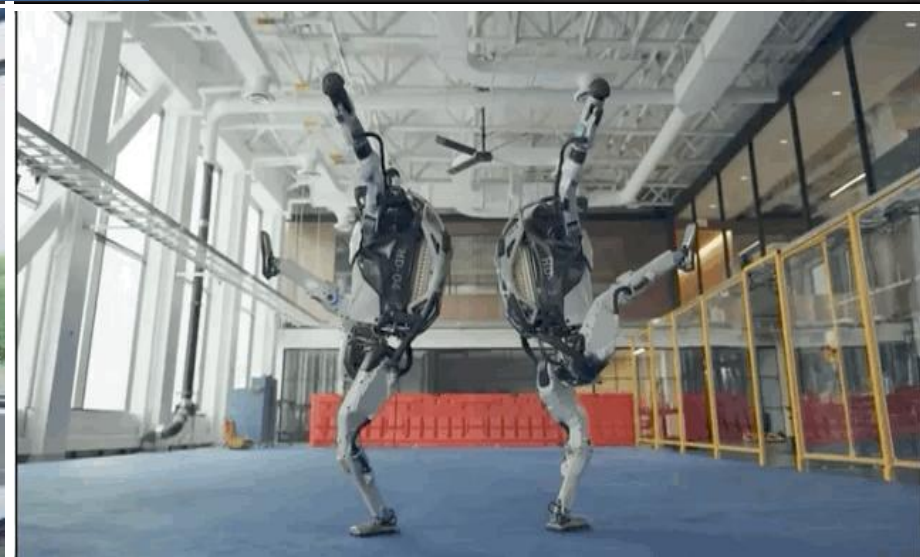
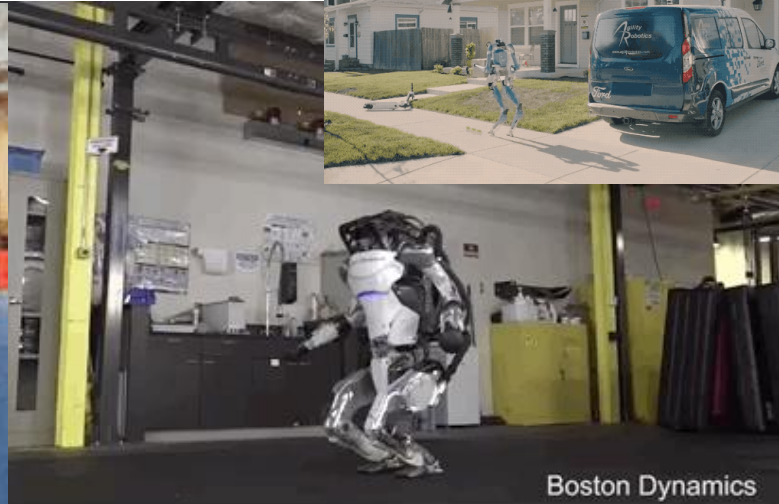
Atlas



OPTIMUS

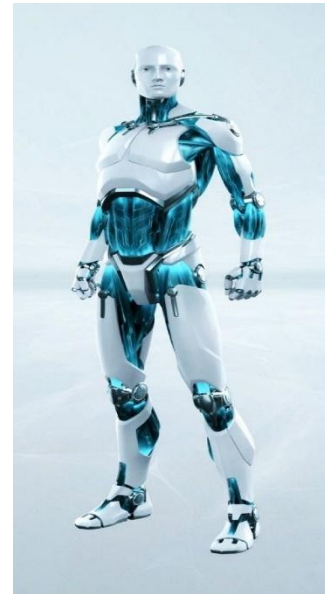


DIGIT



Outline of Today's Talk

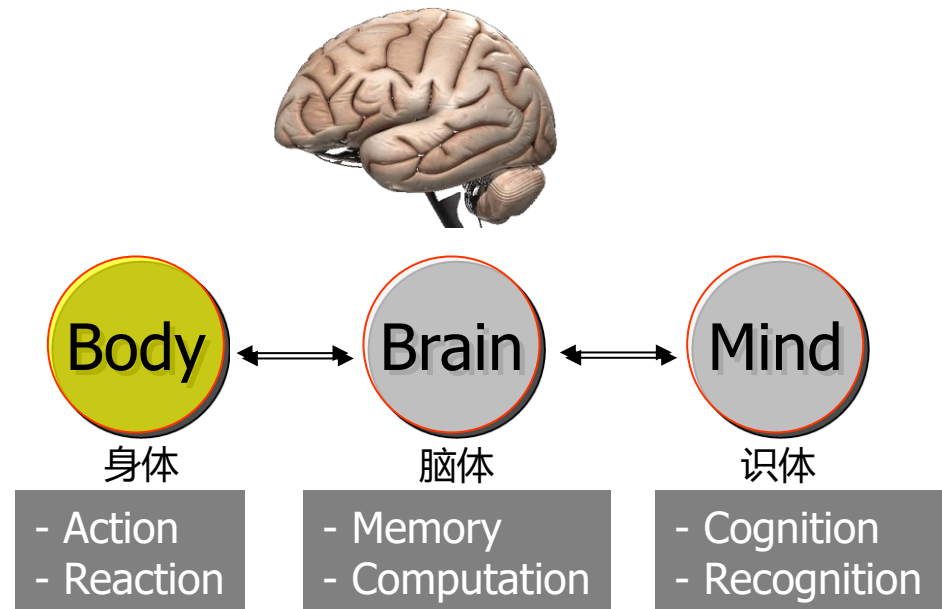
- What is humanoid robot?
- What are the domain knowledge behind humanoid robot?
- What are the key steps toward development of humanoid robot?
 - Material Flow Inside Humanoid Robots
 - Energy Flow Inside Humanoid Robots
 - Signal Flow Inside Humanoid Robots
 - Motion Flow Inside Humanoid Robots
 - Knowledge Flow Inside Humanoid Robots
- Concluding Remarks



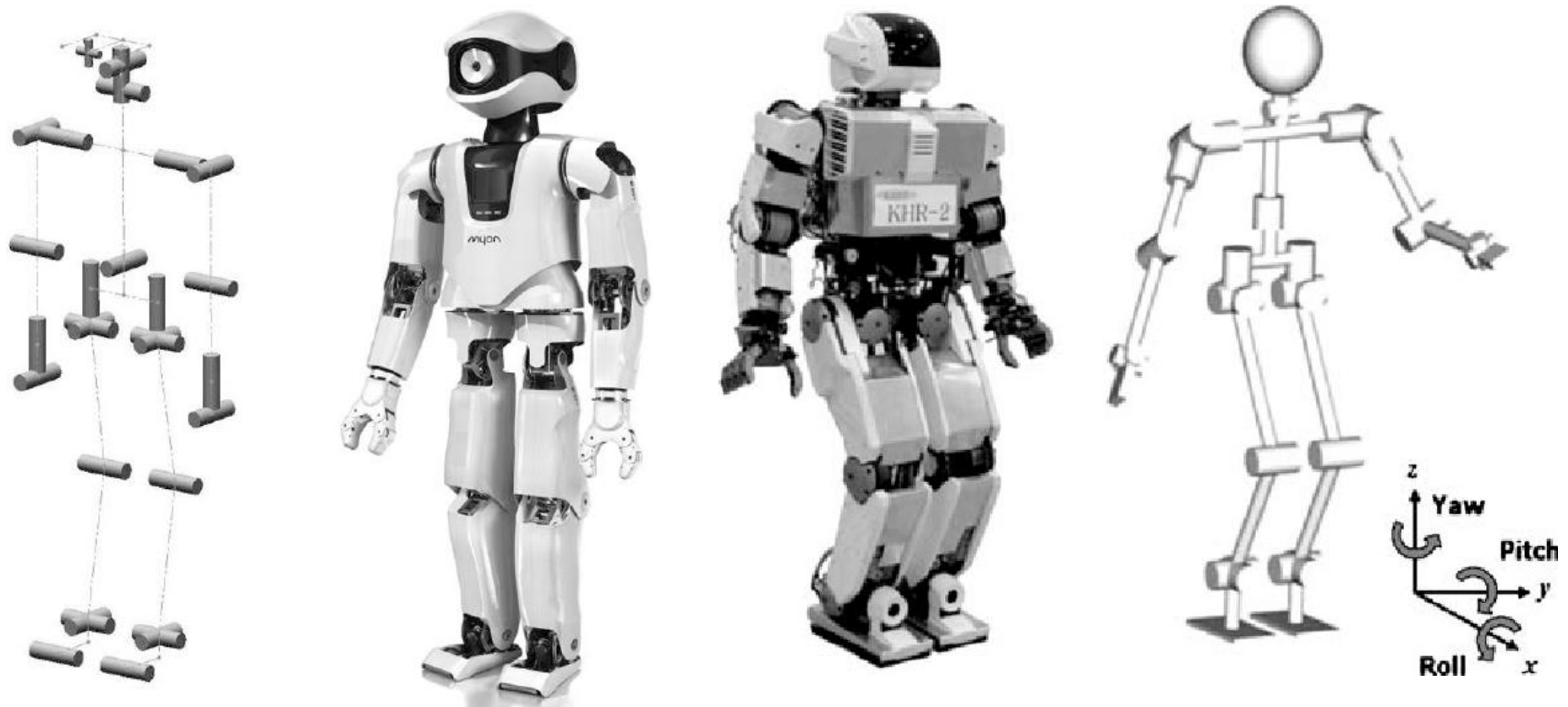
Three Domains of Knowledge underlying the R&D of Humanoid Robots

- Domain No.1:
 - Artificial Body (Primary Focus of **Robotics**)
- Domain No.2:
 - Artificial Brain (Primary Focus of **Computer Engineering**)
- Domain No.3:
 - Artificial Mind (Primary Focus of Artificial Intelligence, Cognitive Science, or **Science of Mind**)

Domain No.1: Artificial Body



How to design a body which is a network of rigid links with actuators, sensors and controllers, for the purpose of delivering actions and reactions?



History of Inventing Robots in China

Puppets could be considered as the first generation of robots!



Human-like Statues



470-220 BC



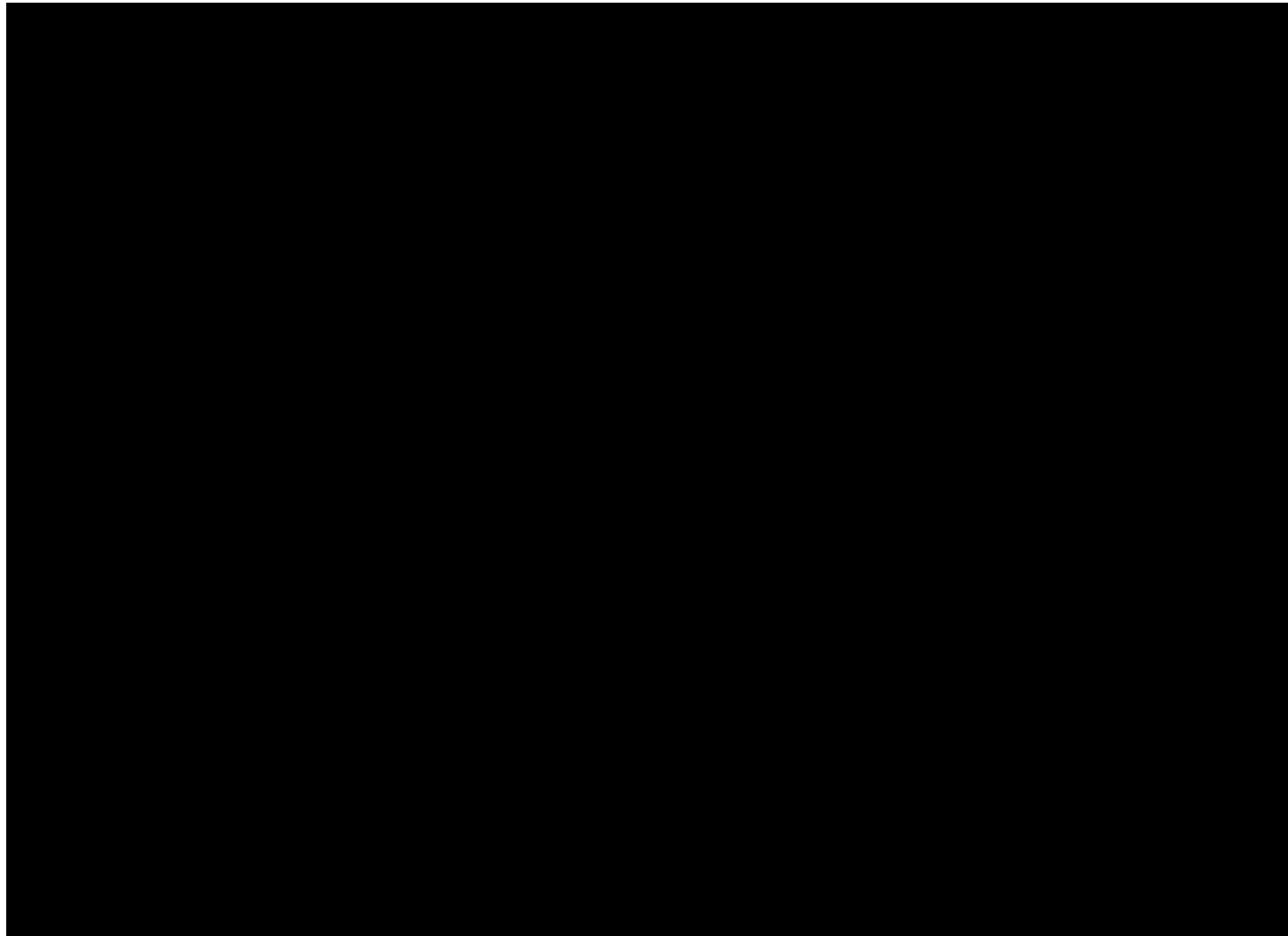
Shadow puppetry or Pi Ying in Chinese was very popular during the Tang (618 - 907) and Song (960 - 1279) dynasties in many parts of China.

Shadow puppets were first made of paper sculpture, later from the leather of donkeys or oxen.

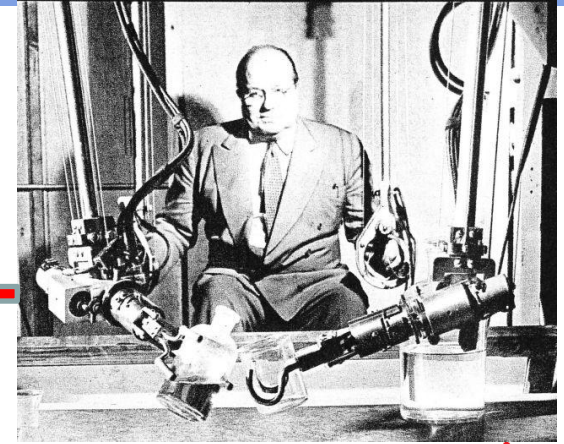


GE in 1948

First Generation of Teleoperated Robots (Puppets Invented in China)



History of Inventing Robots in Western Countries



GE's Tele-operated Arm in 1948

Birth of Terminology "Robotics"

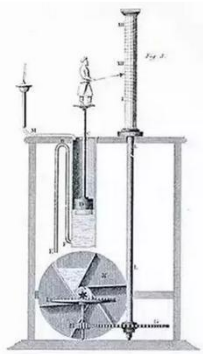


1926

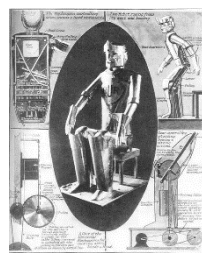
Three Laws



-270
Greek engineer made water clocks with movable figures



1818: Mary Shelley writes 'Frankenstein', an artificial lifeform



1921: Czech play 'Rossum's Universal Robots' uses the term 'robot' for the first time

1941: term 'robotics' use by writer Isaac A. to describe technology of robots

1942: Isaac writes 'Runaround' describing 3 laws of robotics

1948: William G.W creates 'Elmer' and 'Elsie' that imitate lifelike behaviour

Robot is a creature without soul

1956: George D. and Joe E. from the 1st robot company

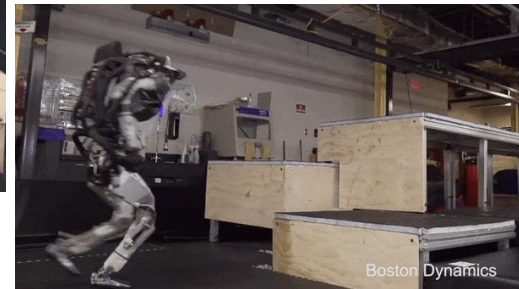
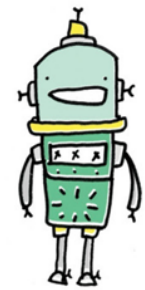
1961: 'UNIMATE', the first industrial robot is put online



1963: 1st robotic arm controlled by a computer is created (for handicaps)

1970: 'Shakey', the first mobile robot controlled by artificial intelligence is produced by the SRI International

1979: 'Stanford carl' mobilised itself through a chair-filled room using a tv camera that took pictures from different angles and sent them to a computer to process the next movement

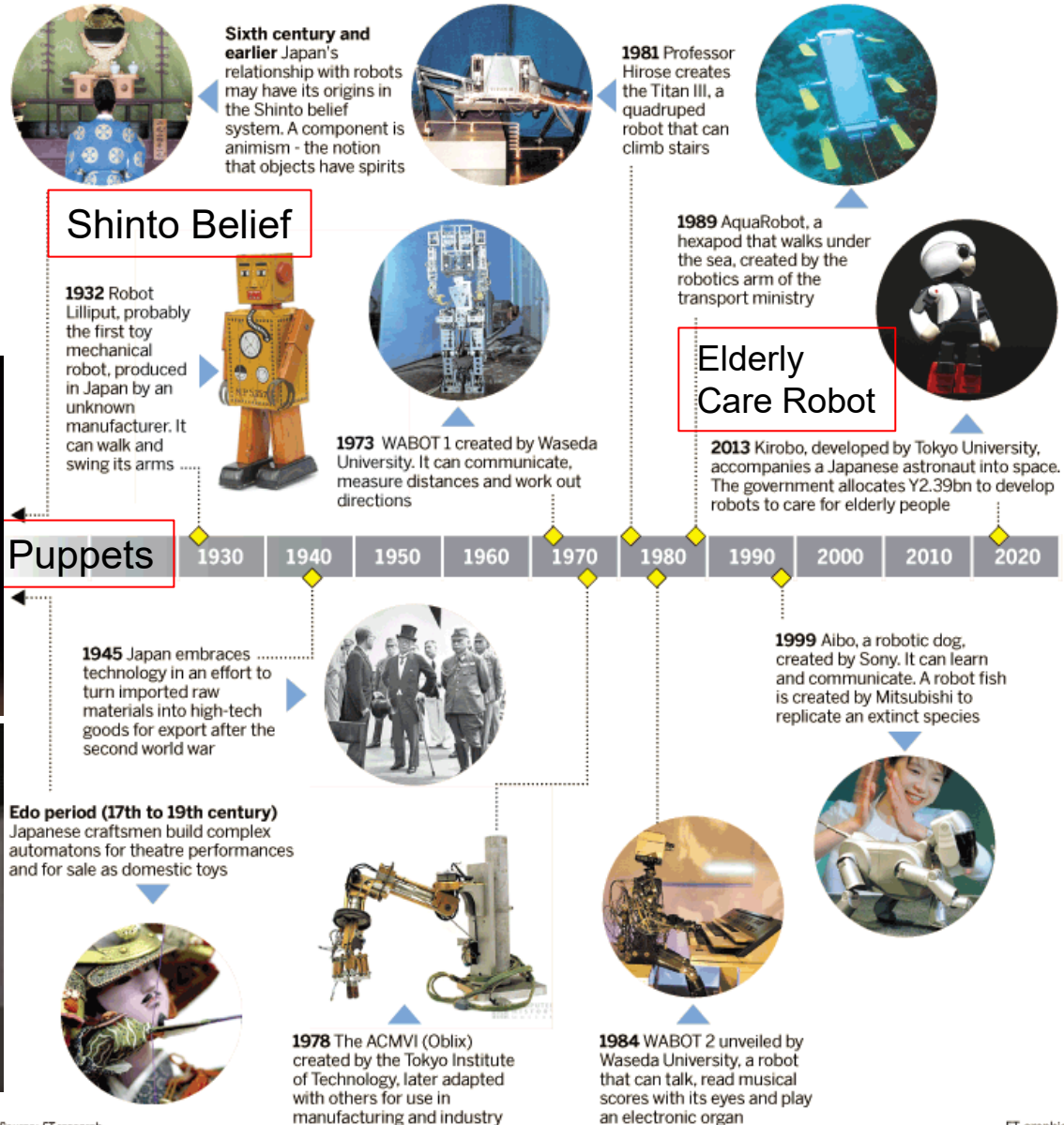


Boston Dynamics

Birth of Terminology "Robot"

Birth of Industrial Robot

History of Inventing Robots in Japan

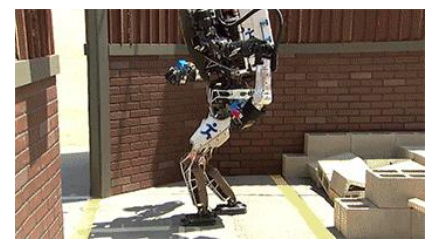
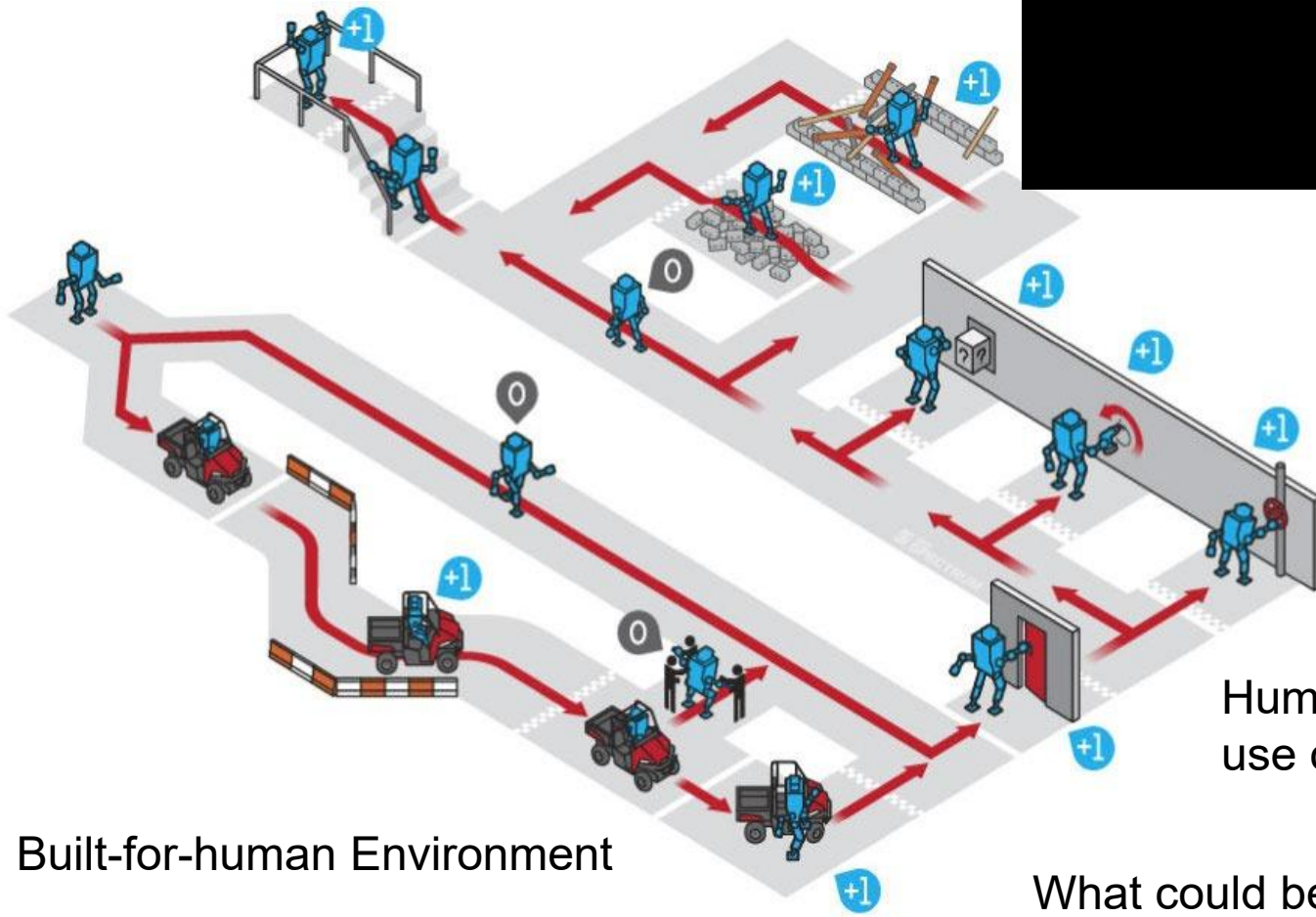


Source: FT research

DARPA's Humanoid Robot Challenge

- In June 2015, the finale of the DARPA Humanoid Robot Challenge (DHRC), a competition of robot systems and software teams vying to develop robots capable of assisting humans in responding to natural and man-made disasters, unfolded at the Fairplex in Pomona, Calif.
- A preliminary DHRC Trials event had taken place in late 2013 at Florida's Homestead Miami Speedway. Participating teams, representing many of the most advanced robotics research and development organizations in the world, developed the hardware, software, sensors, and human-machine control interfaces to enable their robots to take on and sometimes complete a series of challenging tasks selected by DARPA for their relevance to disaster response.
- Taking first place and the \$2 million in prize money that went with it was Team Kaist of Daejeon, Republic of Korea, and its robot DHRC-Hubo. Coming in second and taking home \$1 million was Team IHMC Robotics of Pensacola, Florida, and its robot Running Man. The third-place finisher, earning the \$500,000 prize, was Tartan Rescue of Pittsburgh, and its robot CHIMP.

DARPA Humanoid Robot Challenge 2015



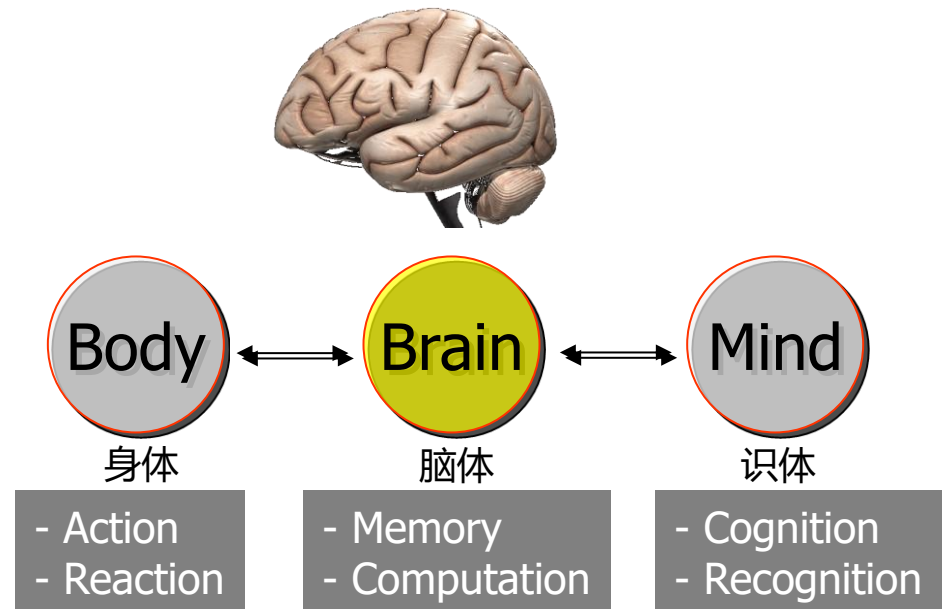
Built-for-human Environment

Human-like skills require the use of human-like brains

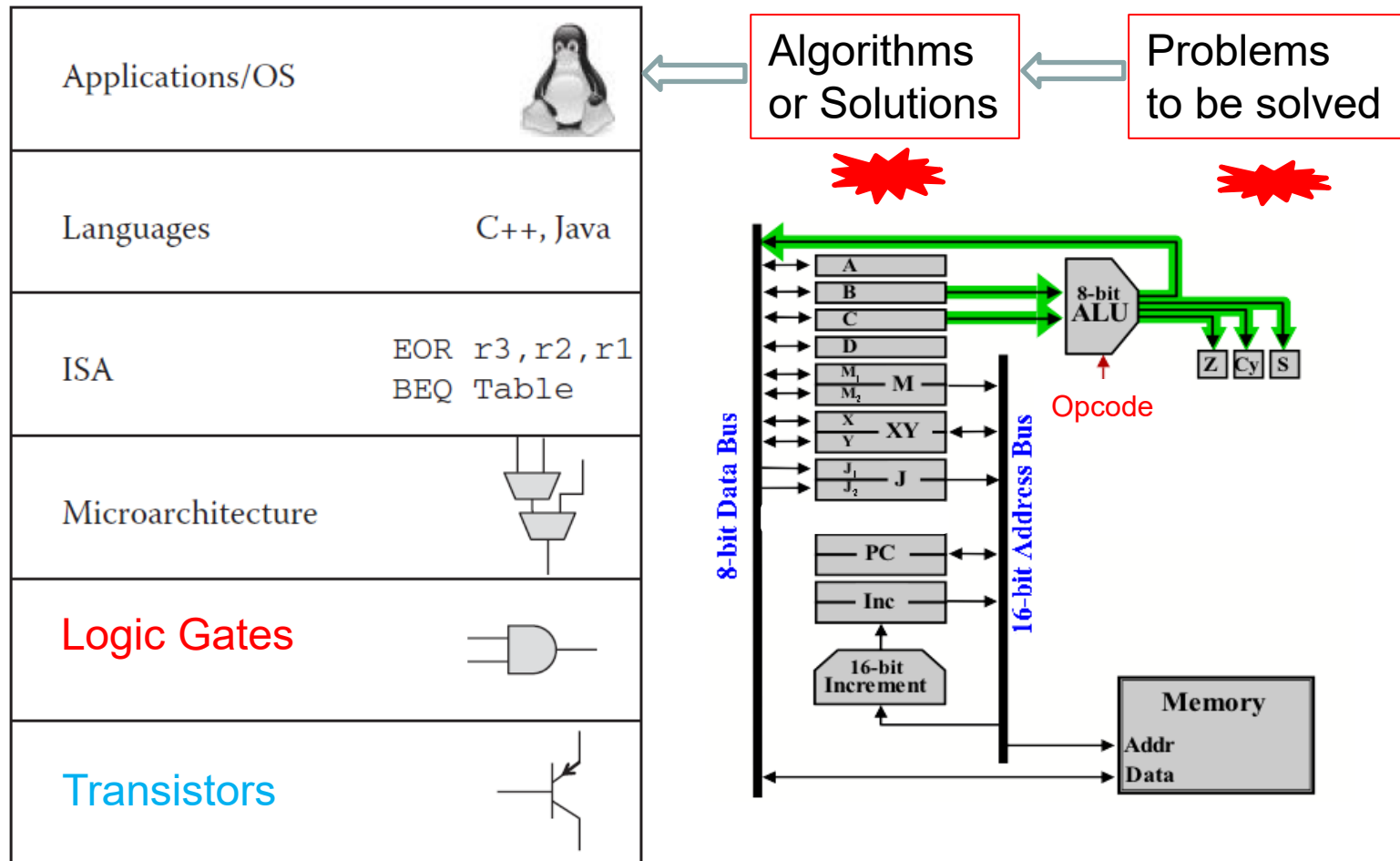


What could be human-like brain? →



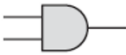

Domain No.2: Artificial Brain



How to design a brain which is a massive network of logic devices, for the purpose of creating numerous CPUs and huge memories?

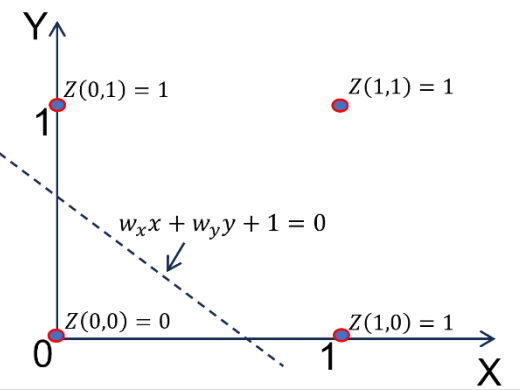
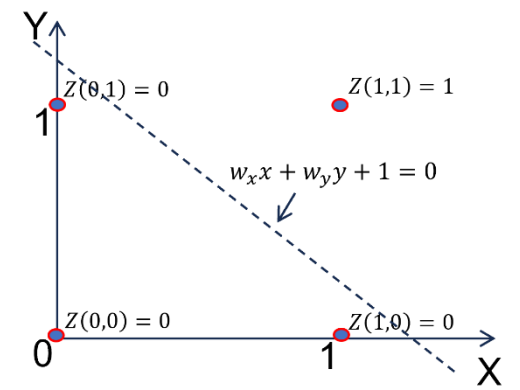


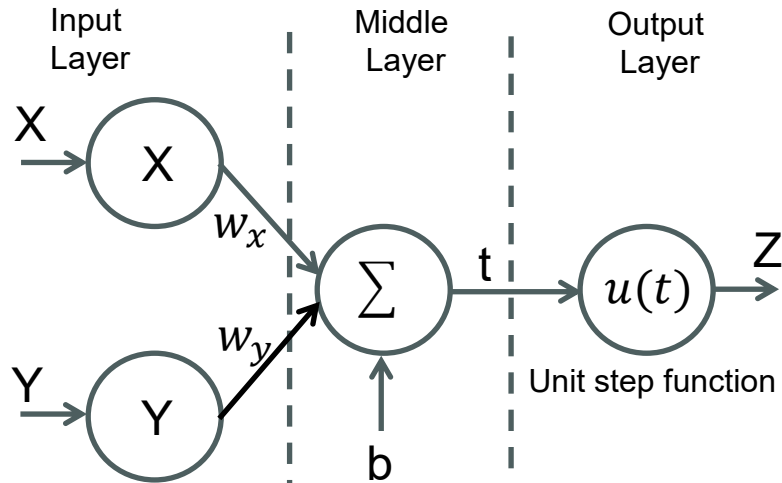
A biological brain system is a massive network of logic gates and devices for the purpose of supporting computation ... (neurons are very likely the foundation of logic gates)

Applications/OS	
Languages	C, C++, Python, etc
ISA	EOR r3, r2, r1 BEQ Table
Microarchitecture	
Gates	
Transistors	

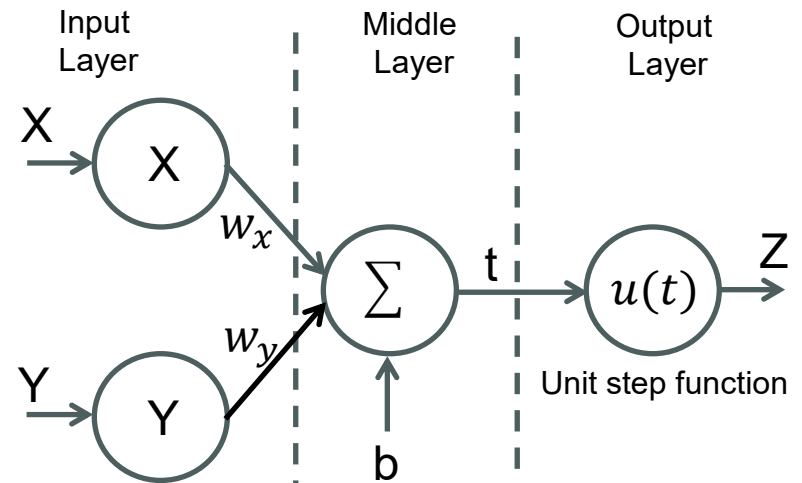
Truth Table of AND Gate		
X	Y	Z
0	0	0
0	1	0
1	0	0
1	1	1

Truth Table of OR Gate		
X	Y	Z
0	0	0
0	1	1
1	0	1
1	1	1

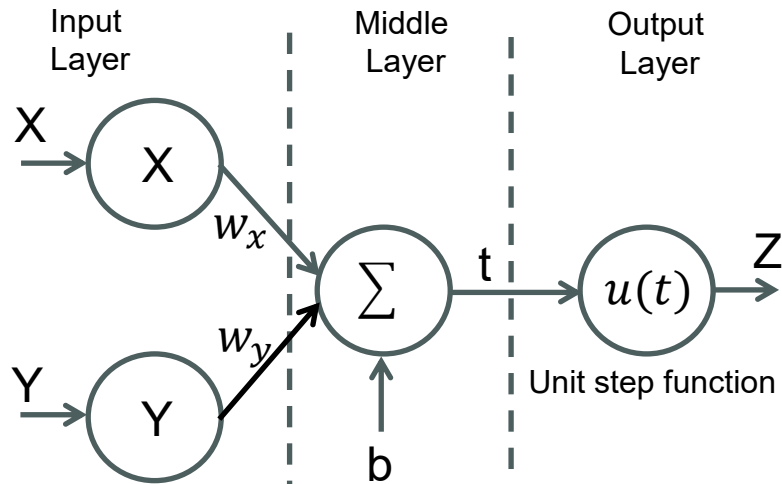




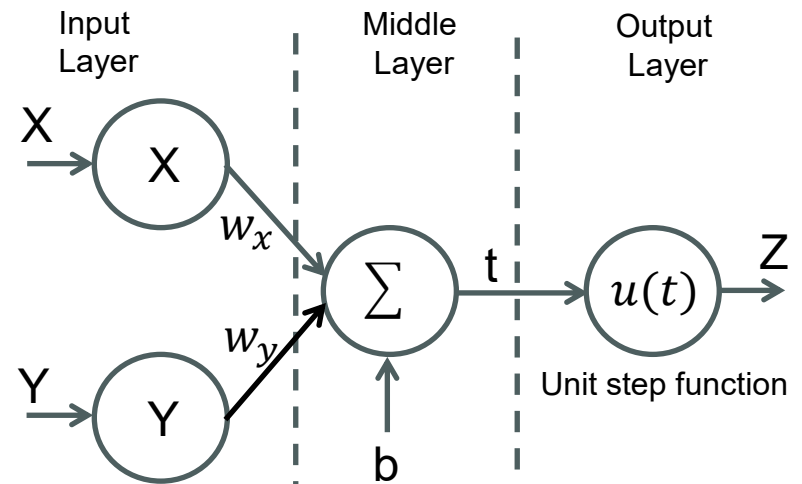
AND gate if $w_x = 0.91, w_y = 0.91, b = -1$



OR gate if $w_x = 2.0, w_y = 2.0, b = -1$



NAND gate if $w_x = -0.91, w_y = -0.91, b = 1$



NOR gate if $w_x = -2.0, w_y = -2.0, b = 1$

Truth Table of XOR Gate

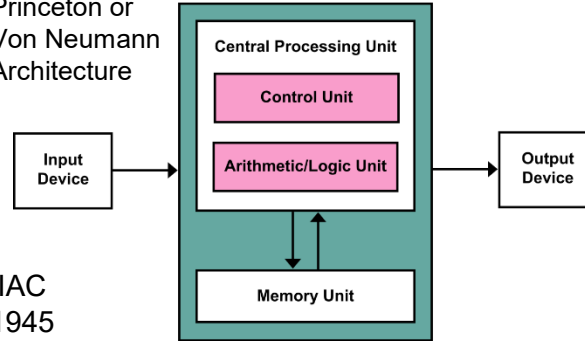
X	Y	Z
0	0	0
0	1	1
1	0	1
1	1	0

Equations of Designing XOR Gate

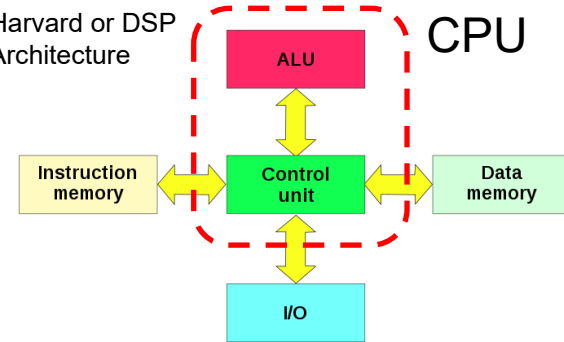
$Z_{AND} = Z_{AND}(X, Y)$	$Z_{NAND} = Z_{NAND}(X, Y)$
$Z_{OR} = Z_{OR}(X, Y)$	$Z_{NOR} = Z_{NOR}(X, Y)$
$Z_{XOR} = Z_{XOR}(X, Y) = Z_{NOR}(Z_{AND}(X, Y), Z_{NOR}(X, Y))$	

History of Electronic Computer or Brain (v1)

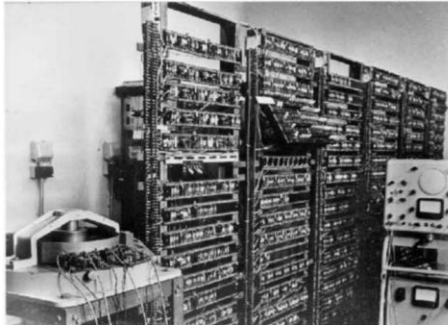
Princeton or Von Neumann Architecture



Harvard or DSP Architecture



ENIAC In 1945
First Electronic Computer



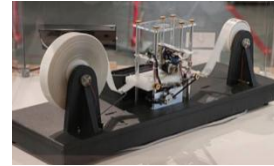
First Generation 1946-1959



Second Generation 1959-1965



Third Generation 1965-1971



Allan Turing's Invention: Computing Machine



Herman Hollerith's Invention: Tabulator



Charles Babbage's Invention: Mechanical Computer



Fourth Generation 1971-1980



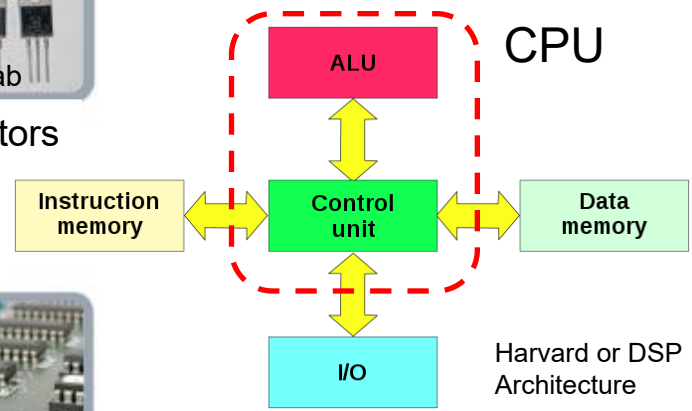
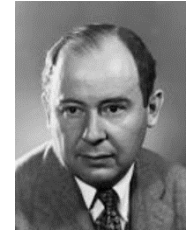
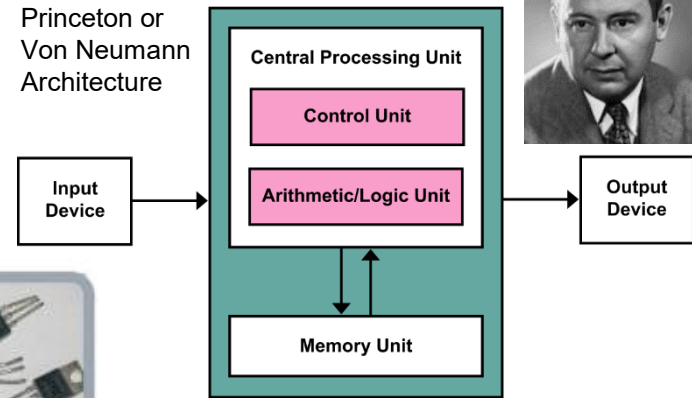
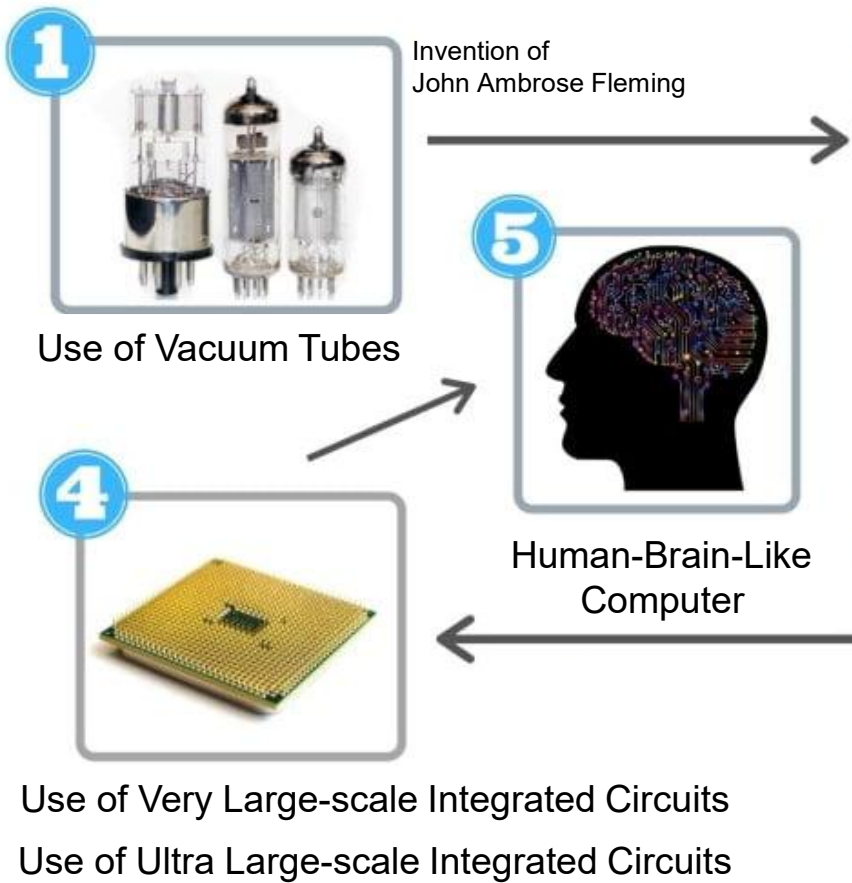
1980 - Present



What Will Be The Fifth Generation?

History of Electronic Computer or Brain (v2)

Toward achieving human-brain-like computers



Use of Integrated Circuits

Driving Force for Fifth Generation?

History of Electronic Computer or Brain (v3)

Humanoid robotics will contribute to the development of the 5th generation of computers which is:



Human-brain-like Computers



Electronic Brains



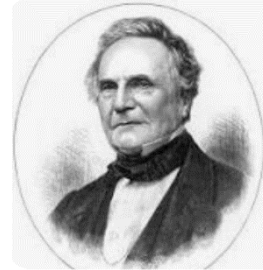
Robot Brains



1st Gen.



2nd Gen.



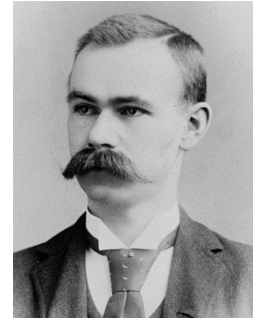
Charles Babbage



3rd Gen.



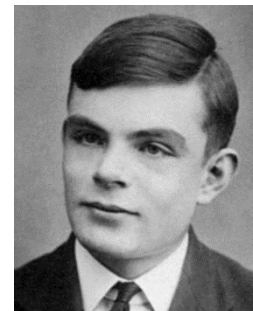
4th Gen.



Herman Hollerith



5th Gen.



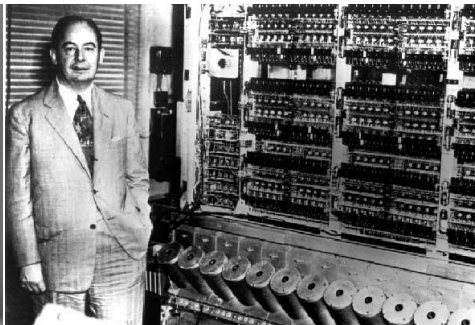
Allan Turing



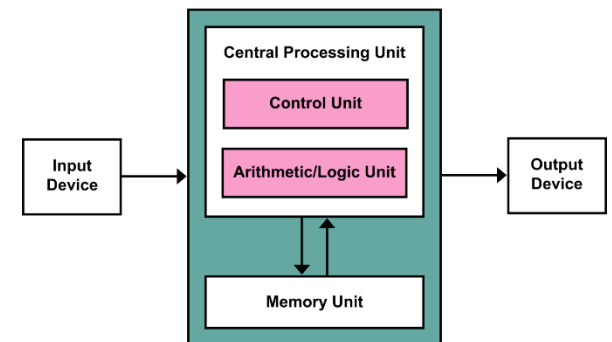
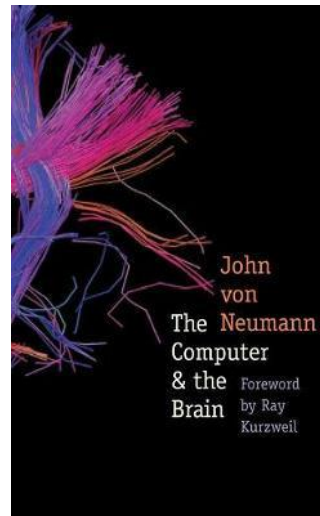
Boston Dynamics

John von Neumann's Book

- In this classic work, **one of the greatest mathematicians** of the twentieth century explores the analogies between **computing machines and the living human brain**. John von Neumann, whose many contributions to science, mathematics, and engineering include the basic organizational framework at the heart of today's computers, concludes that **the brain operates both digitally and analogically, but also has its own peculiar language (i.e., instruction set)**.
- In his foreword to this new edition, **Ray Kurzweil**, a futurist who is famous in part for his own reflections on the **relationship between technology and intelligence**, places von Neumann's work in a historical context and shows how it remains relevant today.



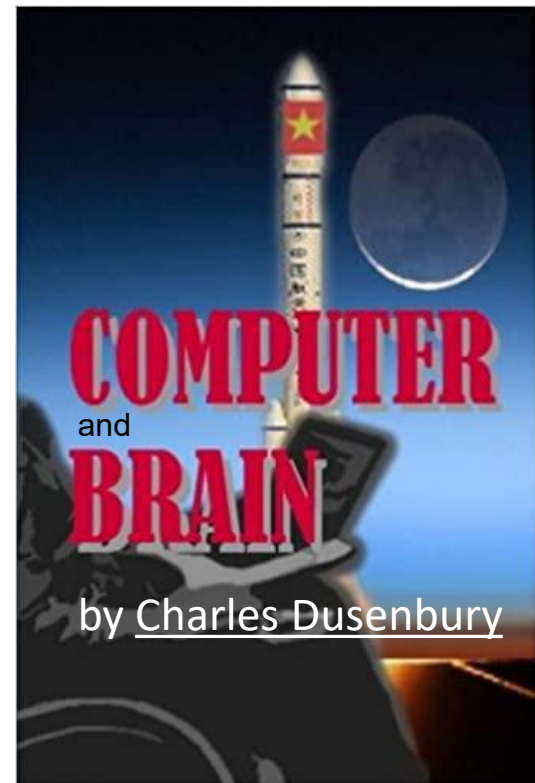
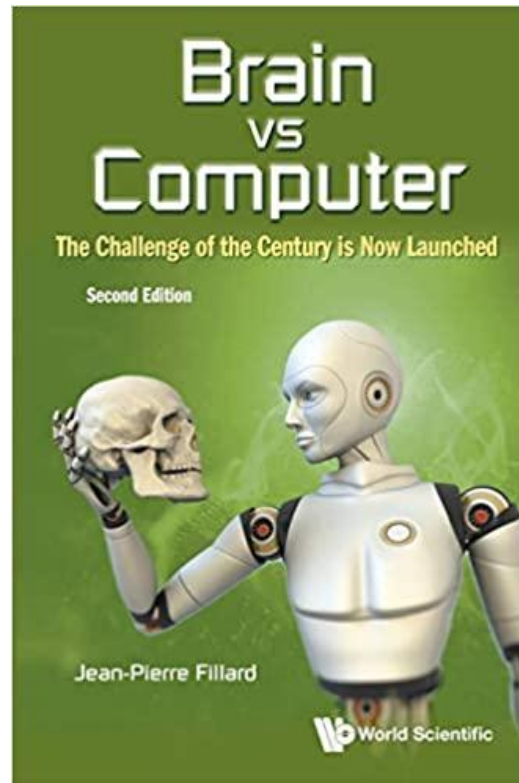
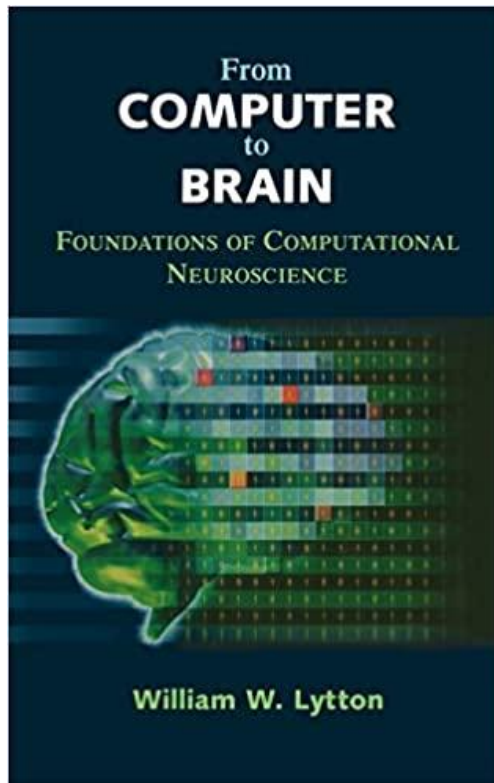
John von Neumann



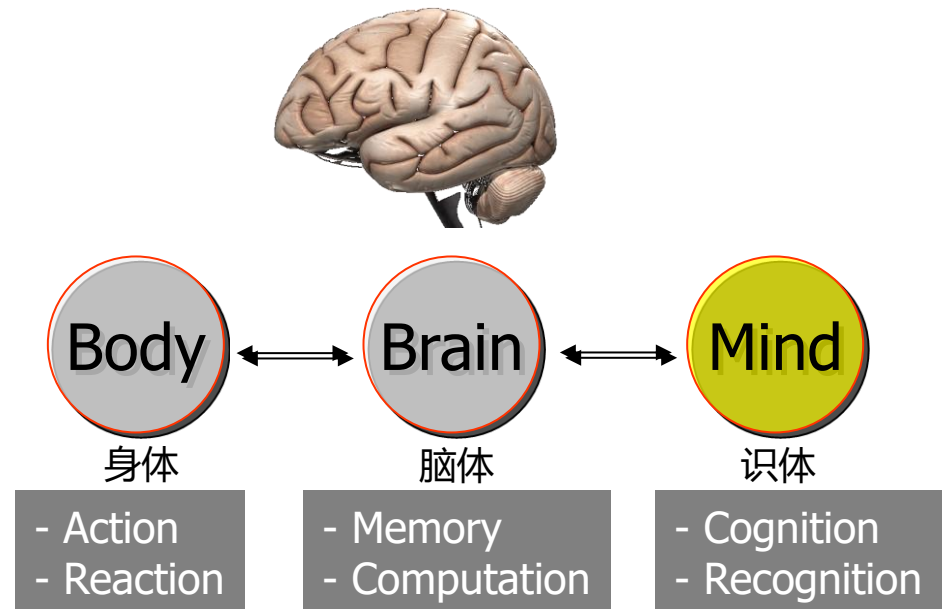
First Edition, 1958
Latest Edition, 2012, 144 Pages,
Yale University Press

Other books of similar topics ...

The word “computer” was first in use in **1613** as a label for a person that performed calculations.

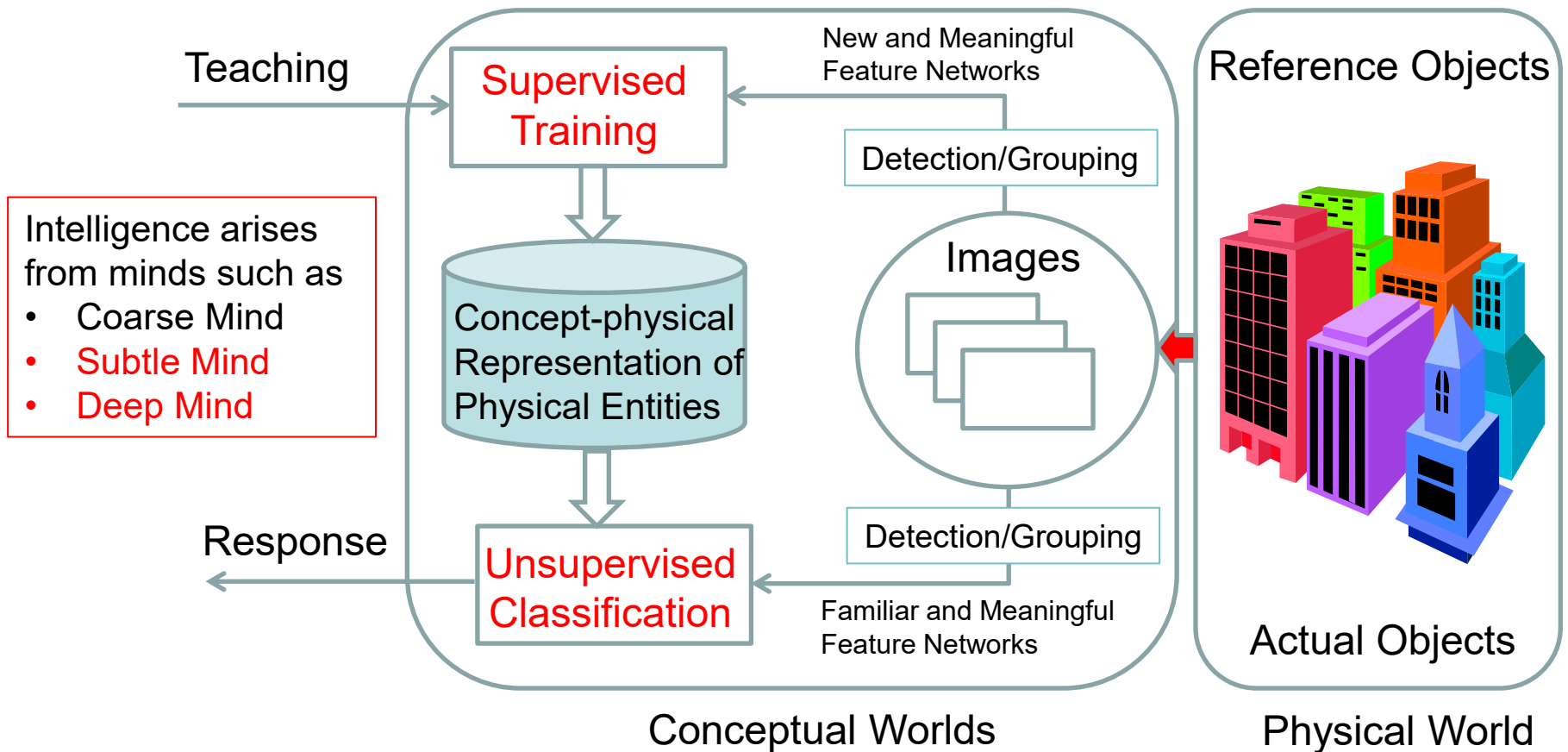


Domain No.3: Artificial Mind



How to design a mind which is a massive network of cognition modules (learners), recognition modules (classifiers) and memorized knowledge?

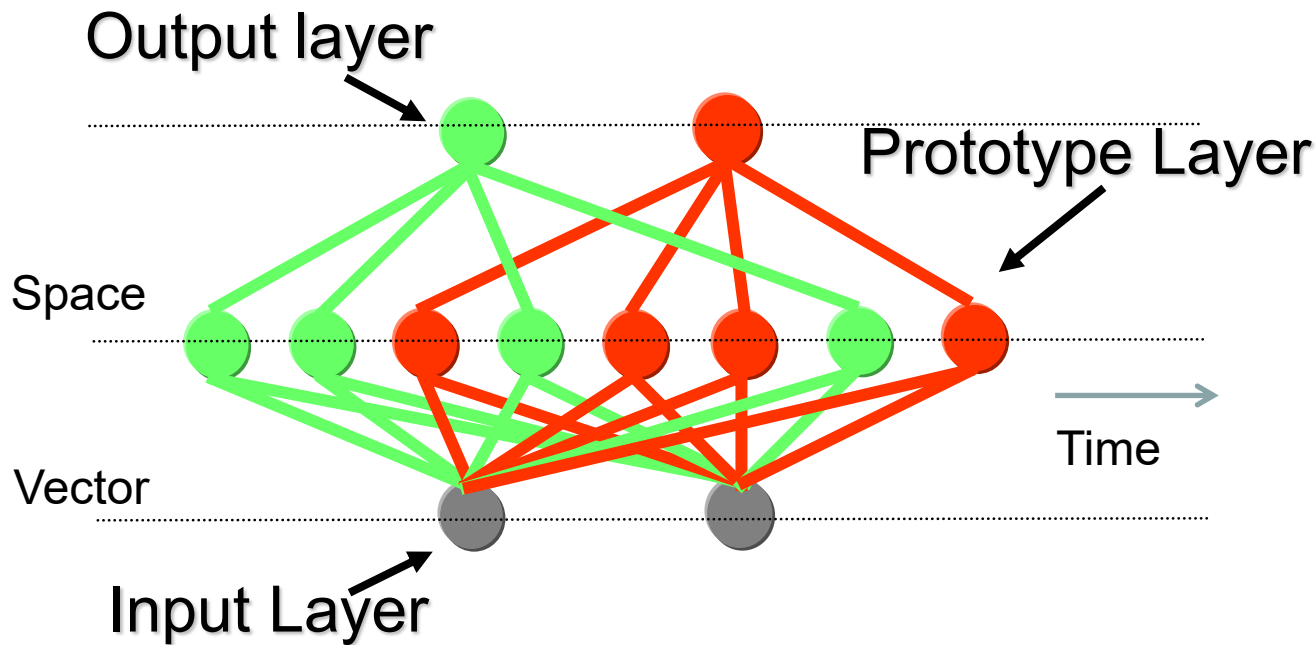
By default, mind refers to coarse mind



Intelligence arises from minds such as

- Coarse Mind
- **Subtle Mind**
- **Deep Mind**

A brain system is also a massive network of logic gates and devices for the purpose of supporting cognition, recognition and memorization of learnt knowledge ...



It is the effective implementation of Space-Vector-Time model in any knowledge domain.

RCE Neural Network which was discovered by Nobel Laureate Leon N. Couper's Team in 1970s

- Prototypes refer to feature vectors describing reference features.
- RCE stands for **Restricted Coulomb Energy (RCE)**.
- **RCE-NN is a MIMO system which is equal to the sum of MISO.**

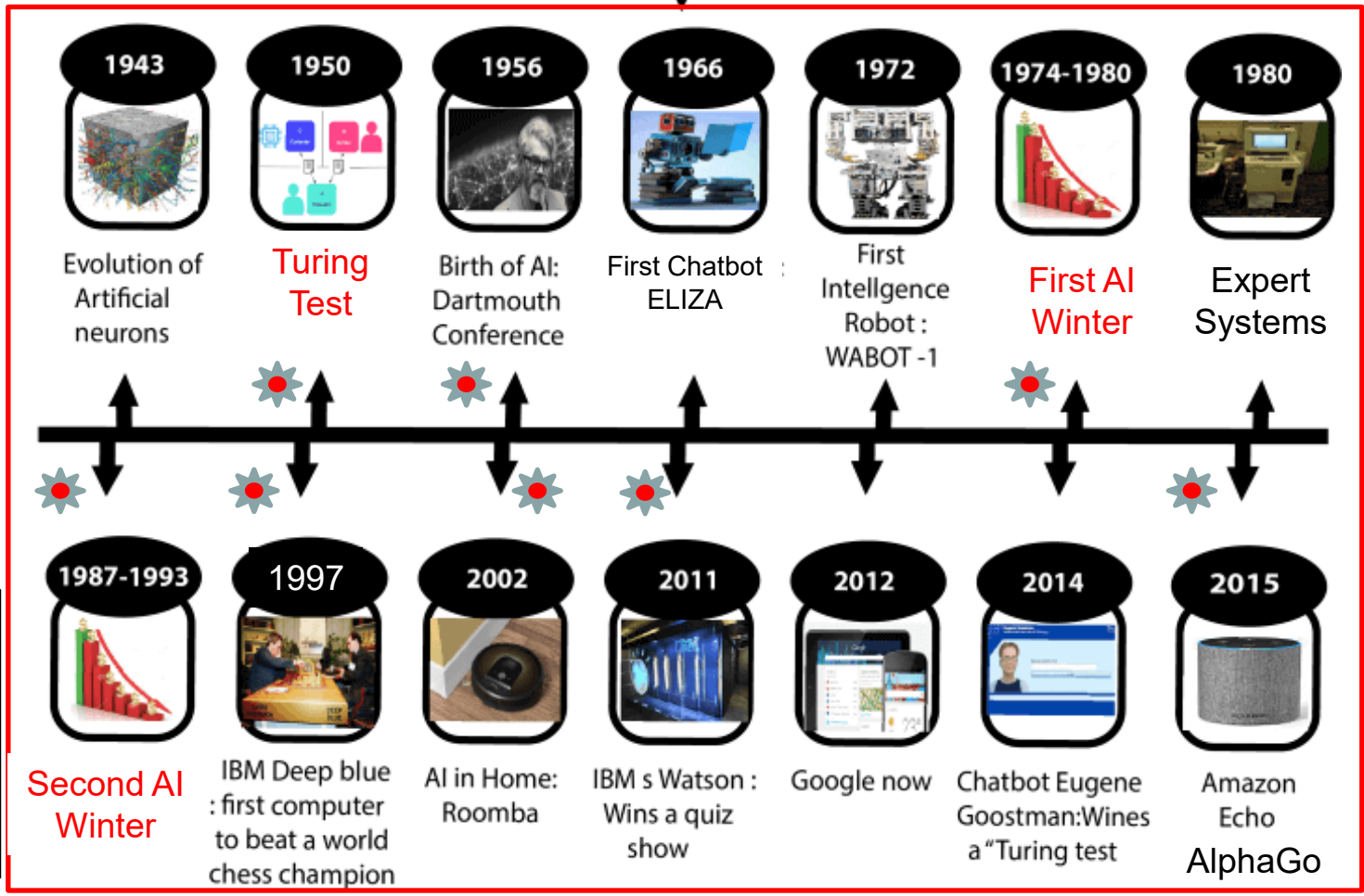
- Neuroscience
- Fuzzy Theory
- Control Theory

Tuning is not learning!

History of Artificial Intelligence



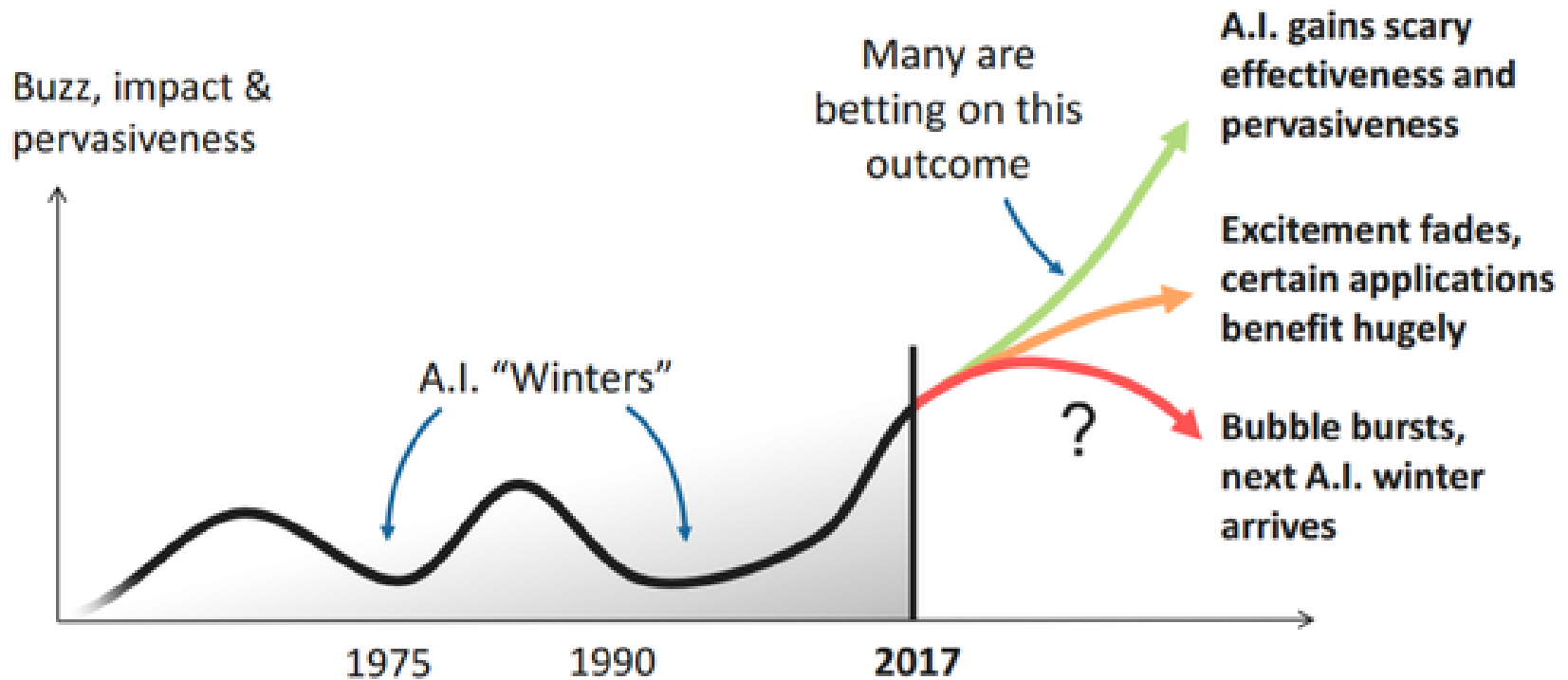
History of AI



Big Question:
Does intelligence arise from brain or mind?

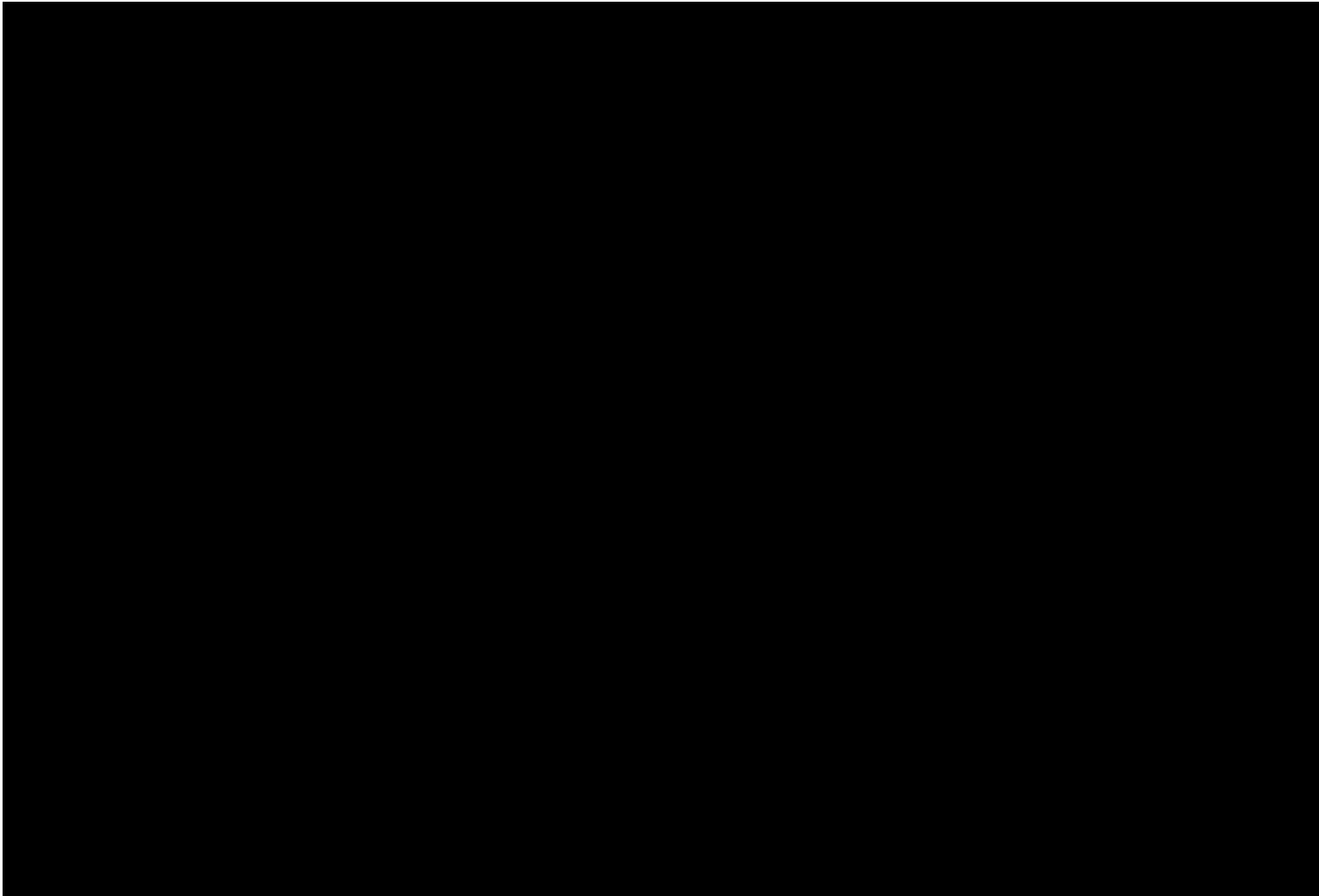
Special Pattern of AI's History

AI is enjoying significant hype and investment



2009	AI 3.0 (Machine's Self-Intelligence) (机器内智) (自具之智, 人赋)
2000	AI 2.0 (Machine Learning) (机器学习)
1956	AI 1.0 (Machine Thinking) (机器思考)

MIT's Opinion About Deep Fake Learning



One Example of Machine's Fake Learning



8-12 JANUARY 2024

GLOBAL YOUNG SCIENTISTS SUMMIT

EXCITE • ENGAGE • ENABLE

Organised by
NATIONAL RESEARCH FOUNDATION
PRIME MINISTER'S OFFICE
SINGAPORE



Adversarial Examples:

- Were discovered in 2013 by Szegedy et al and Biggio et al
- Have major security implications and applications



88% tabby cat

adversarial
perturbation →



99% guacamole

Salad made of avocado

Another Example of Machine's Fake Learning



8-12 JANUARY 2024

GLOBAL YOUNG SCIENTISTS SUMMIT

EXCITE • ENGAGE • ENABLE

Organised by
NATIONAL RESEARCH FOUNDATION
PRIME MINISTER'S OFFICE
SINGAPORE

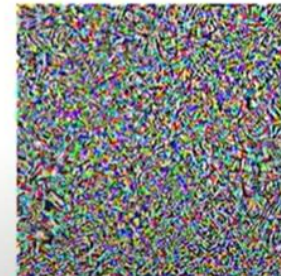


Pigs can fly:

"pig"



+ 0.005 x



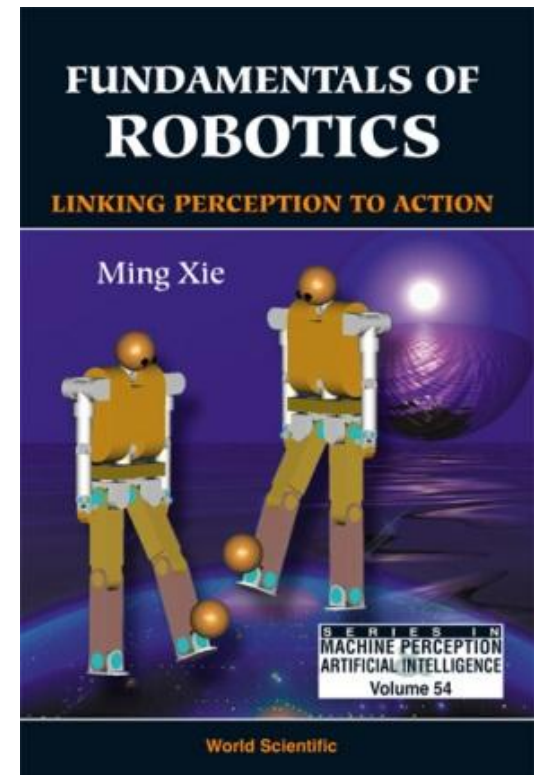
=

"airliner"



Intelligence arises from educable mind (i.e., to have innate learning capabilities) ...

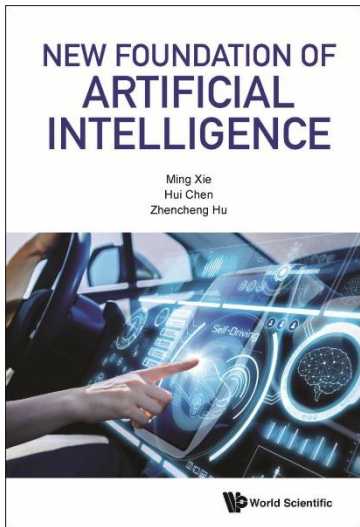
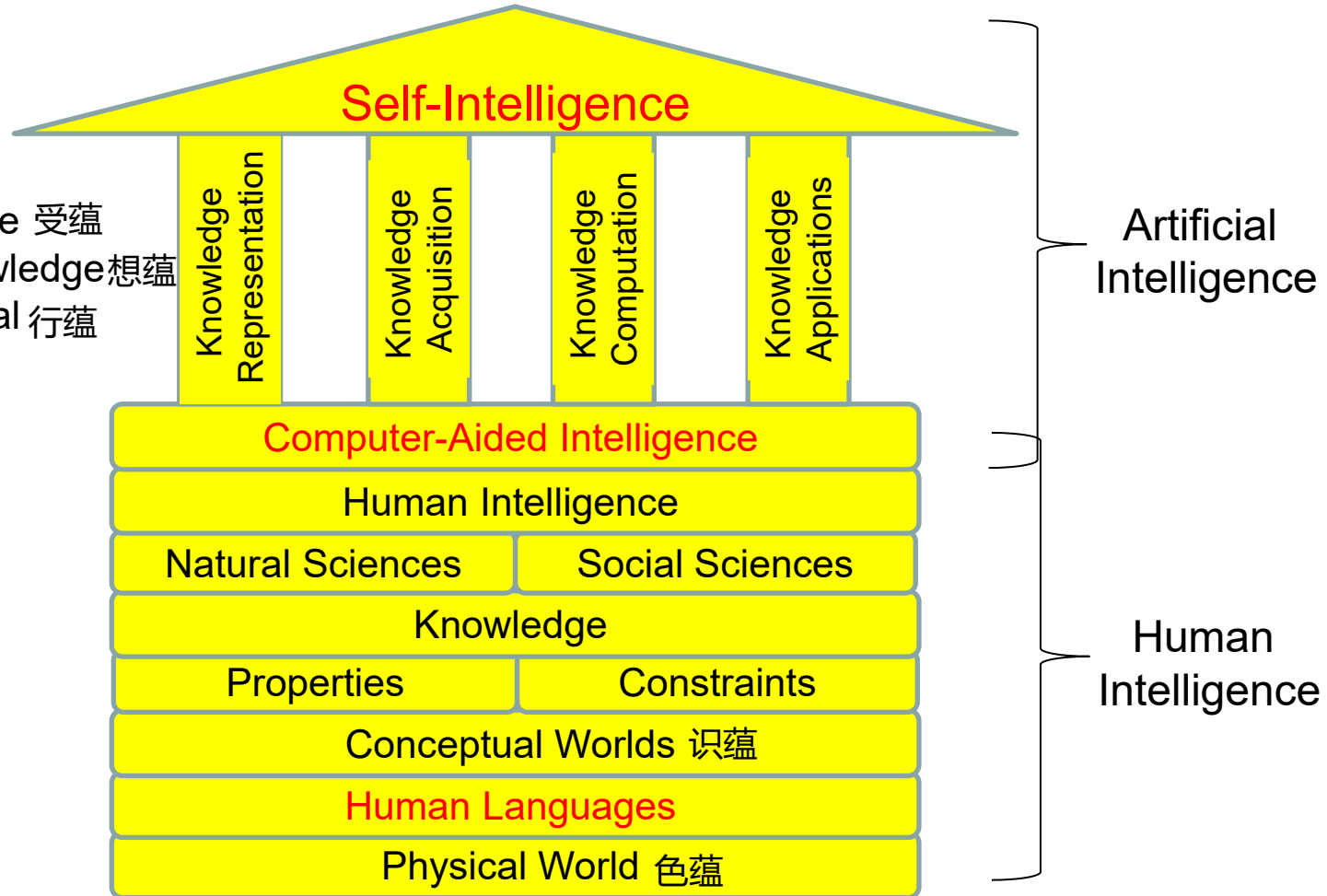
- In my book published in 2003, I said that the necessary condition for a humanoid robot to be able to learn is to be educable.
- How much promise remains for entrepreneurs? Plenty, Gates insisted during a tour of several top universities in 2004. In a stop at MIT, a student asked Bill Gates if another tech company could ever match Microsoft's success. "If you invent a breakthrough in artificial intelligence so machines can learn," he responded, "that is worth 10 Microsoft."



New Foundation of AI: How to achieve a humanoid robot's self-intelligence? ...

- One Tool
- Two Worlds
- Three Intelligences
- Four Pillars

- Signal to Knowledge 受蕴
- Knowledge to Knowledge 想蕴
- Knowledge to Signal 行蕴



New Era of AI: Third Generation of AI or AI 3.0 ...

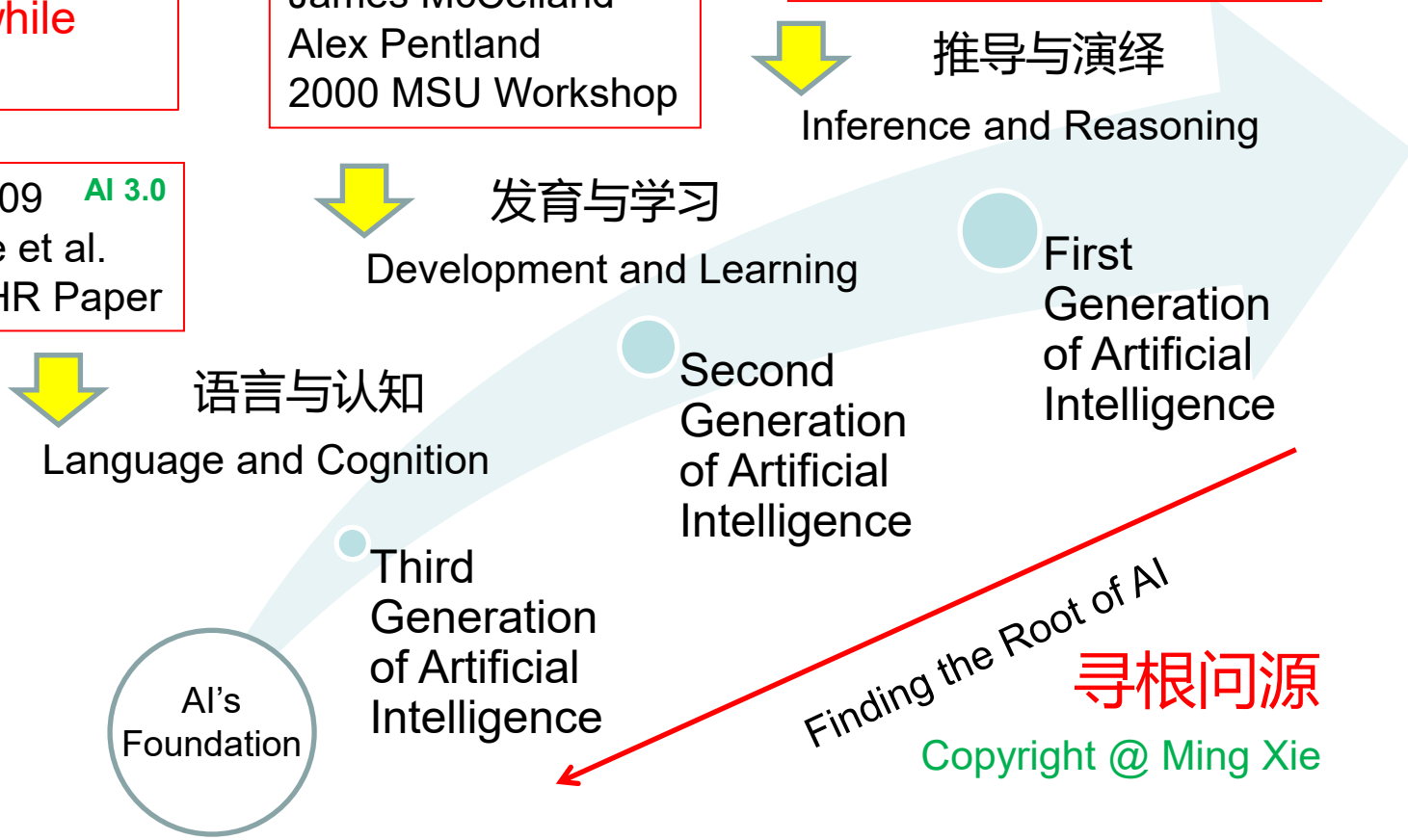
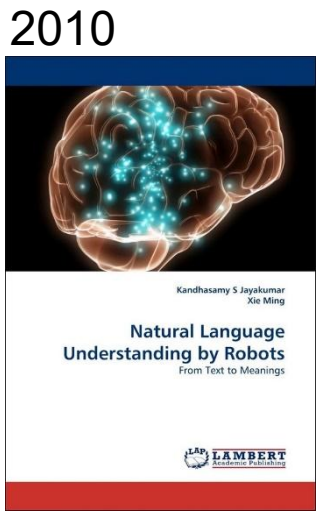
Intelligence arises from mind, but not from brain.

Brain develops while mind learns.

1943-1956 AI 1.0
 John McCarthy
 Marvin Minsky
 Nathaniel Rochester
 Claude Shannon
 1956 Dartmouth Workshop

1992-2000 AI 2.0
 John Weng
 James McCelland
 Alex Pentland
 2000 MSU Workshop

2003-2009 AI 3.0
 Ming Xie et al.
 2009 IJHR Paper



AI's Foundation

Finding the Root of AI
寻根问源
 Copyright @ Ming Xie

New Definition of Artificial Intelligence

Old Definition of AI

- Artificial intelligence refers to **computer-aided human intelligence**, which aims at programming human ways of **doing perception, planning and action**.
- **Computer-aided Intelligence is not equal to Computer Intelligence!**

New Definition of AI

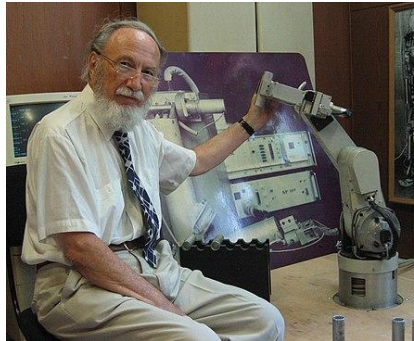
- Artificial intelligence refers to **machine's self-intelligence**, which aims at discovering and implementing the principles behind the transformations from signals to cognitive states of knowing the meanings inside the signals **and vice versa**.

Outline of Today's Talk

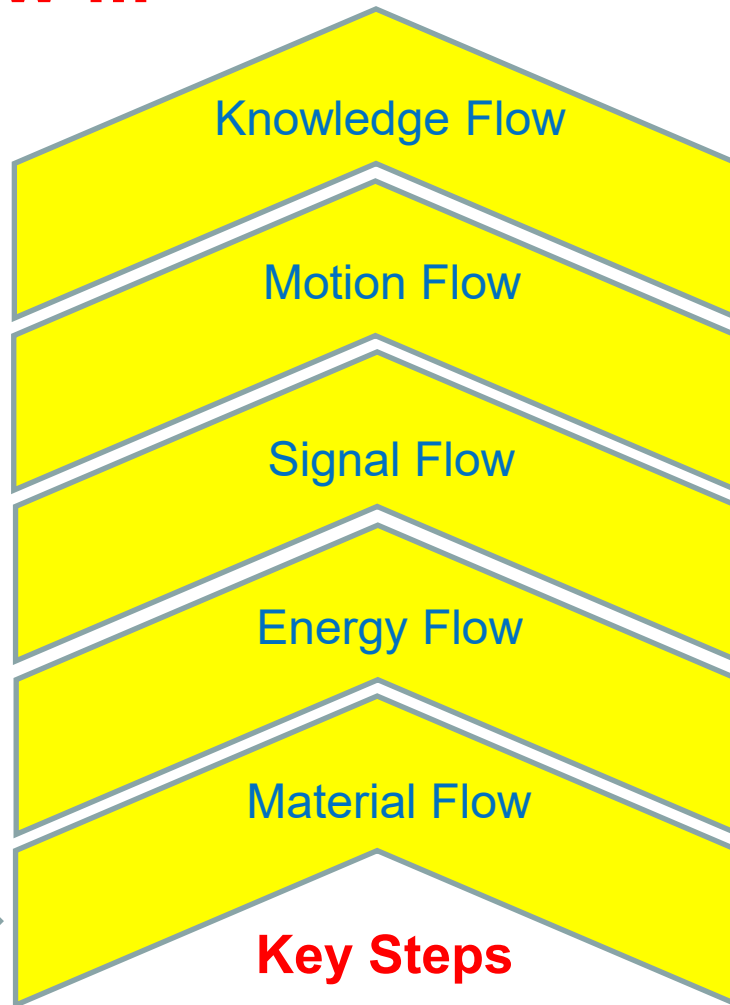
- What is humanoid robot?
- What are the domain knowledge behind humanoid robot?
- What are the key steps toward development of humanoid robot?
 - Material Flow Inside Humanoid Robots
 - Energy Flow Inside Humanoid Robots
 - Signal Flow Inside Humanoid Robots
 - Motion Flow Inside Humanoid Robots
 - Knowledge Flow Inside Humanoid Robots
- Concluding Remarks



The key solutions underlying the development of humanoid robot could be grouped into these five layers of flow ...



Miomir Vukobratovic
(1931-2012)
Discovery of ZMP



- Cognition
- Recognition
- Interaction
- Perception
- Planning
- Control
- Motion Kinematics
- Motion Dynamics
- Position Sensors
- Velocity Sensors
- Force/Torque Sensors
- Visual/Acoustic Sensors
- Power Suppliers
- Actuators and Controllers
- Appearance
- Structure
- Mechanism
- Computing
- Memory

Any smart dynamic system has a physical body and brain



Key Steps

Material flow is important to the design of ...

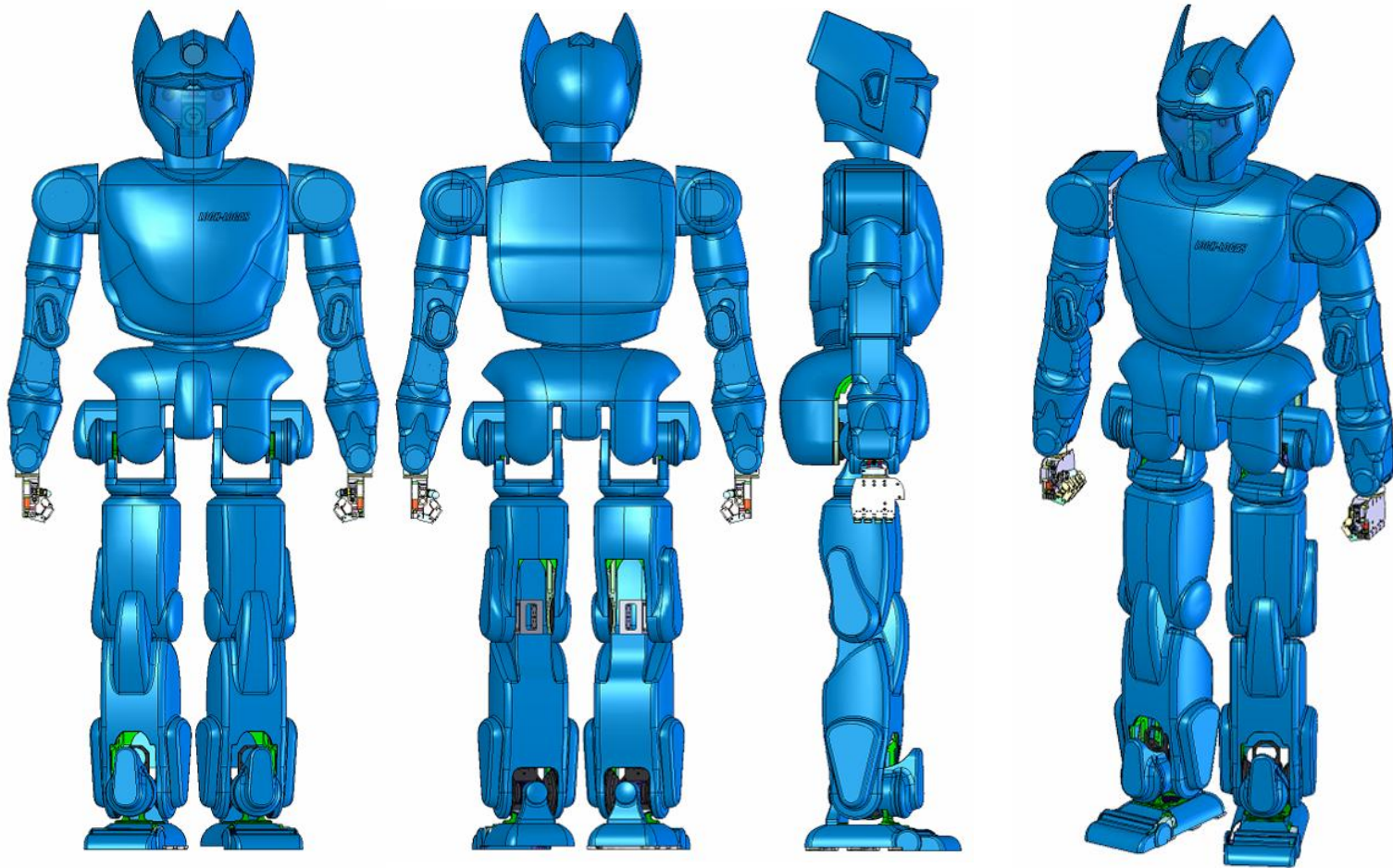
Mechanical Body

- Which is a network of rigid links, actuators, sensors and controllers.
- Links form mechanisms
- Links form structures
- Links form appearances

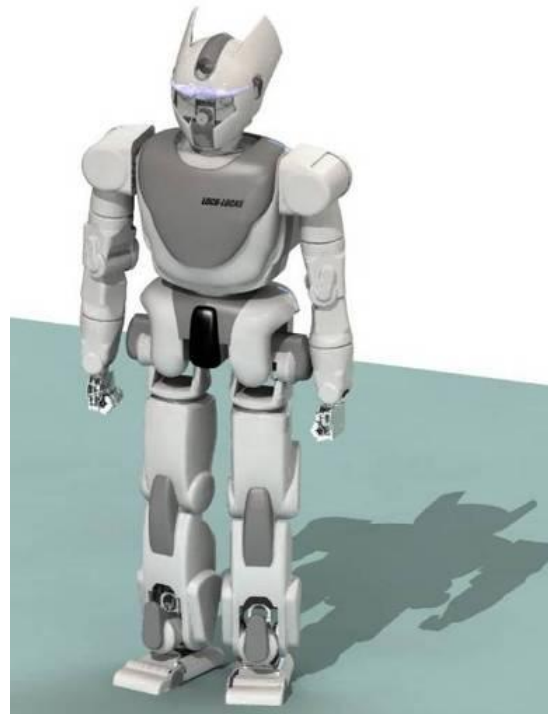
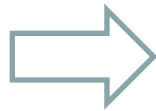
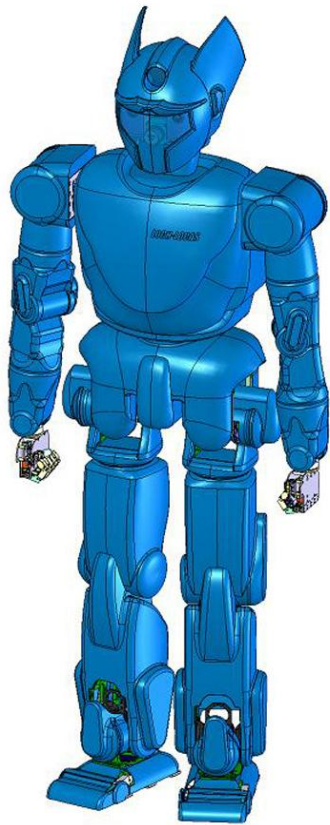
Electronic Brain

- Which is a network of neurons or transistors
- Neurons or transistors create logic gates
- Logic gates create CPUs
- Logic gates also create memory devices

Our Example of Designed Appearance

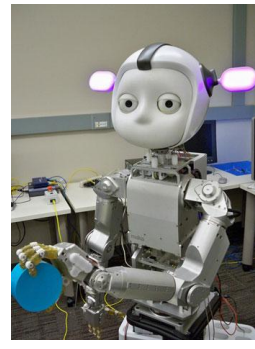


Our Example of Designed Appearance (continued)

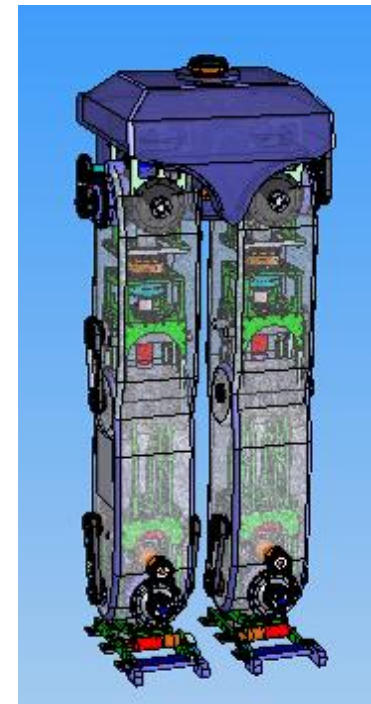
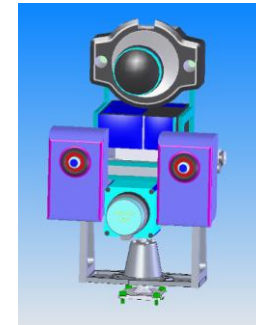
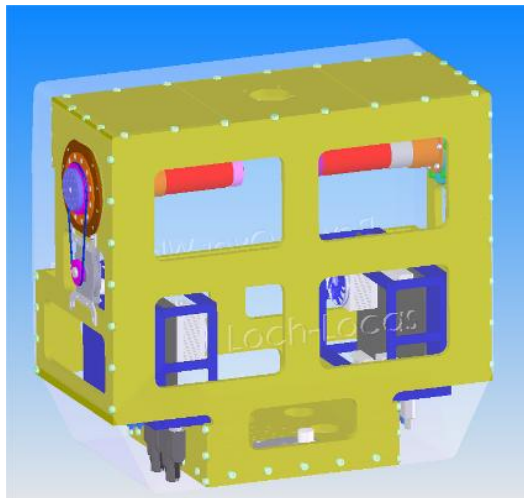
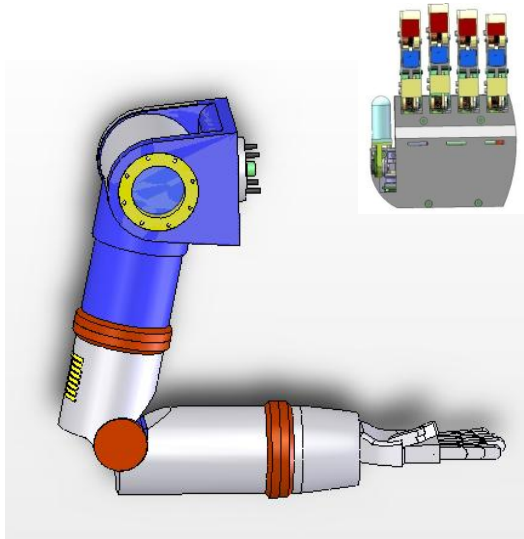




Others' Examples of Designed Appearance ...



Our Example of Designed Mechanism



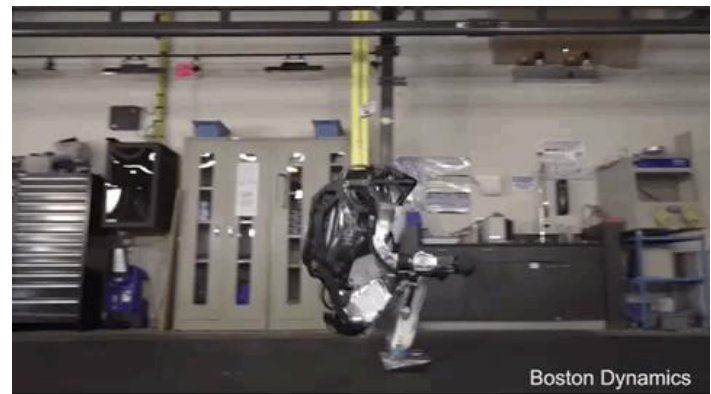
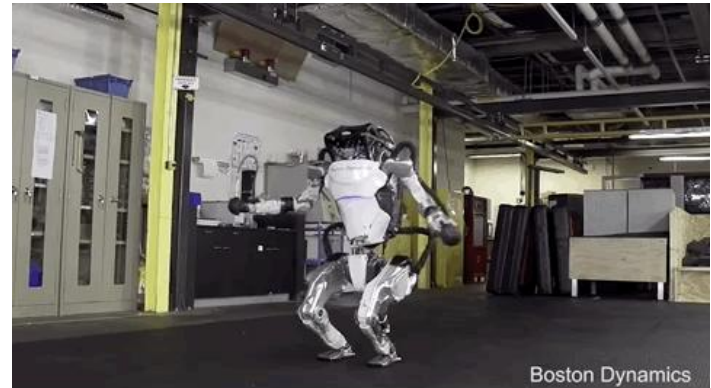
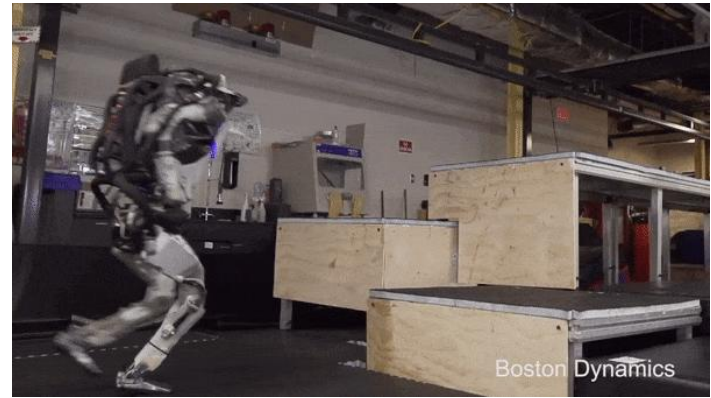
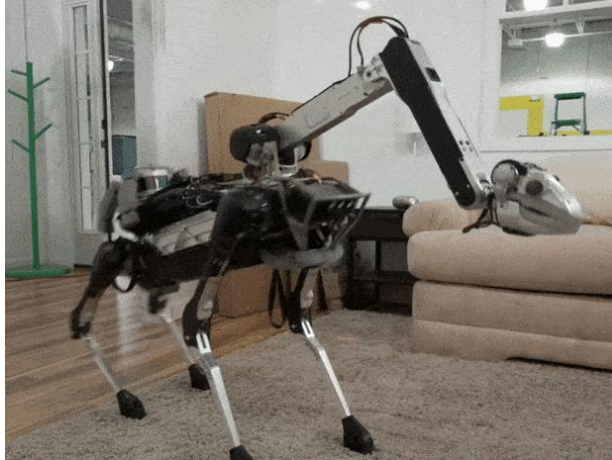
Early 1990s

(Modular 2-DOF Links)

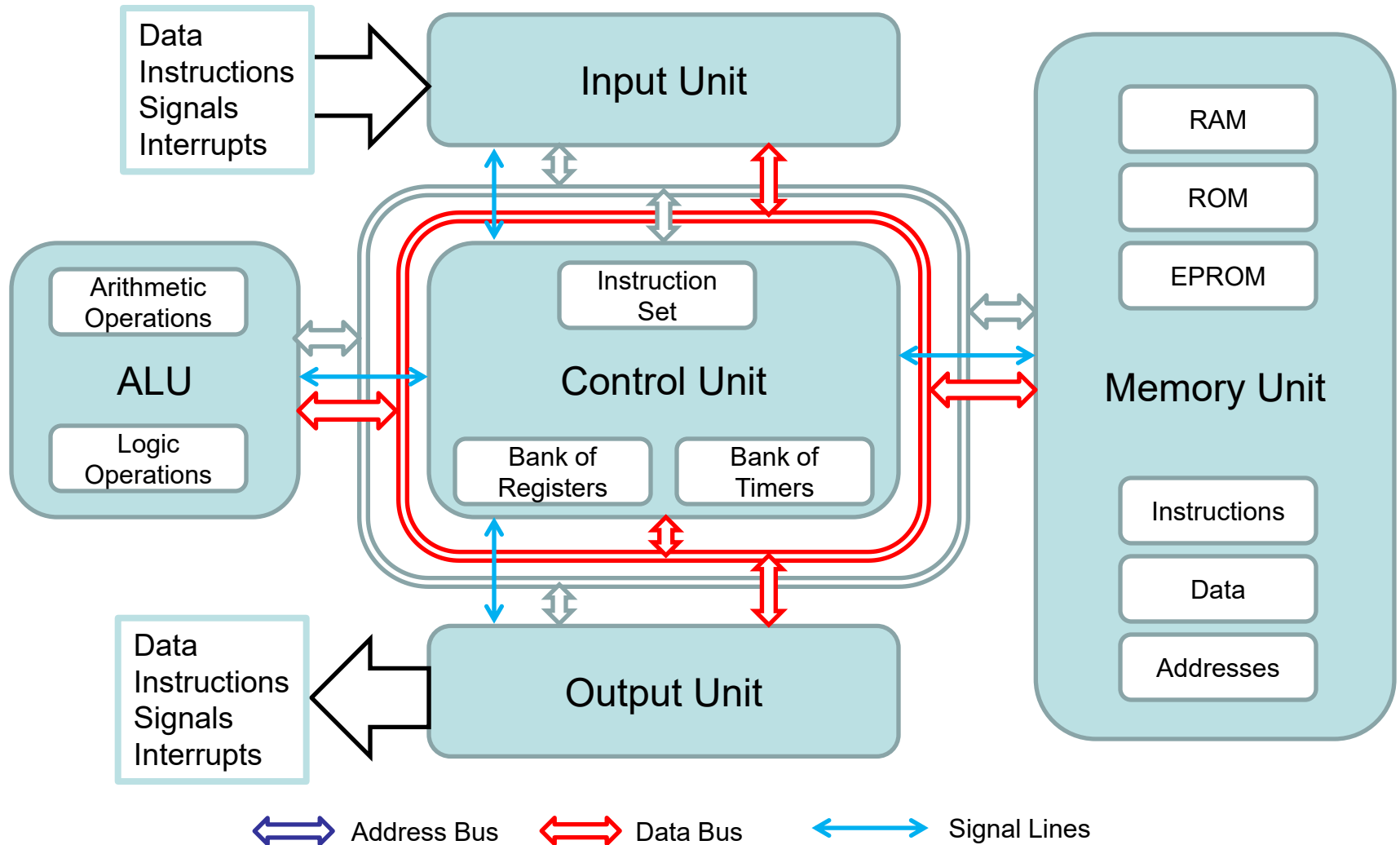


Others' Examples of Designed Mechanism

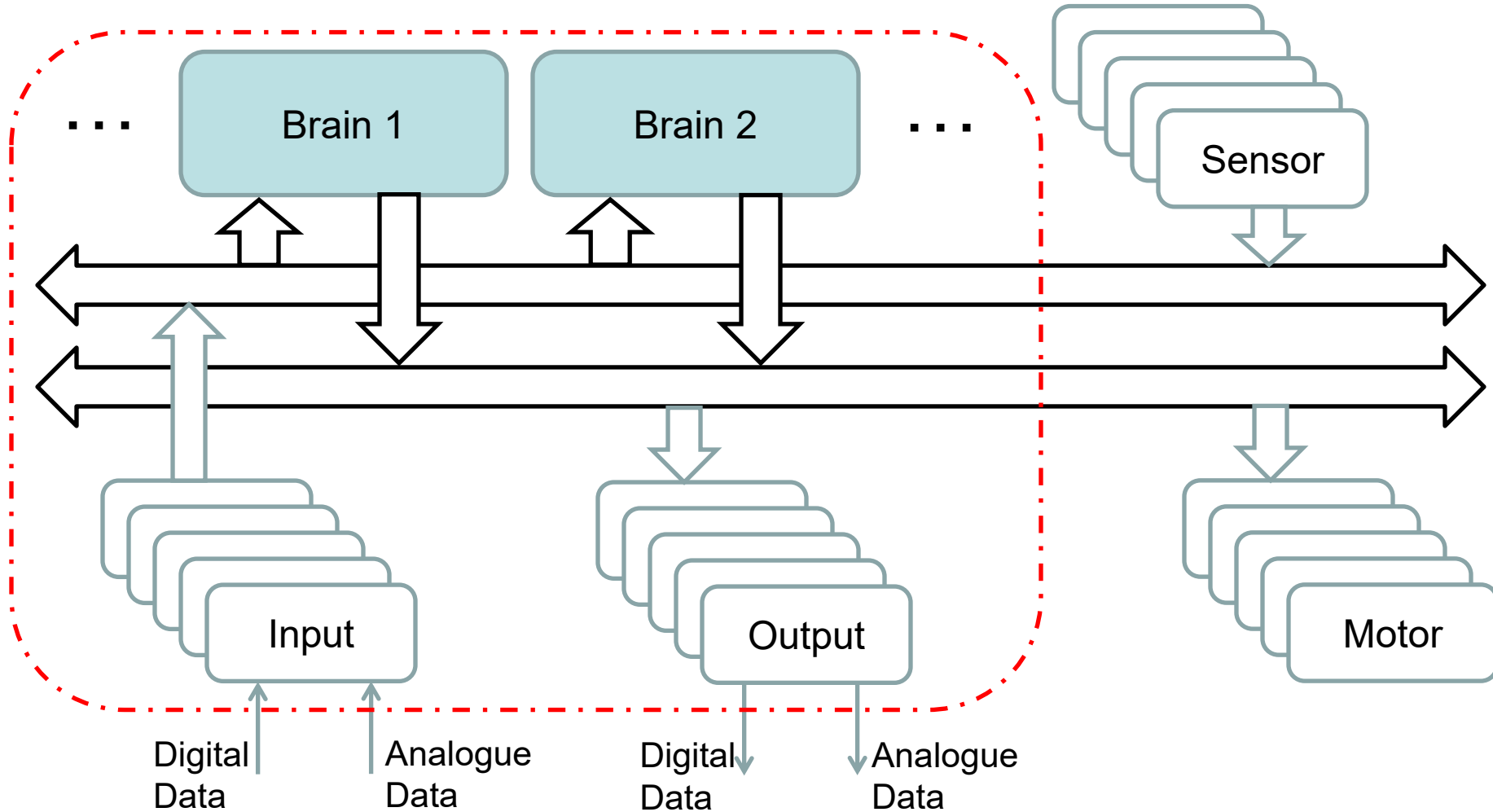
...



Electronic brains are made of logic gate devices which creates CPUs and memory units ...

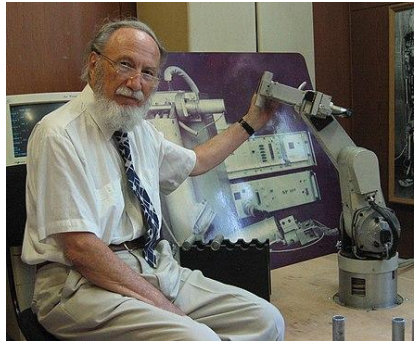


Example of Using Electronic Brains ...



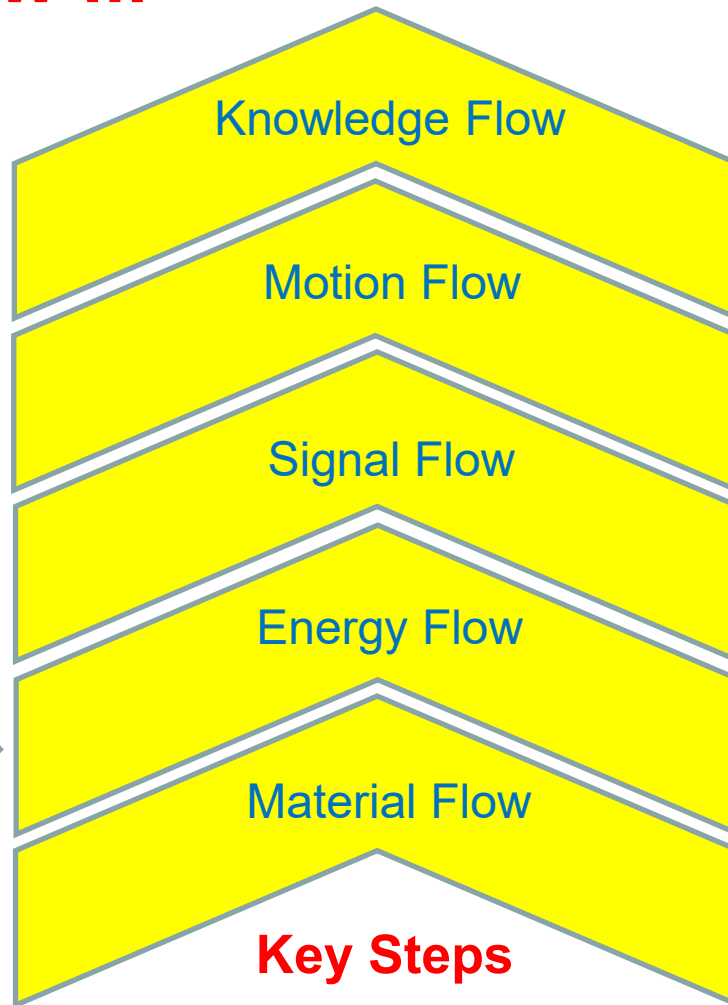
To support mental processes of doing: Signals → Knowledge → Knowledge → Signals

The key solutions underlying the development of humanoid robot could be grouped into these five layers of flow ...



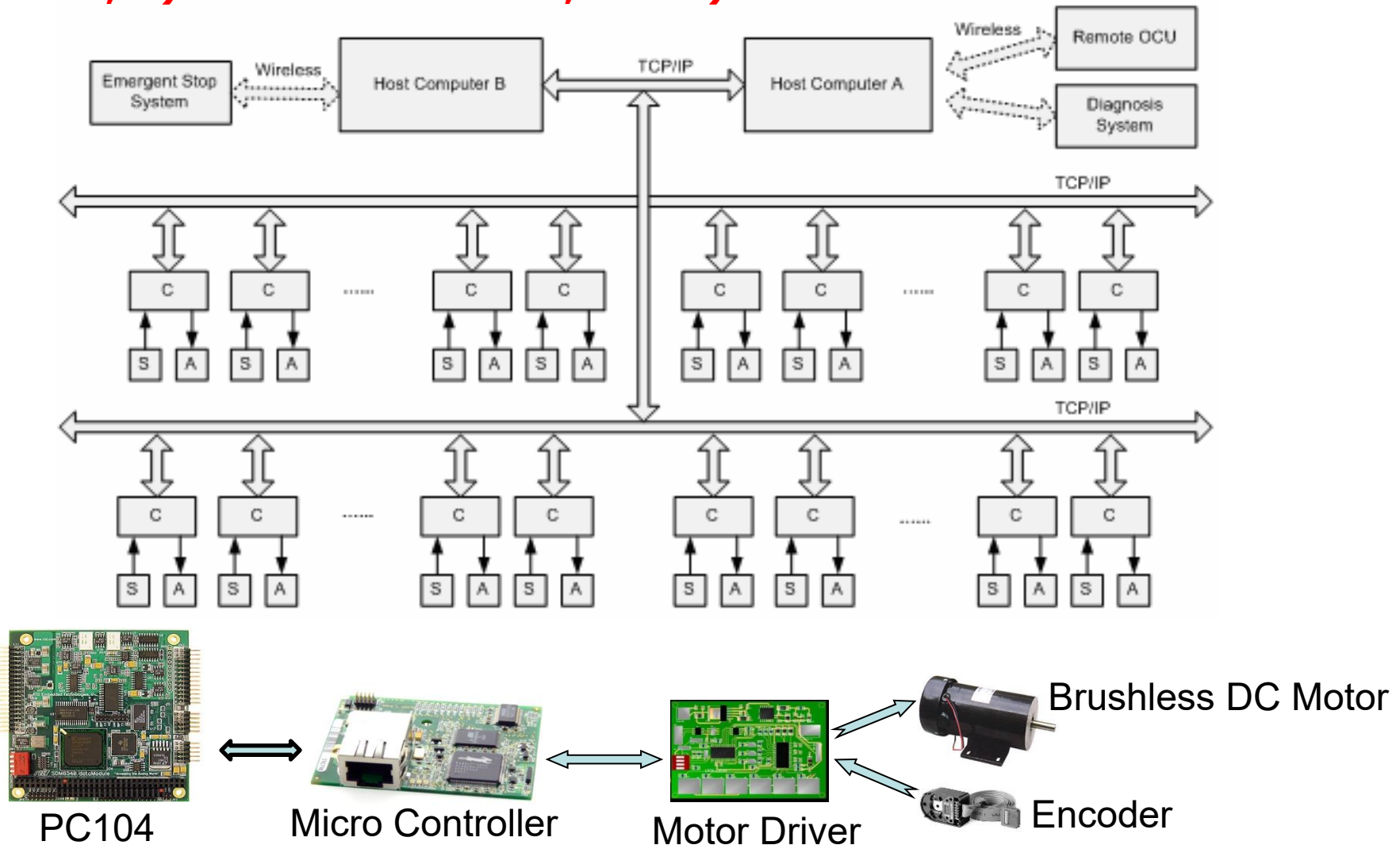
Miomir Vukobratovic
(1931-2012)
Discovery of ZMP

Any smart dynamic system consumes energy

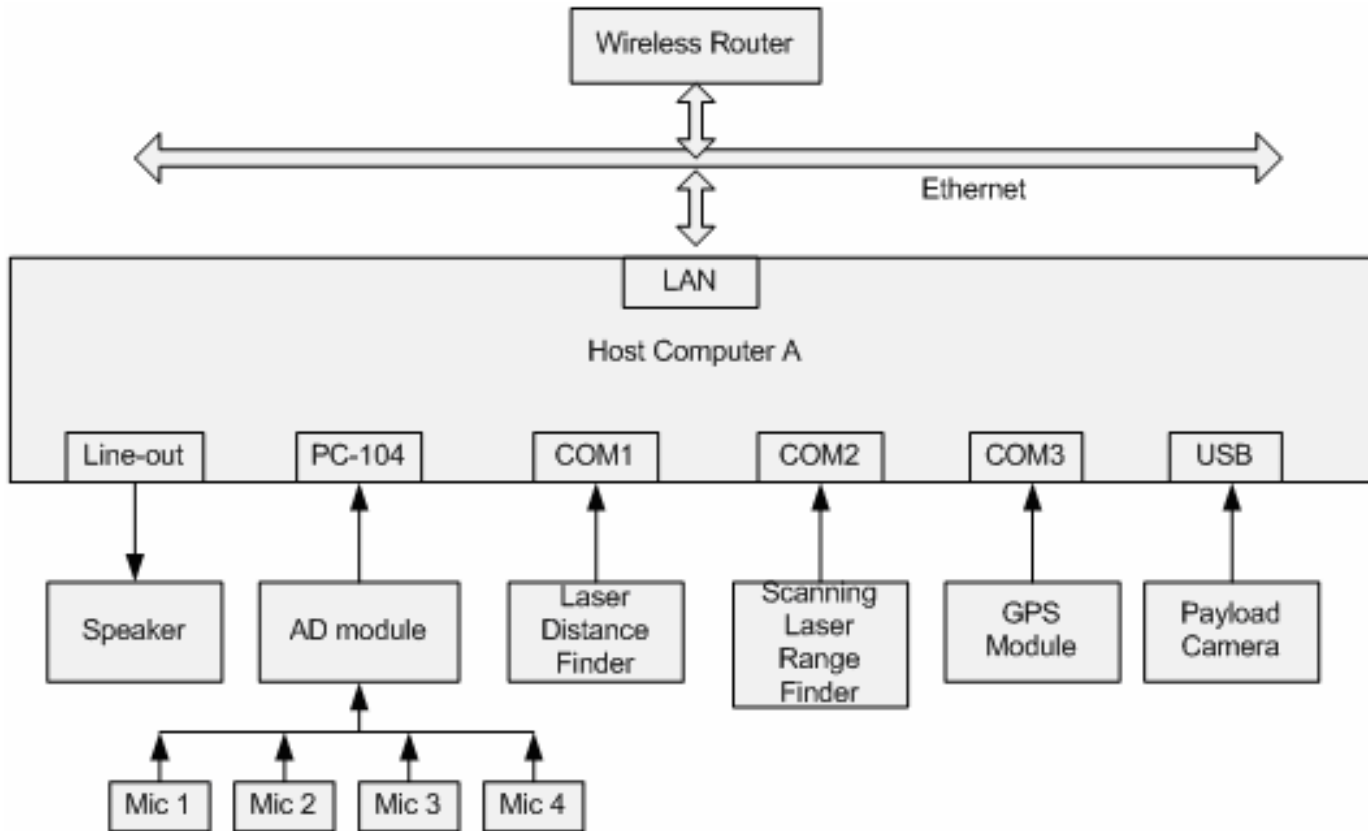


- Cognition
- Recognition
- Interaction
- Perception
- Planning
- Control
- Motion Kinematics
- Motion Dynamics
- Position Sensors
- Velocity Sensors
- Force/Torque Sensors
- Visual/Acoustic Sensors
- Power Suppliers
- Actuators and Controllers
- Appearance
- Structure
- Mechanism
- Computing
- Memory

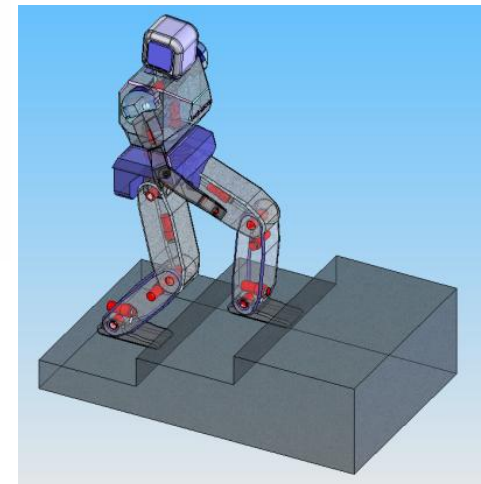
A humanoid robot's body consumes energy because it is a mini-version of IoT (Internet of Things) which includes: a) sensor network, b) actuator network, and c) controller network.



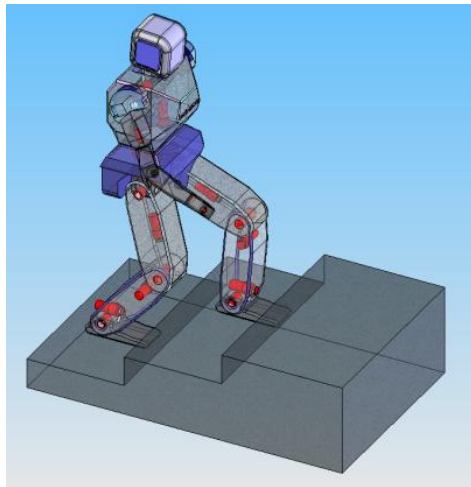
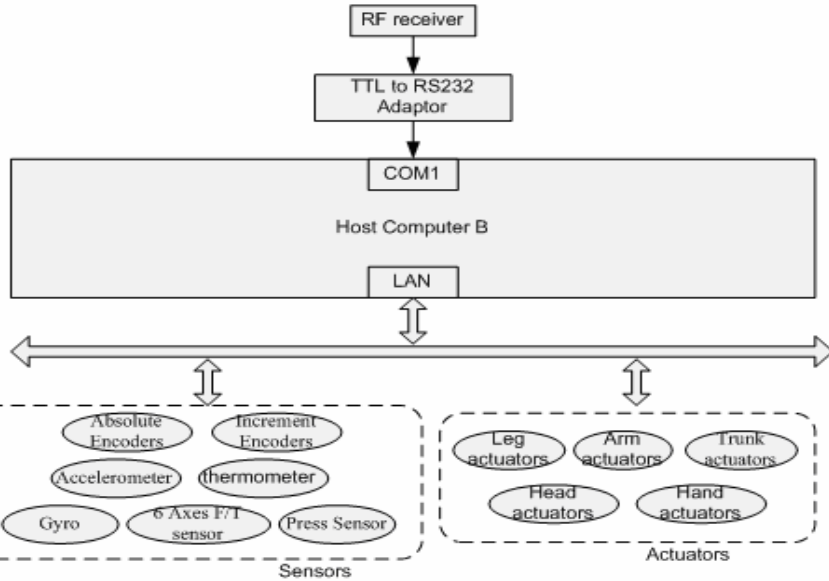
Humanoid Robot's Cerebrum Consumes Energy ...



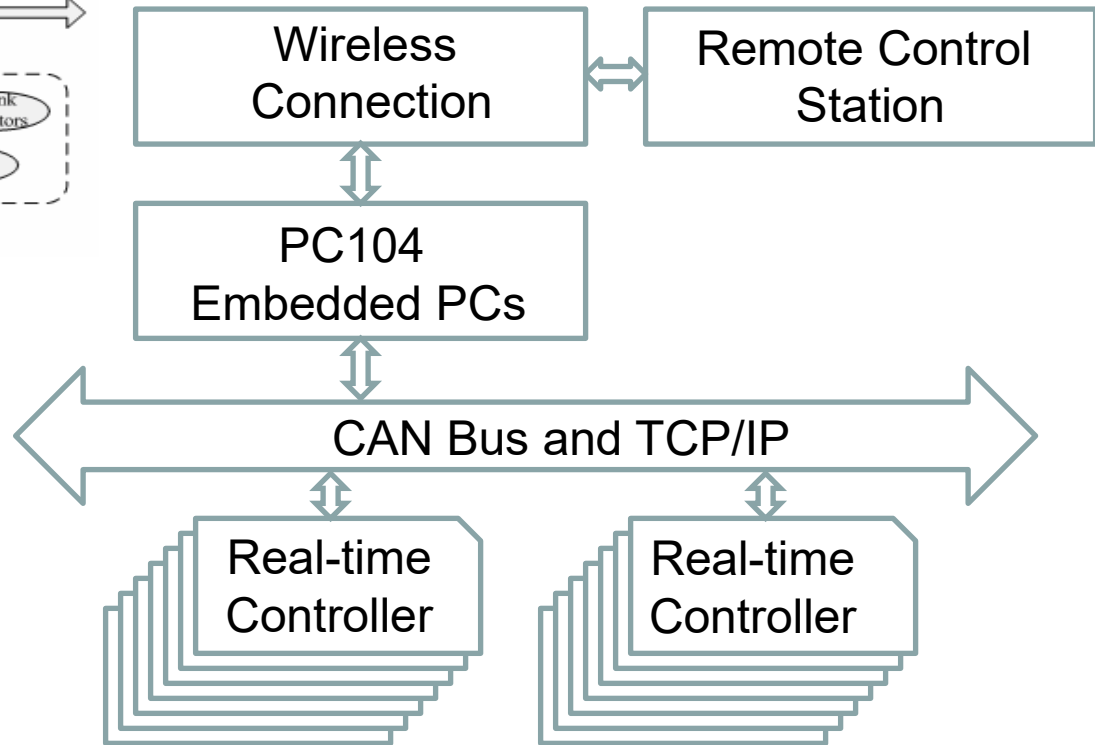
Cerebrum + Sensory Systems



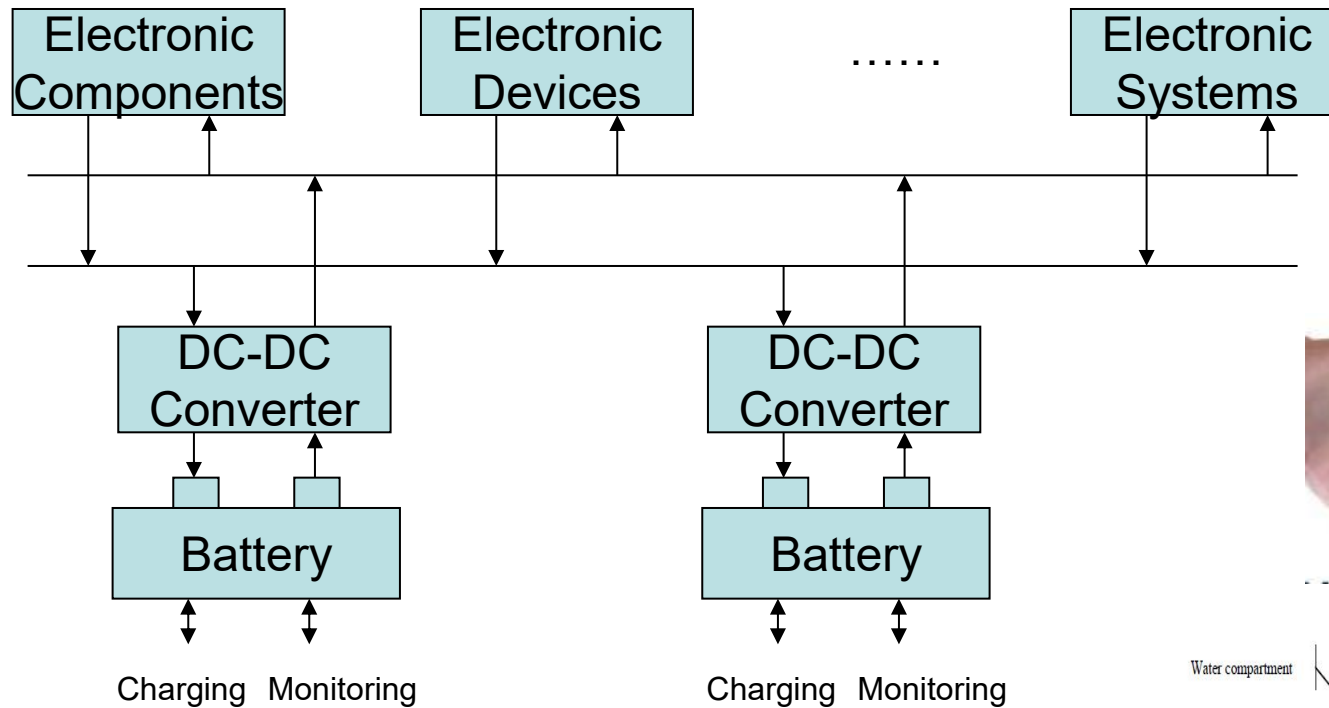
Humanoid Robot's Cerebellum Also Consumes Energy ...



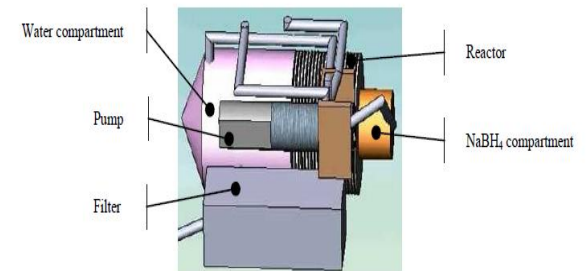
Cerebellum + Controllers



Our Example of Distributed Power Supply System ...



Hybrid Power Unit:
 1. Fuel-cell
 2. Battery



Example of Prototypes Powered by Single Actuator

(Results Achieved in Late 1990s)



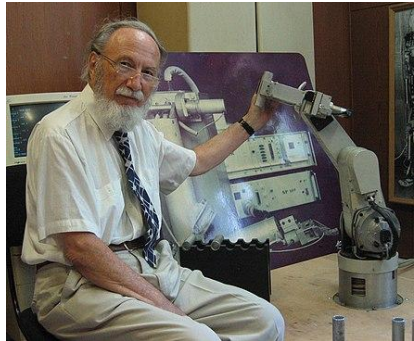
Example of Prototype Powered by Multiple Actuators



Other's Example of Prototype Powered by Multiple Actuators

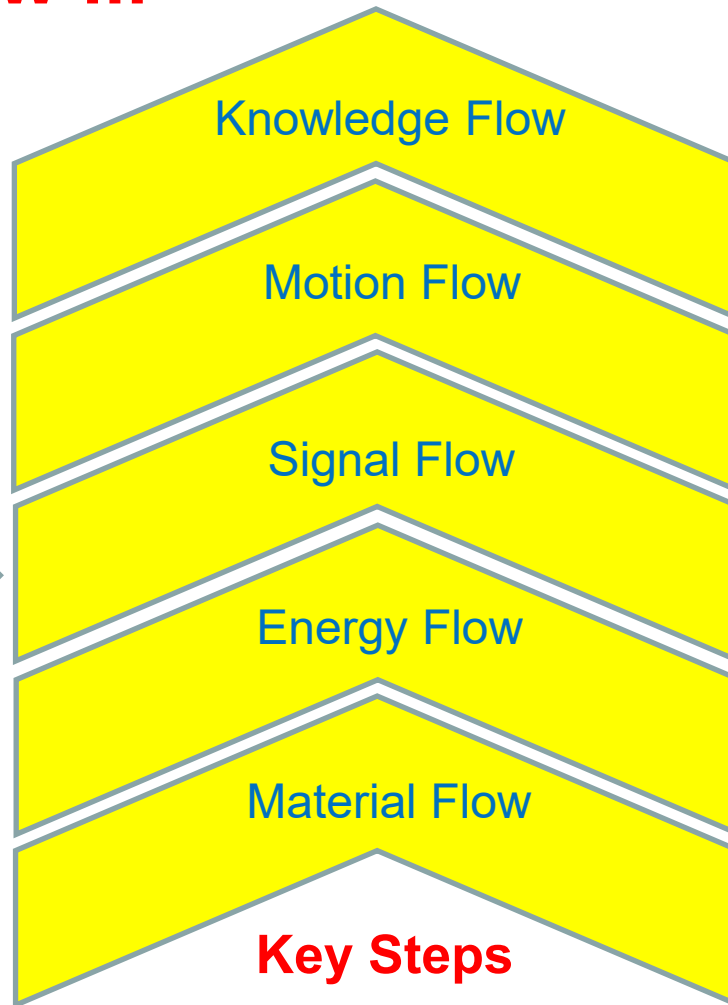


The key solutions underlying the development of humanoid robot could be grouped into these five layers of flow ...



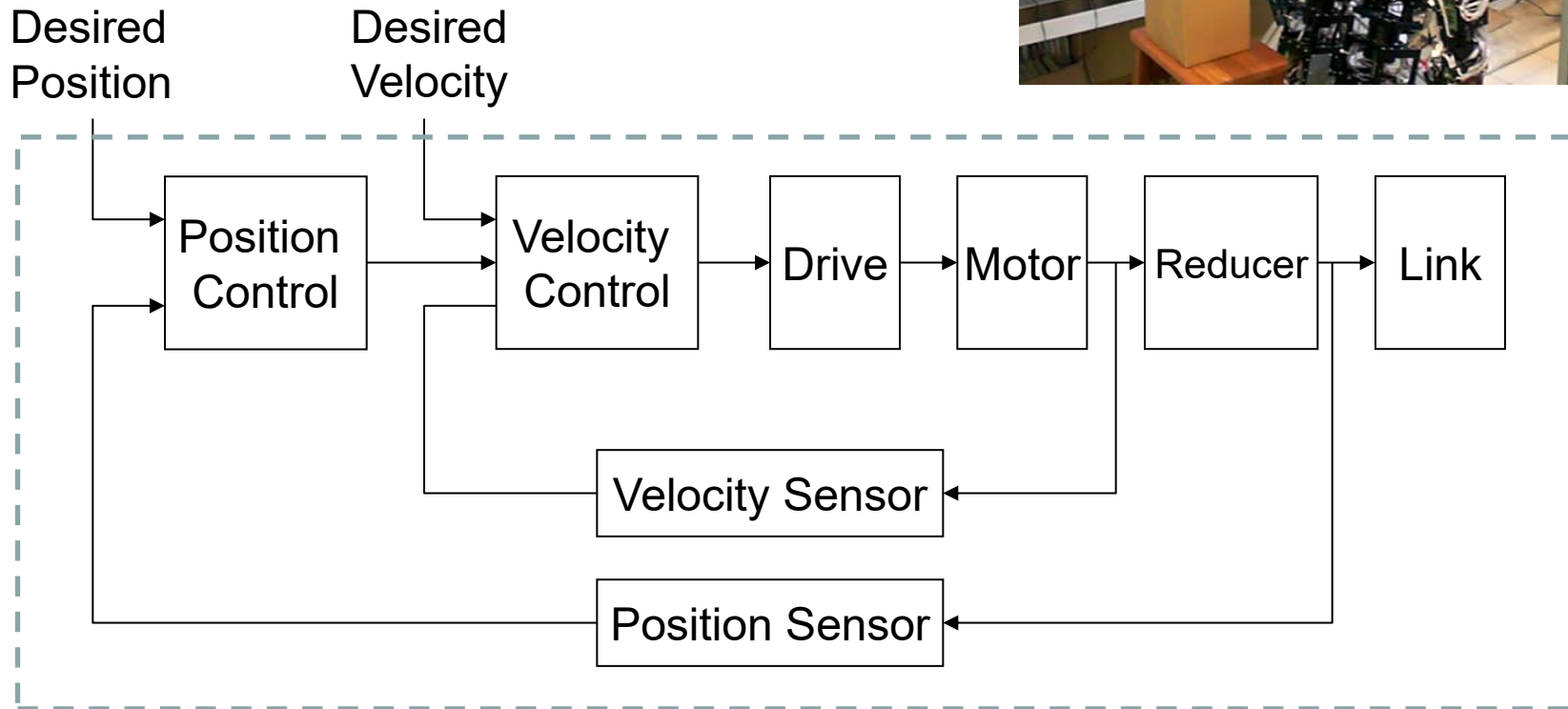
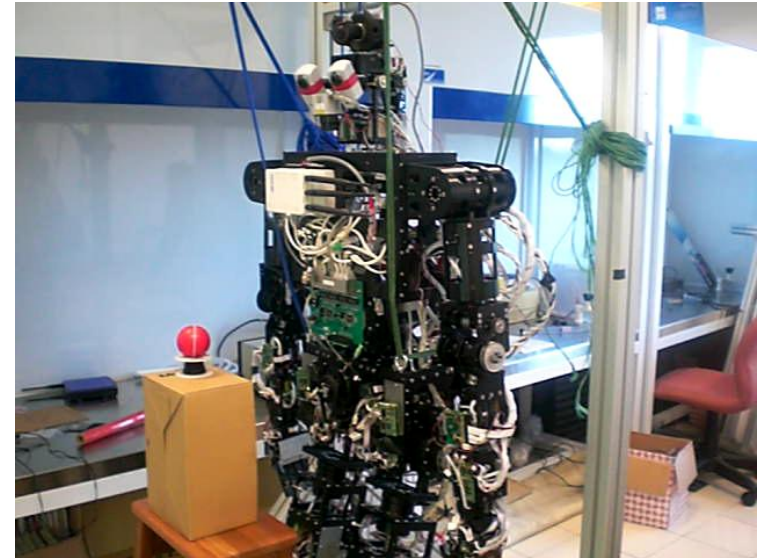
Miomir Vukobratovic
(1931-2012)
Discovery of ZMP

Any dynamic system has properties and constraints which could be manifested in the form of signals



- Cognition
- Recognition
- Interaction
- Perception
- Planning
- Control
- Motion Kinematics
- Motion Dynamics
- Position Sensors
- Velocity Sensors
- Force/Torque Sensors
- Visual/Acoustic Sensors
- Power Suppliers
- Actuators and Controllers
- Appearance
- Structure
- Mechanism
- Computing
- Memory

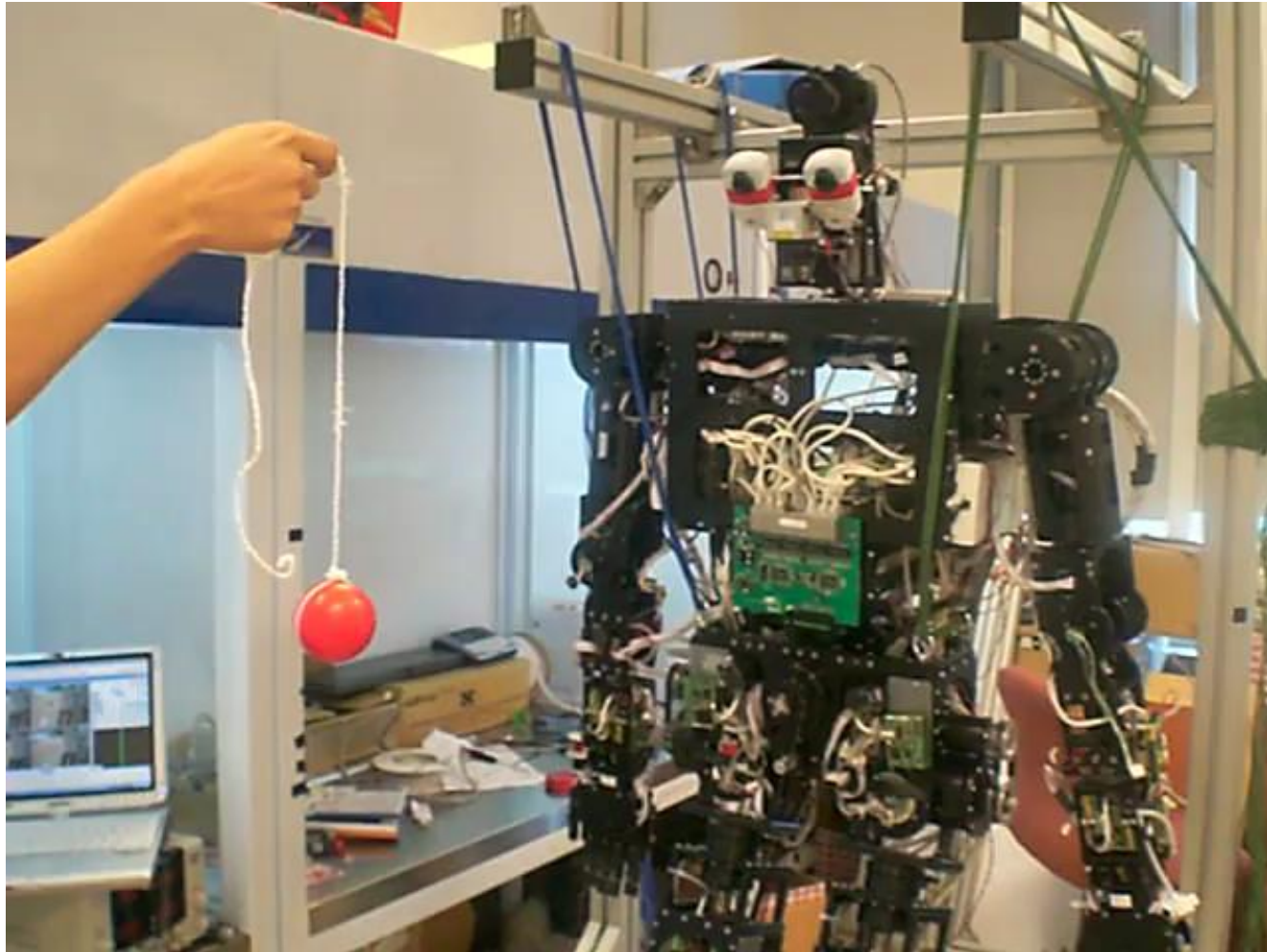
A humanoid robot lives inside an ocean of signals. It must be sensitive to: Signal Flows of Position, Velocity, Force, Torque, etc.



Example of Using Force/Torque Signals to Enable Human-Robot Interaction ...



Example of Using Visual Signals to Enable Human-Robot Interaction ...

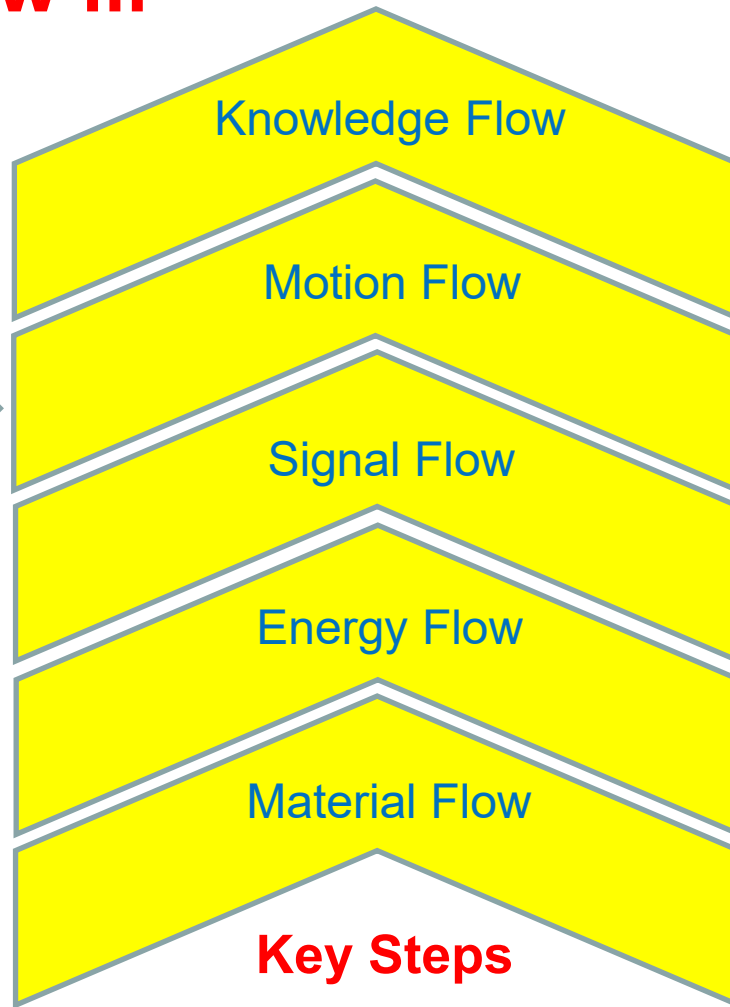


Example of Using Acoustic Signals to Enable Human-Robot Interaction ...

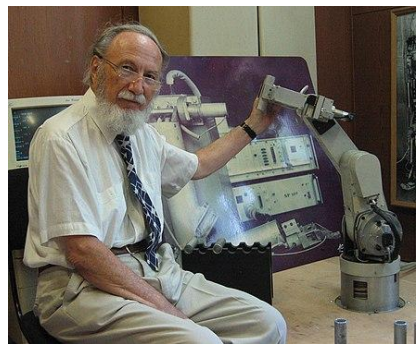


The key solutions underlying the development of humanoid robot could be grouped into these five layers of flow ...

Motion is the manifestation of kinetic energy

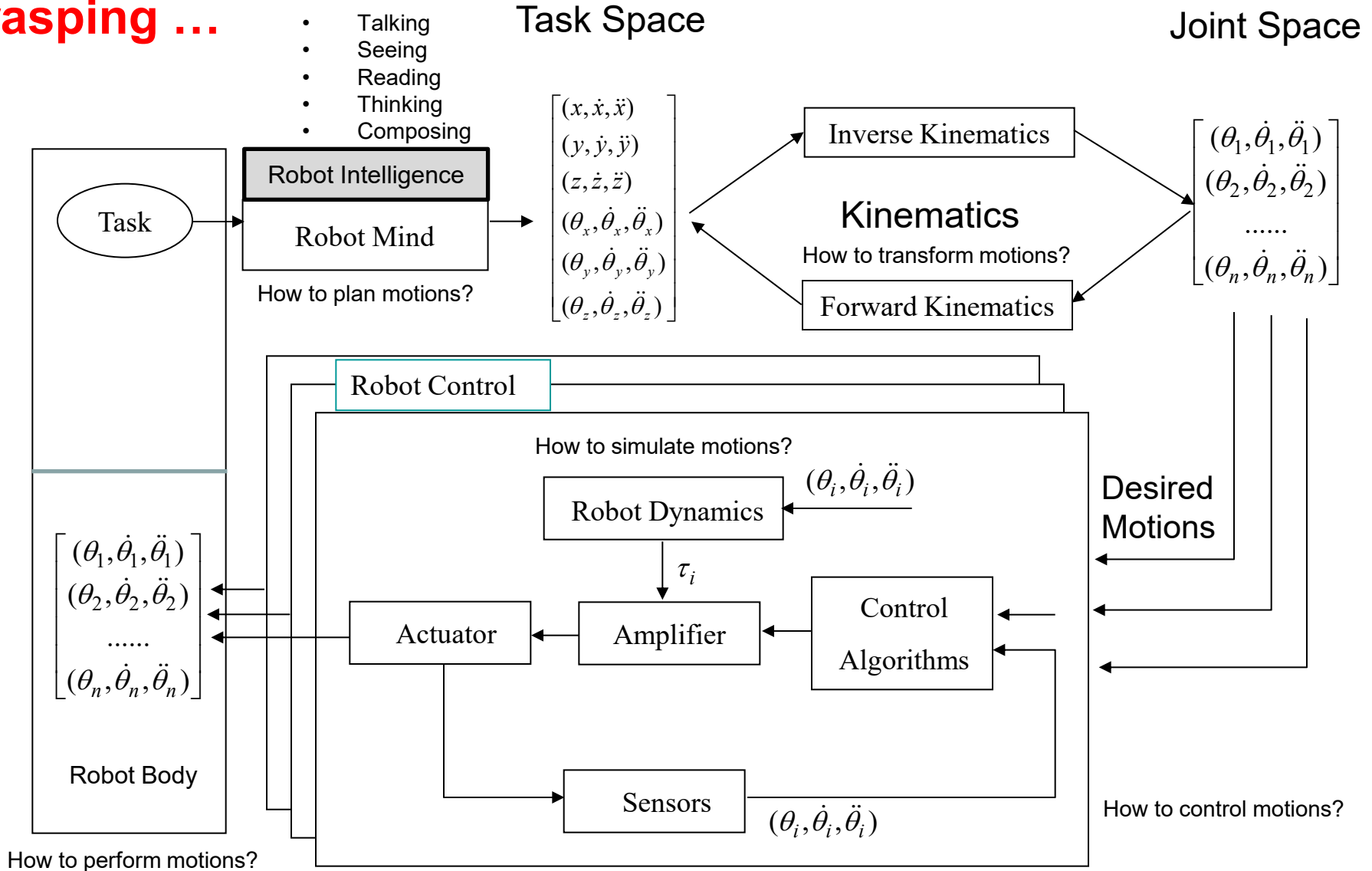


- Cognition
- Recognition
- Interaction
- Perception
- Planning
- Control
- Motion Kinematics
- Motion Dynamics
- Position Sensors
- Velocity Sensors
- Force/Torque Sensors
- Visual/Acoustic Sensors
- Power Suppliers
- Actuators and Controllers
- Appearance
- Structure
- Mechanism
- Computing
- Memory



Miomir Vukobratovic
(1931-2012)
Discovery of ZMP

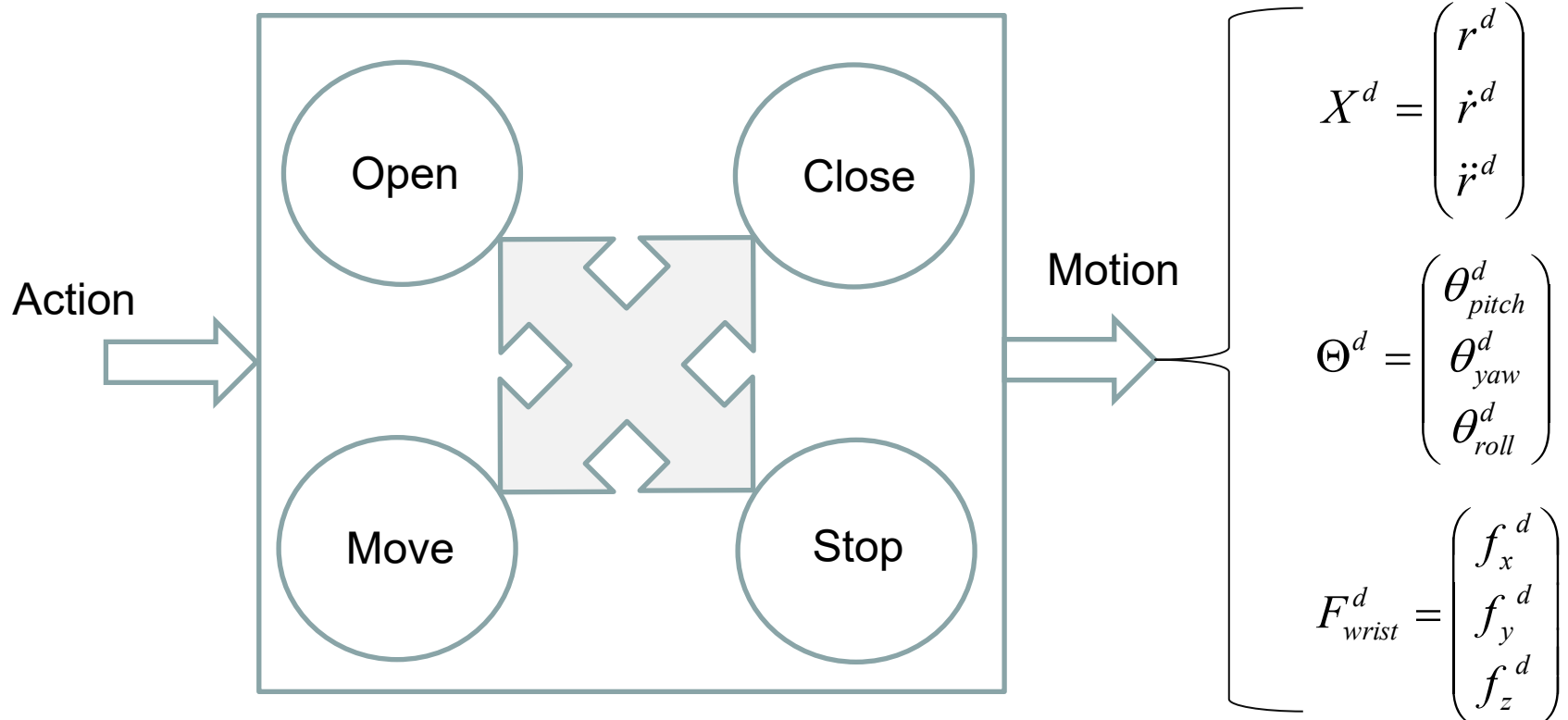
Motion Flows Are Related to Locomotion, Manipulation, and Grasping ...



Motion Flows Are Planned ...

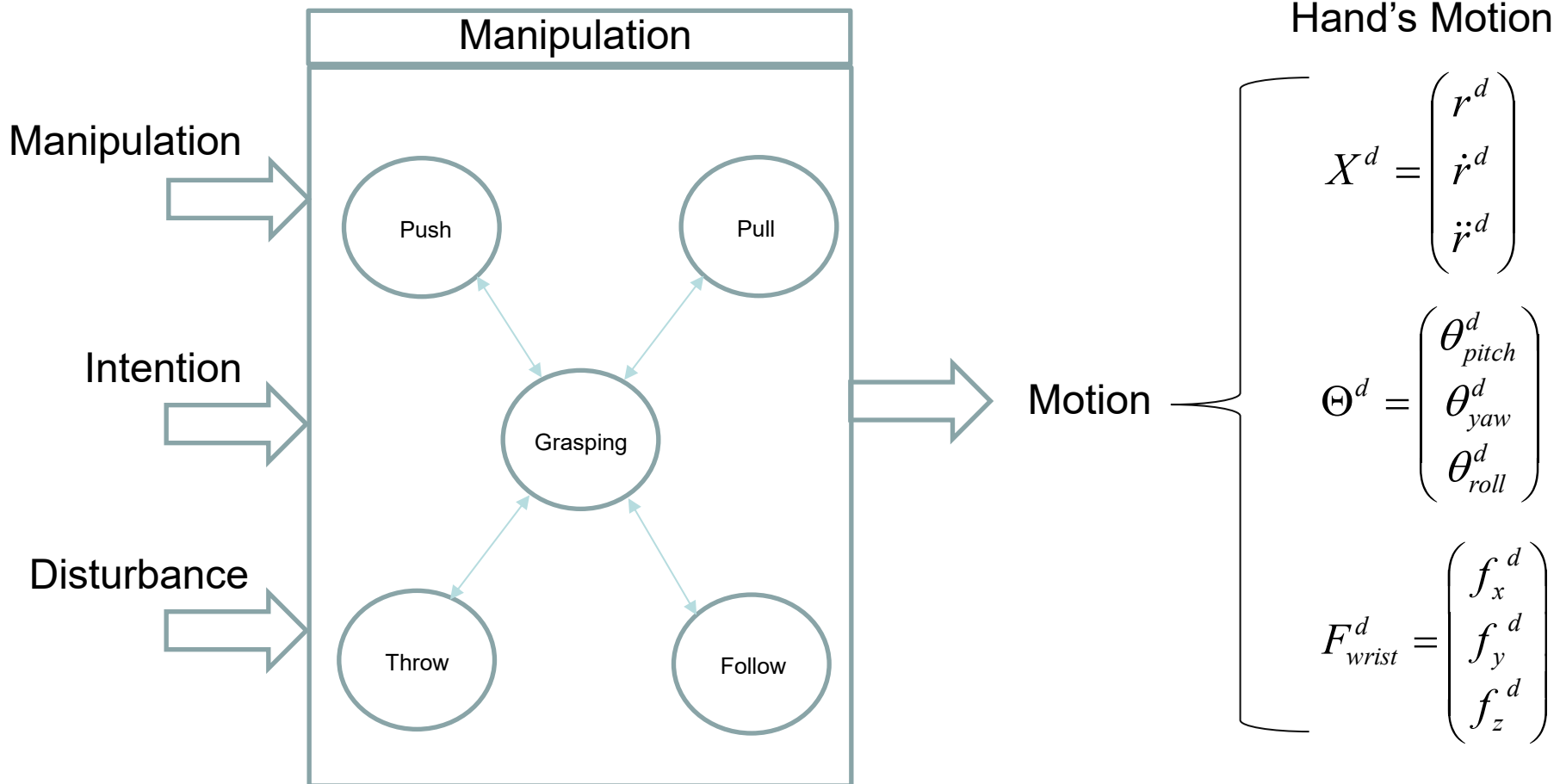
- Example of Planning Grasping Motion

Fingertip's Motion



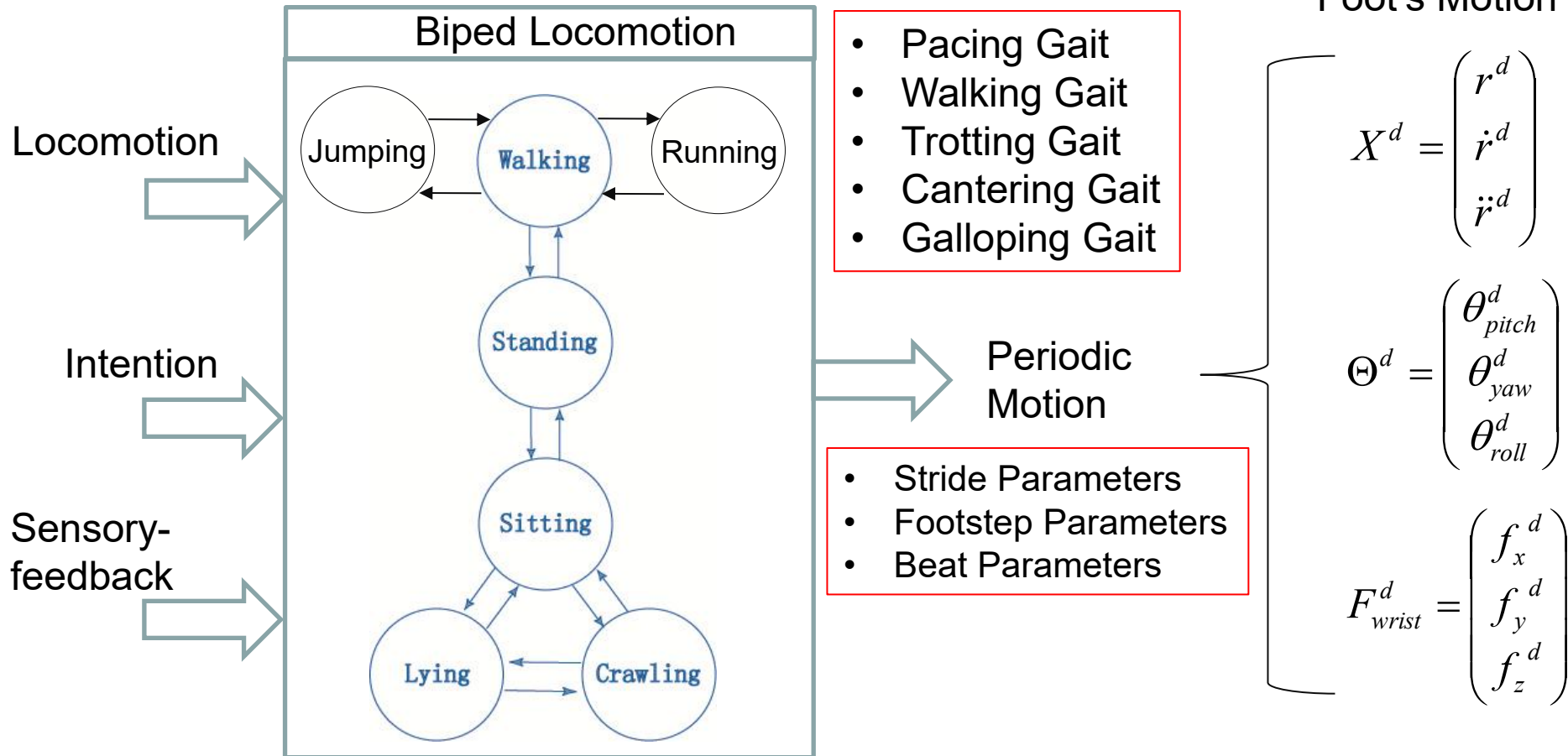
Motion Flows Are Planning ...

- Example of Planning Manipulation Motion



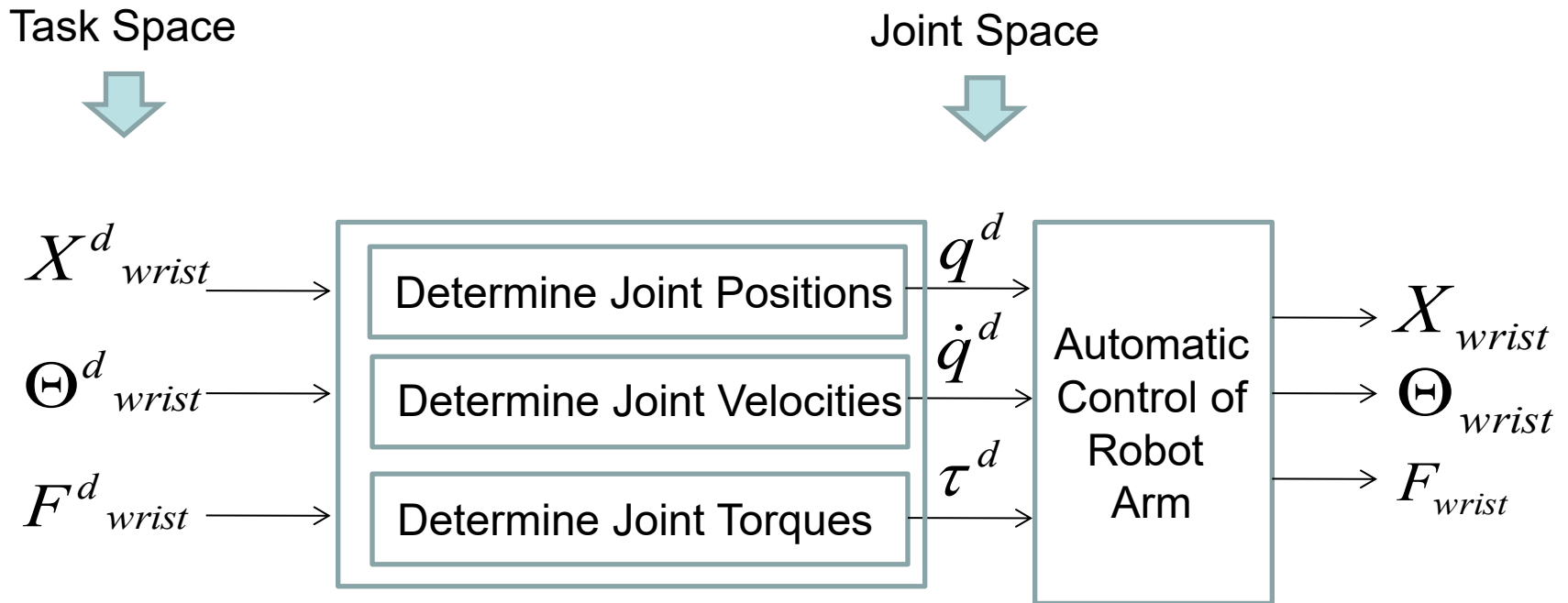
Motion Flows Are Planned ...

- Example of Planning Biped Walking Motion

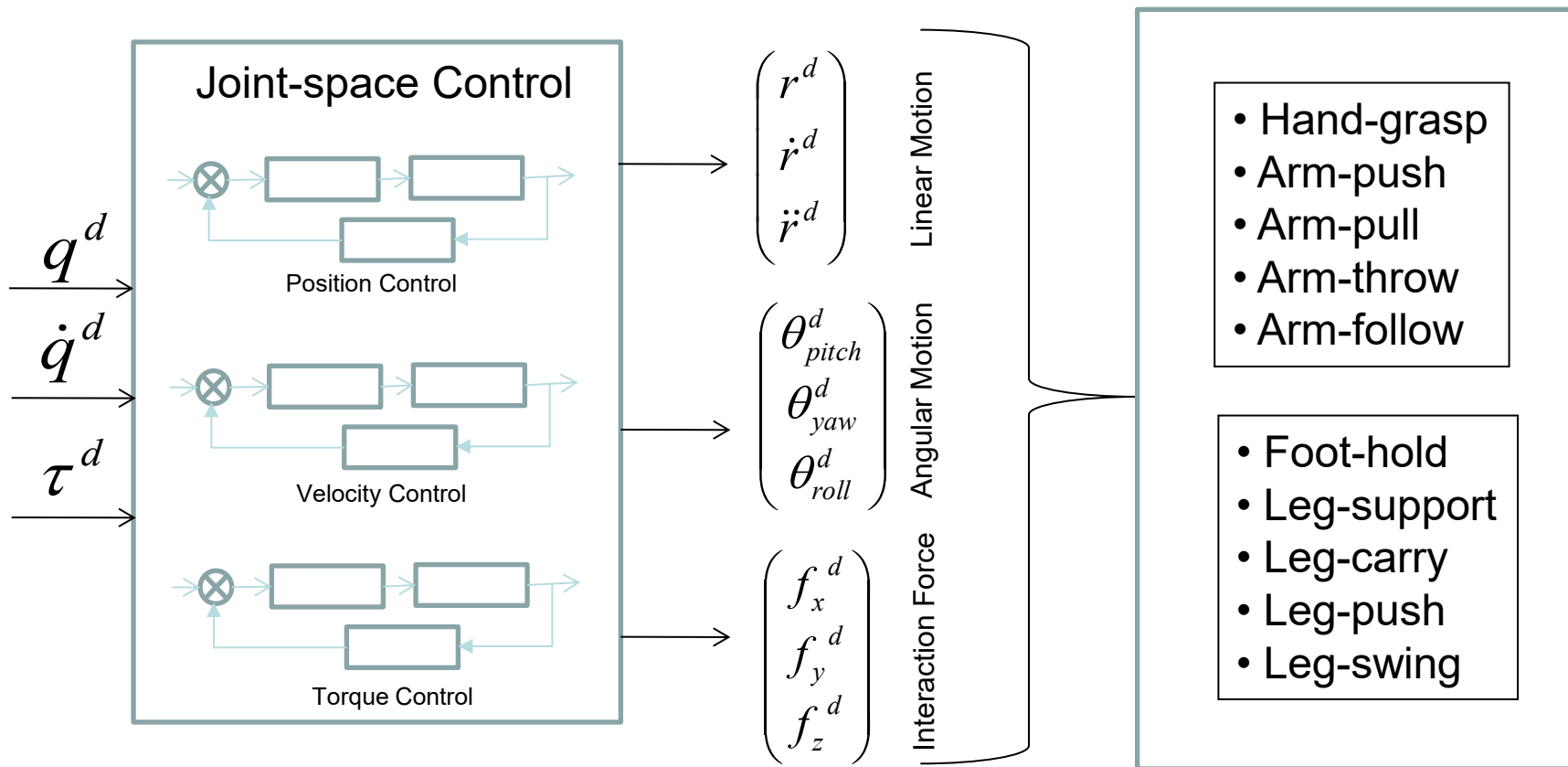


Motion Flows Could Be Transformed from Task Space to Joint Space

- Example of Transforming Manipulation Motion

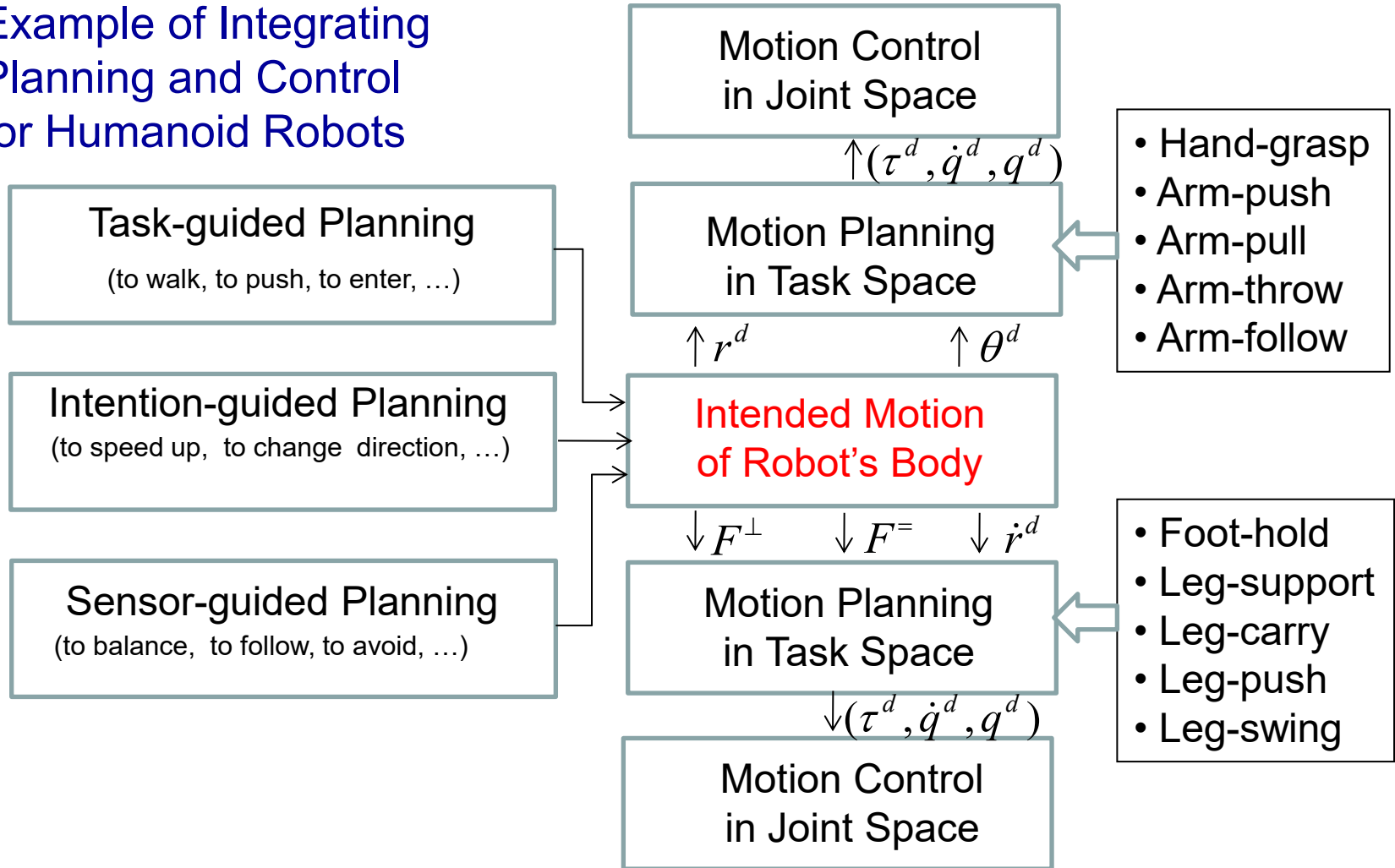


Planned Motion Flows Are Achieved By Motion Control Systems ...

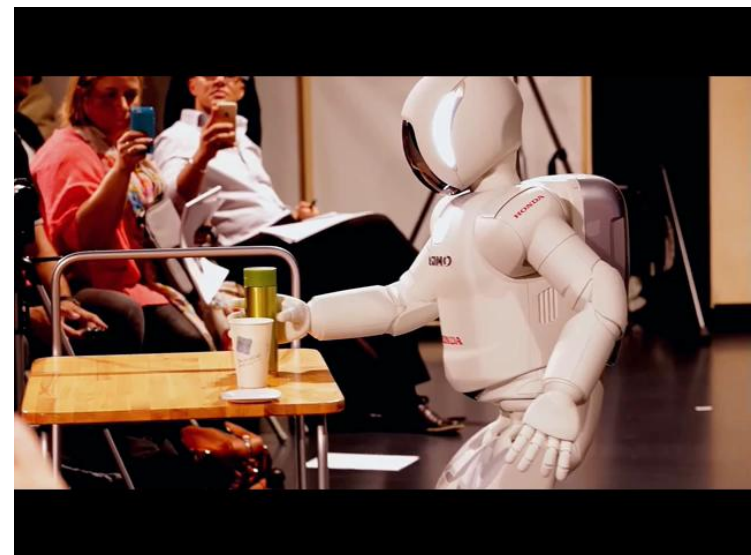
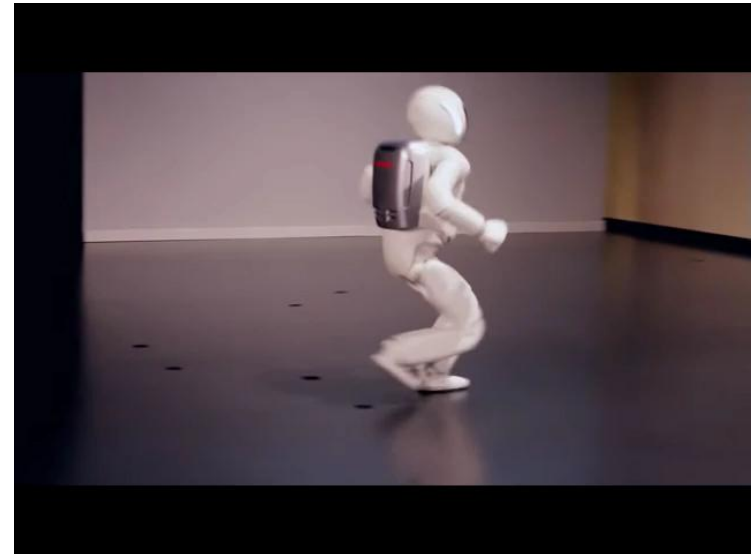
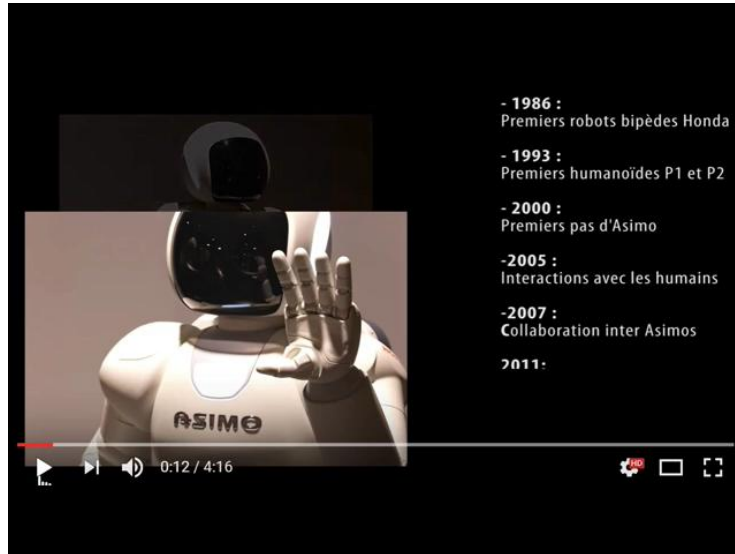


Planning and Control of Motion Flows Could Be Integrated Together ...

- Example of Integrating Planning and Control for Humanoid Robots



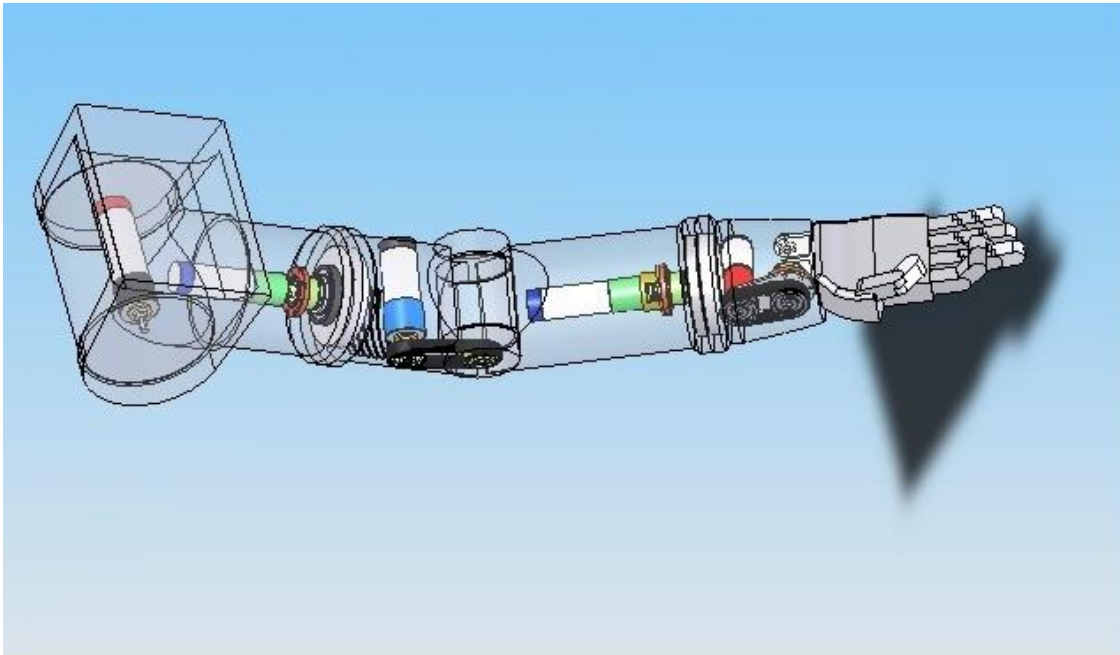
Example of Implementation Done by Honda Co.



Motion Flows Could Be Described by Equations

...

- Motion Equations of Manipulator in Static States



$$\begin{pmatrix} \tau_1 \\ \tau_2 \\ \dots \\ \tau_k \end{pmatrix} = J_k^T \bullet \begin{pmatrix} F_{x,k} \\ F_{y,k} \\ F_{z,k} \\ M_{x,k} \\ M_{y,k} \\ M_{z,k} \end{pmatrix}$$



$$\tau = J^T \bullet h$$

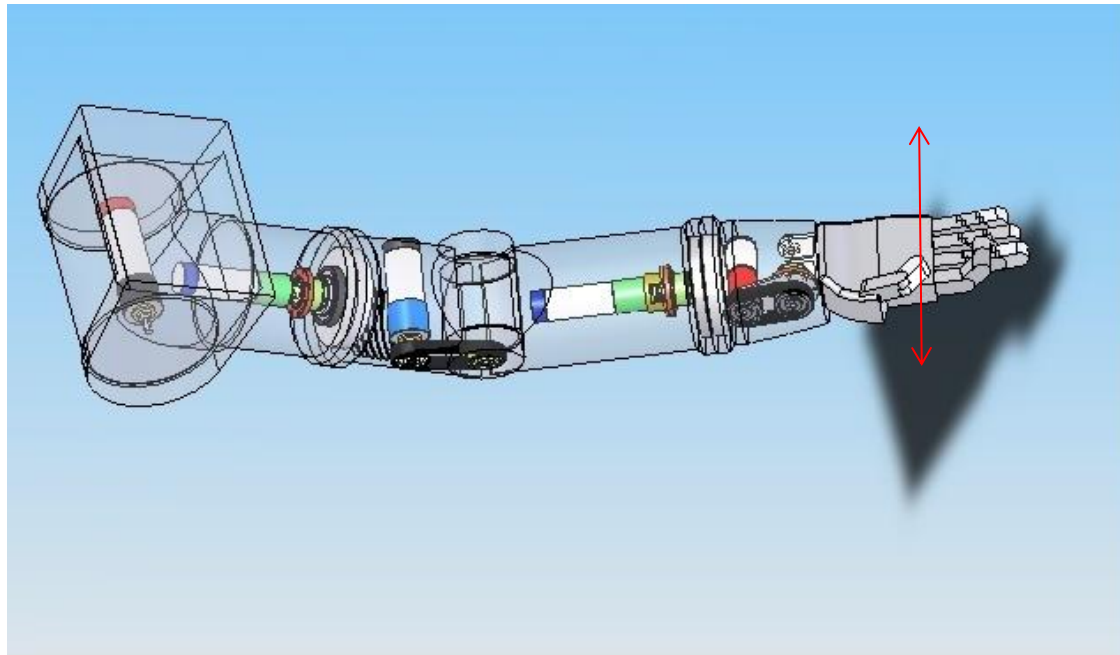
Motion Flows Could Be Described by Equations

...

- Motion Equations of Manipulator in Dynamic States

$$B(q)\ddot{q} + C(q, \dot{q})\dot{q} + g(q) = \tau - k_v\dot{q} - J^T \bullet h$$

↑
Inertial Force
↑
Coriolis Force
Centrifugal Force
↑
Gravity
↑
Torque
↑
Friction
↑
Interaction Force



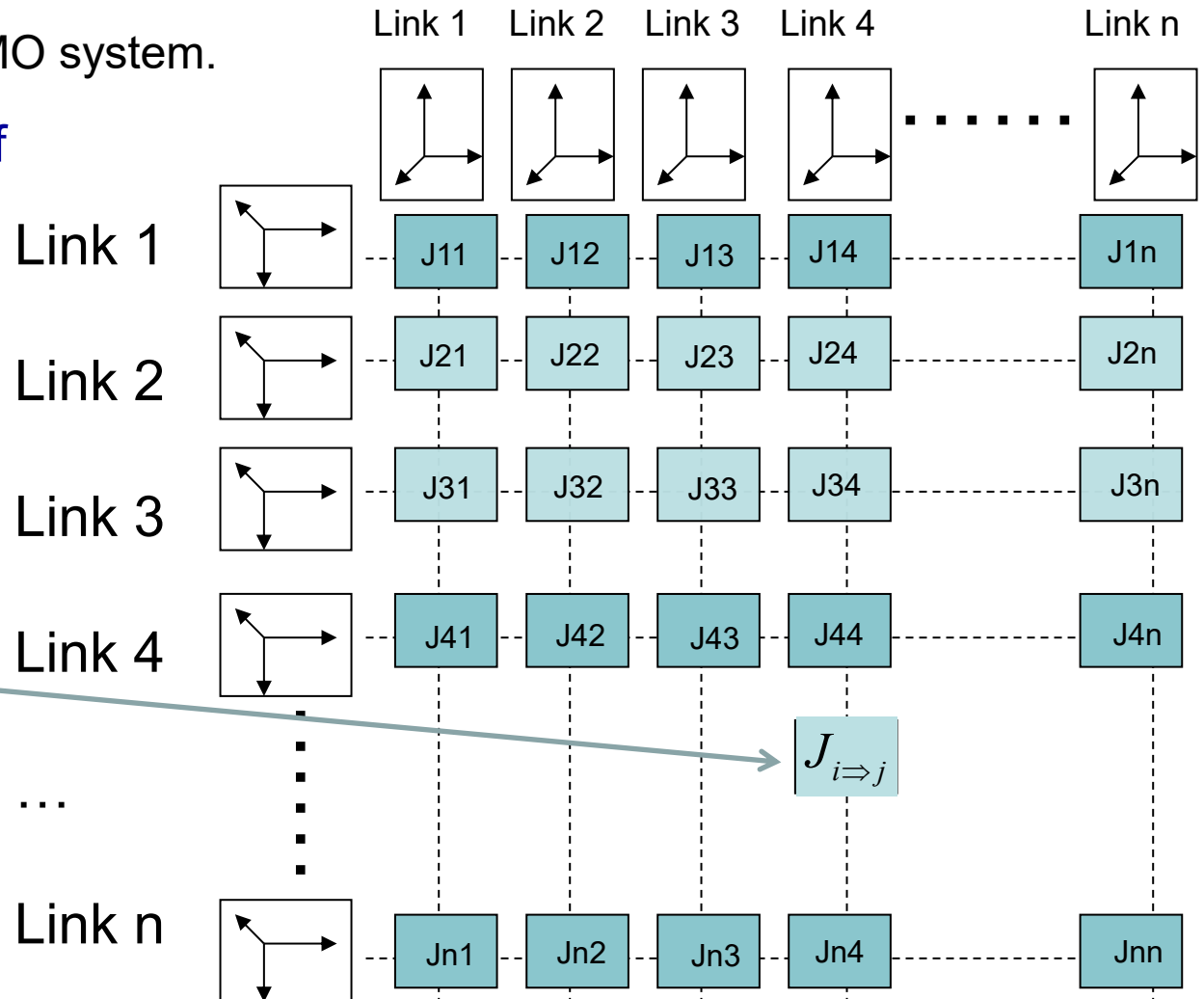
Motion Flows Could Be Described by Equations

...

A humanoid robot is a MIMO system.

- Motion Kinematics of Locomotion, Manipulation, and Grasping

$$\dot{P}_{i \Rightarrow j} = J_{i \Rightarrow j} \bullet \dot{q}_{i \Rightarrow j}$$



Motion Flows Could Be Described by Equations ...

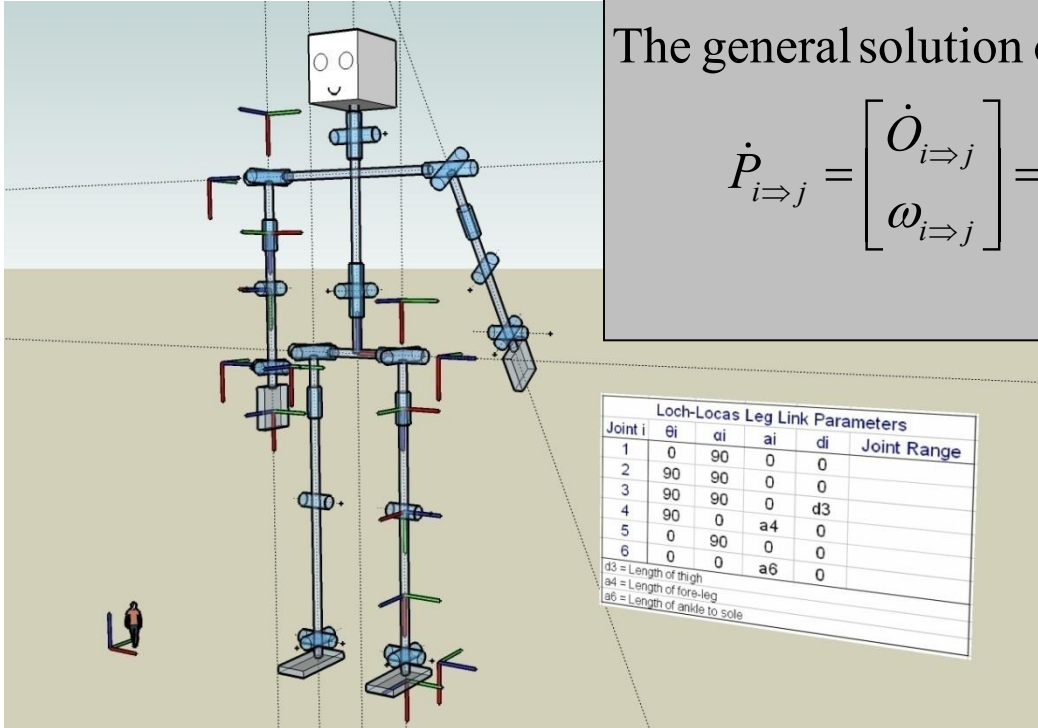
- Motion Kinematics of Locomotion, Manipulation and Grasping (continued)

The velocity vector of the end - effector's pose :

$$\dot{P}_{i \rightarrow j} = \begin{bmatrix} \dot{O}_{i \rightarrow j} \\ \omega_{i \rightarrow j} \end{bmatrix}$$

The general solution of differential kinematics :

$$\dot{P}_{i \rightarrow j} = \begin{bmatrix} \dot{O}_{i \rightarrow j} \\ \omega_{i \rightarrow j} \end{bmatrix} = \begin{bmatrix} J_{o1} & J_{o2} & \dots & J_{on} \\ J_{\omega 1} & J_{\omega 2} & \dots & J_{\omega n} \end{bmatrix} \bullet \dot{q}_{i \rightarrow j} = J_{i \rightarrow j} \bullet \dot{q}_{i \rightarrow j}$$

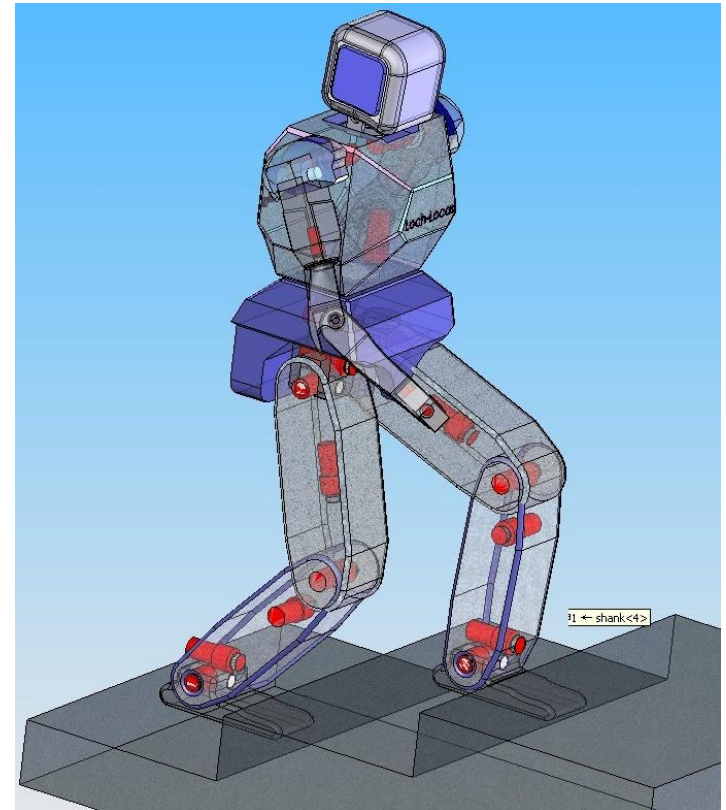
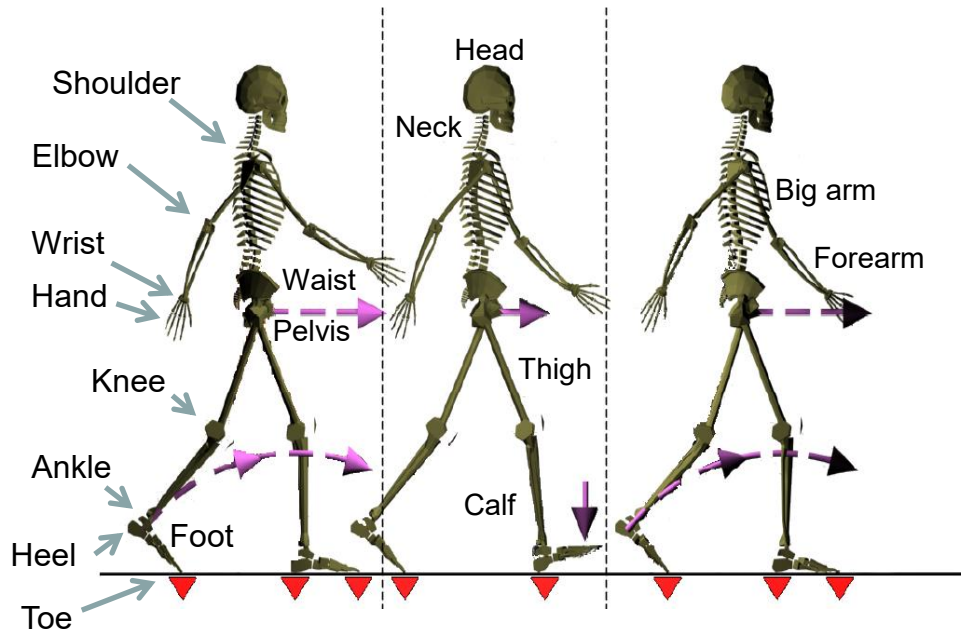


Motion Flows Could Be Described by Equations

...

- Motion Dynamics of Biped Walking

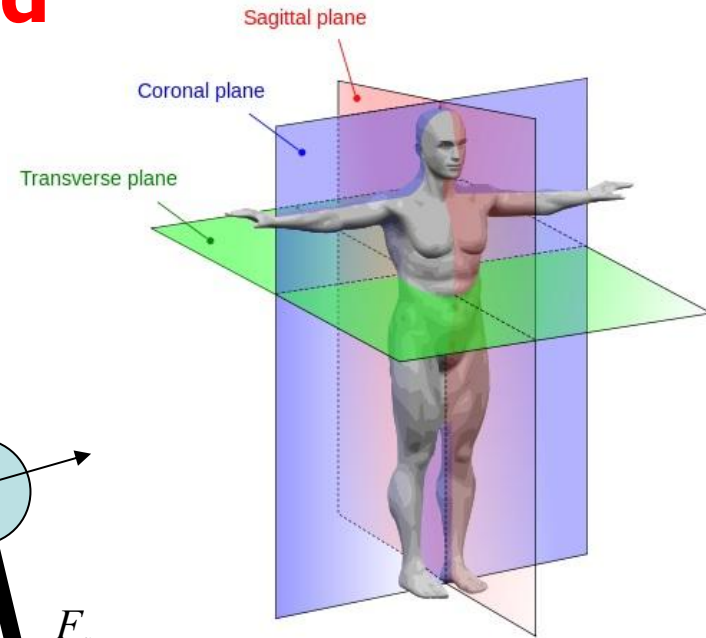
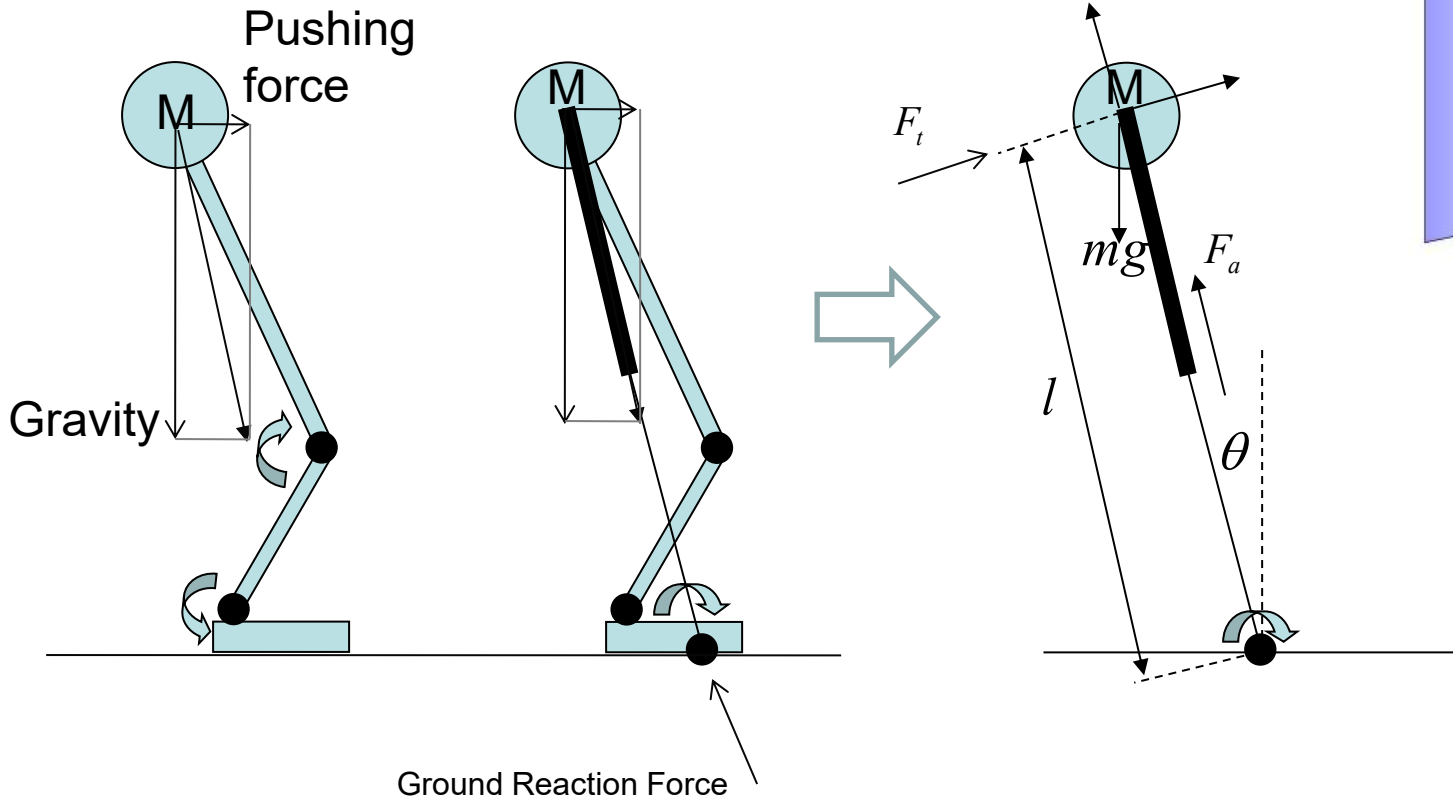
It refers to the relationships among legs' forces, legs' motions and body's stability.



Gait Types → Stride Parameters → Footstep Parameters → Beat Parameters

Motion Dynamics of Inverted Pendulum ...

- Illustration

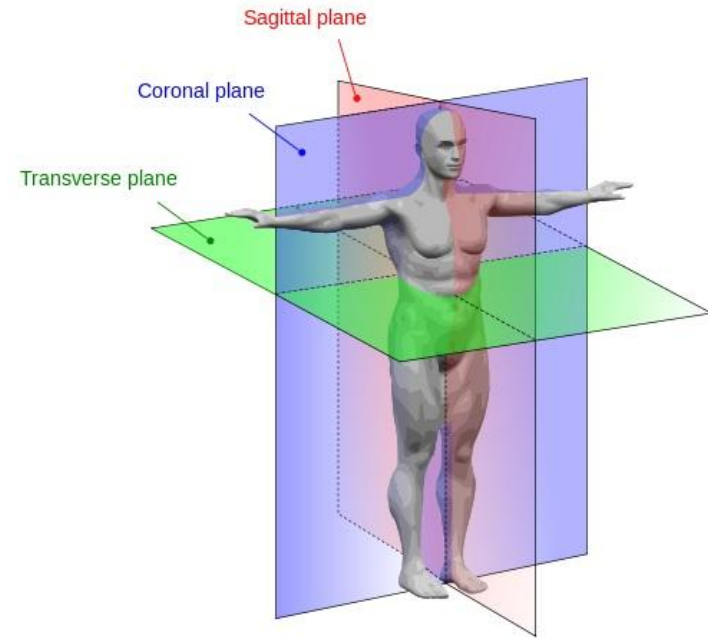
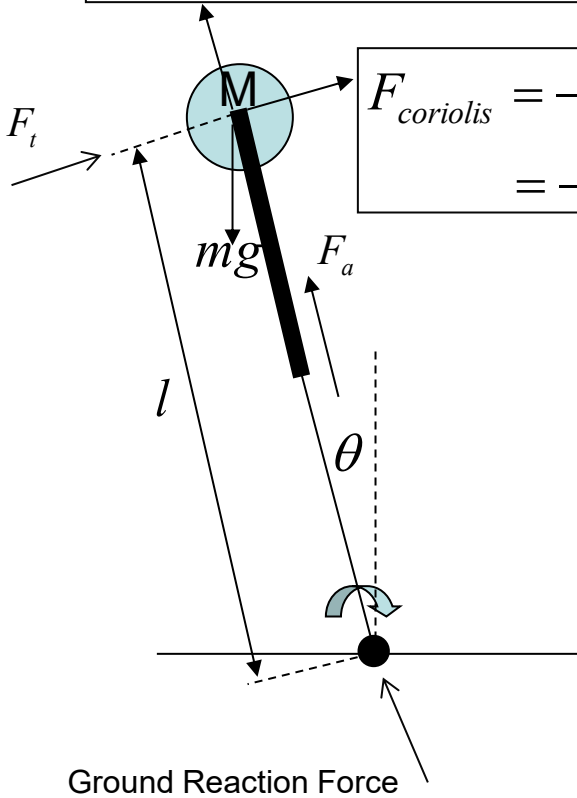


Motion Dynamics of Inverted Pendulum ...

- Equations

$$F_{centrifugal} = m \frac{v^2}{l} = m \frac{(l\dot{\theta})^2}{l} = ml\dot{\theta}^2$$

$$F_{coriolis} = -2m(\dot{\theta} \cdot \dot{l}) = -2m\dot{l}\dot{\theta}$$



Axial Dynamics:

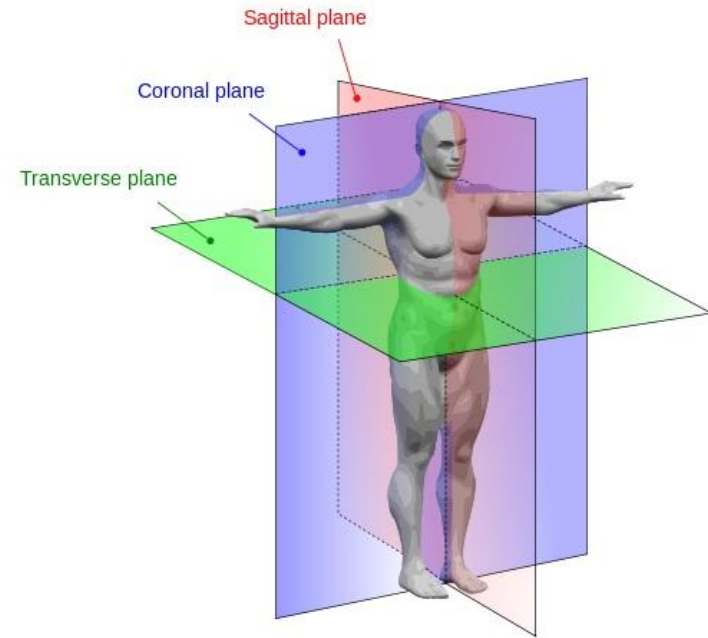
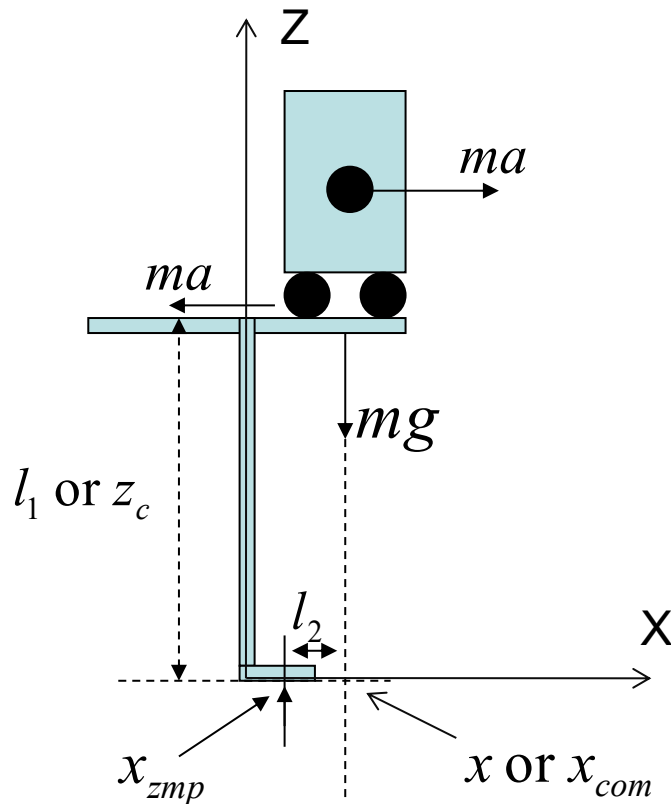
$$F_a - mg \cos(\theta) + ml\dot{\theta}^2 = m\ddot{l}$$

Tangential Dynamics:

$$l \cdot F_t - mgl \sin(\theta) - 2ml\dot{\theta} = ml^2\ddot{\theta}$$

Motion Dynamics of Cart on Table ...

- Illustration

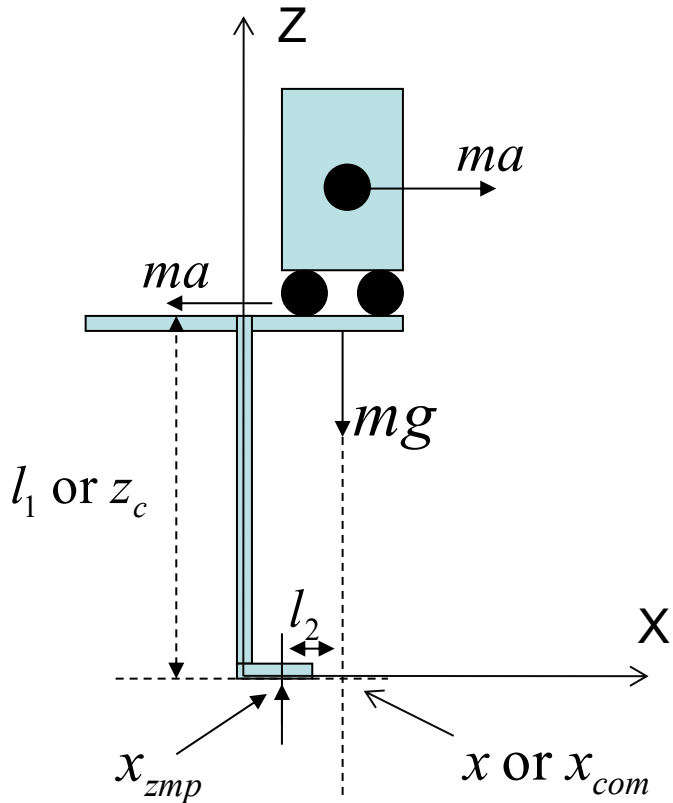


$$m \cdot a \cdot z_c = m \cdot g \cdot (x - x_{zmp})$$

$$x_{zmp} = x - \frac{z_c}{g} \ddot{x}$$

Motion Equations of Cart on Table ...

- Equations



State Vector:

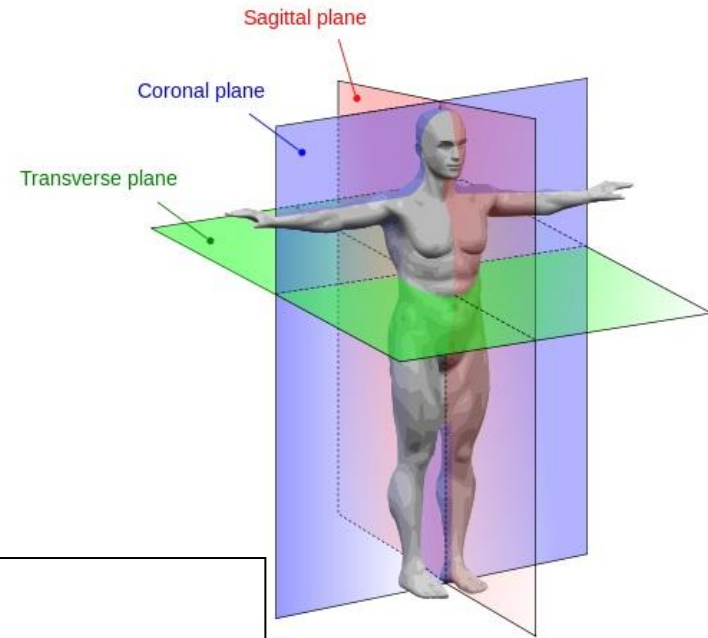
$$X = \begin{pmatrix} x \\ \dot{x} \\ \ddot{x} \end{pmatrix}$$

State Equation:

$$\dot{X} = \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix} \cdot \begin{pmatrix} x \\ \dot{x} \\ \ddot{x} \end{pmatrix} + \begin{pmatrix} 0 \\ 0 \\ 1 \end{pmatrix} \cdot u$$

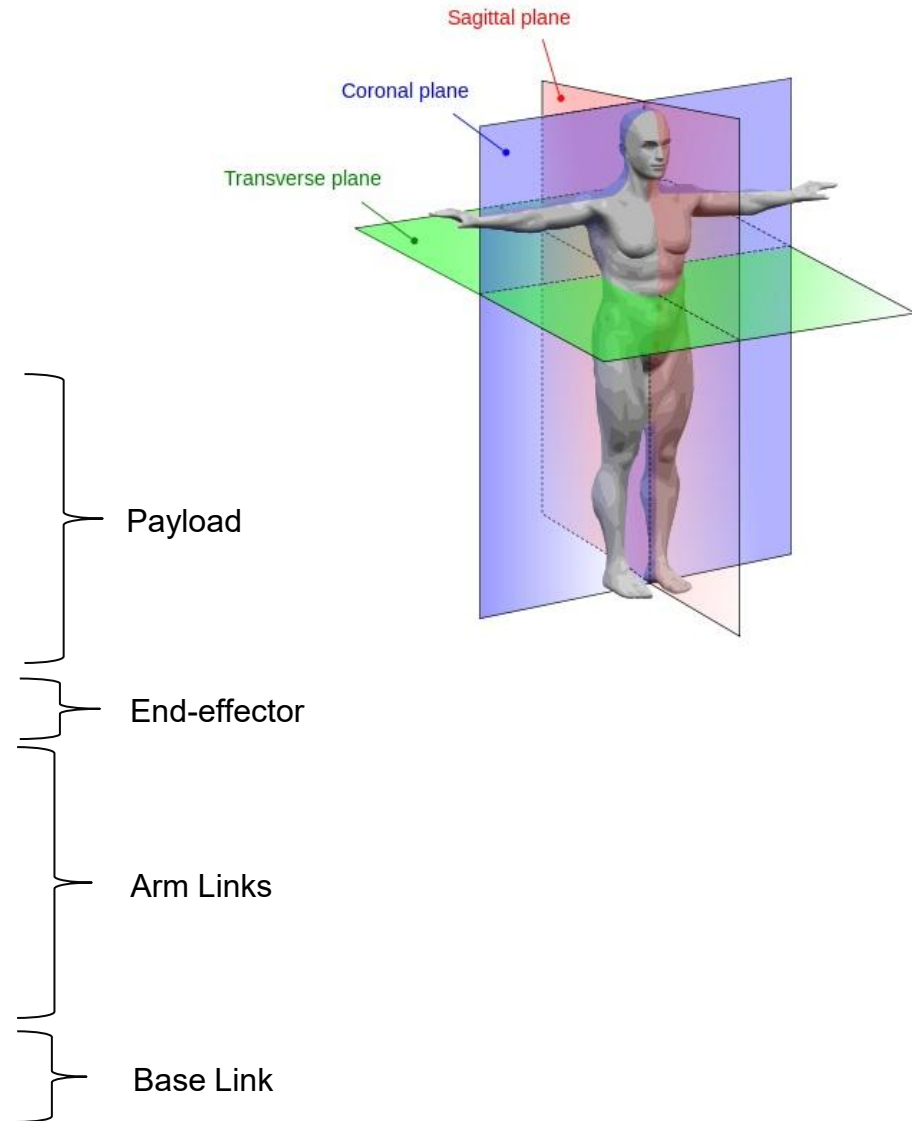
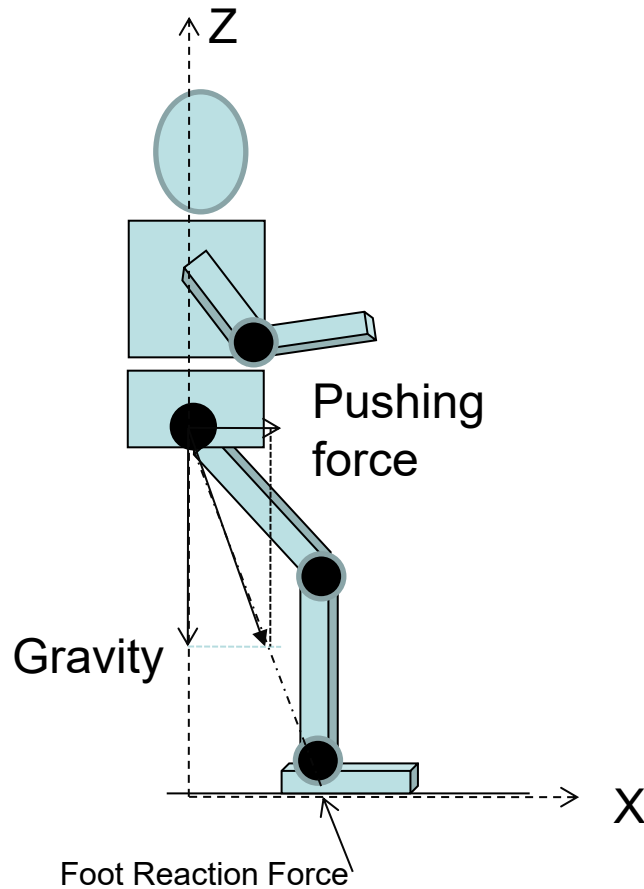
Output Equation:

$$x_{zmp} = x - \frac{z_c}{g} \ddot{x} = \begin{pmatrix} 1 & 0 & -\frac{z_c}{g} \end{pmatrix} \cdot \begin{pmatrix} x \\ \dot{x} \\ \ddot{x} \end{pmatrix}$$



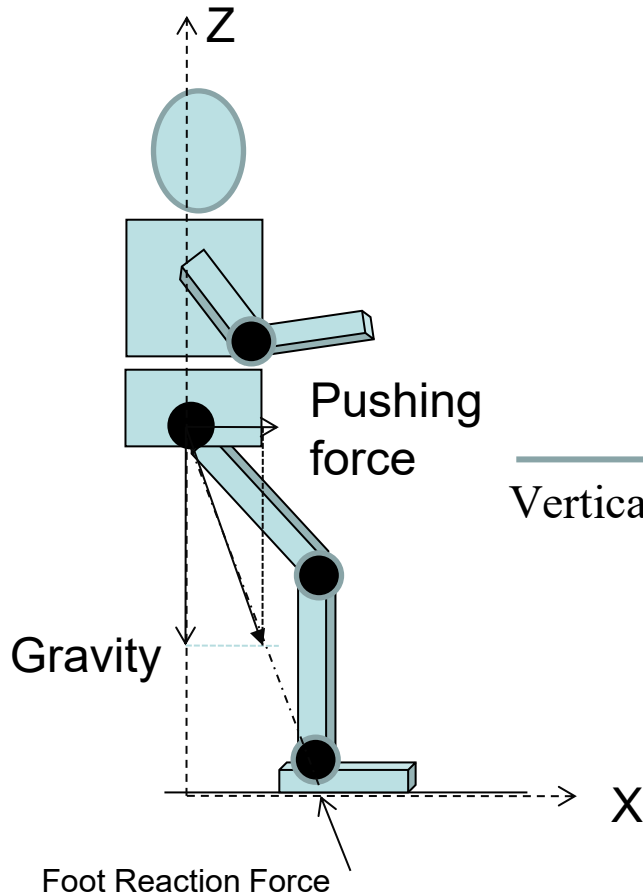
Motion Dynamics of Inverted Arm ...

- Illustration



Motion Dynamics of Inverted Arm ...

- Equations

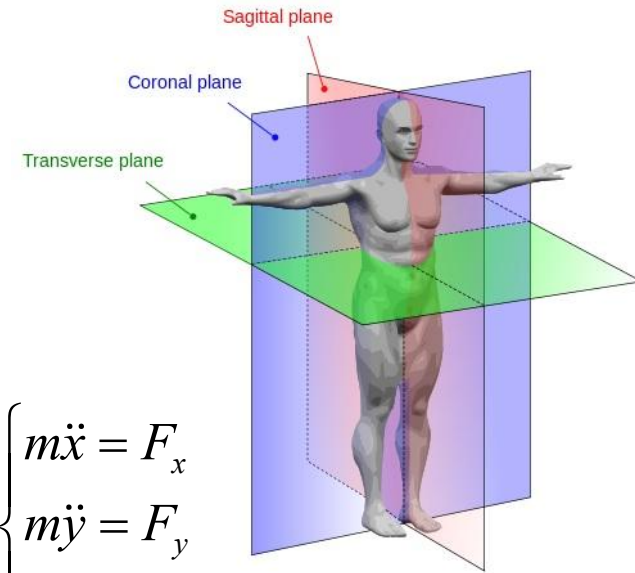


Horizontal Dynamics :

$$\begin{pmatrix} \tau_1 \\ \tau_2 \\ \tau_3 \\ \tau_4 \\ \tau_5 \\ \tau_6 \end{pmatrix} = J^T \bullet \begin{pmatrix} F_x \\ F_y \\ 0 \\ 0 \\ 0 \\ 0 \end{pmatrix}$$



$$\begin{cases} m\ddot{x} = F_x \\ m\ddot{y} = F_y \\ \dot{P} = J \bullet \dot{q} \end{cases}$$



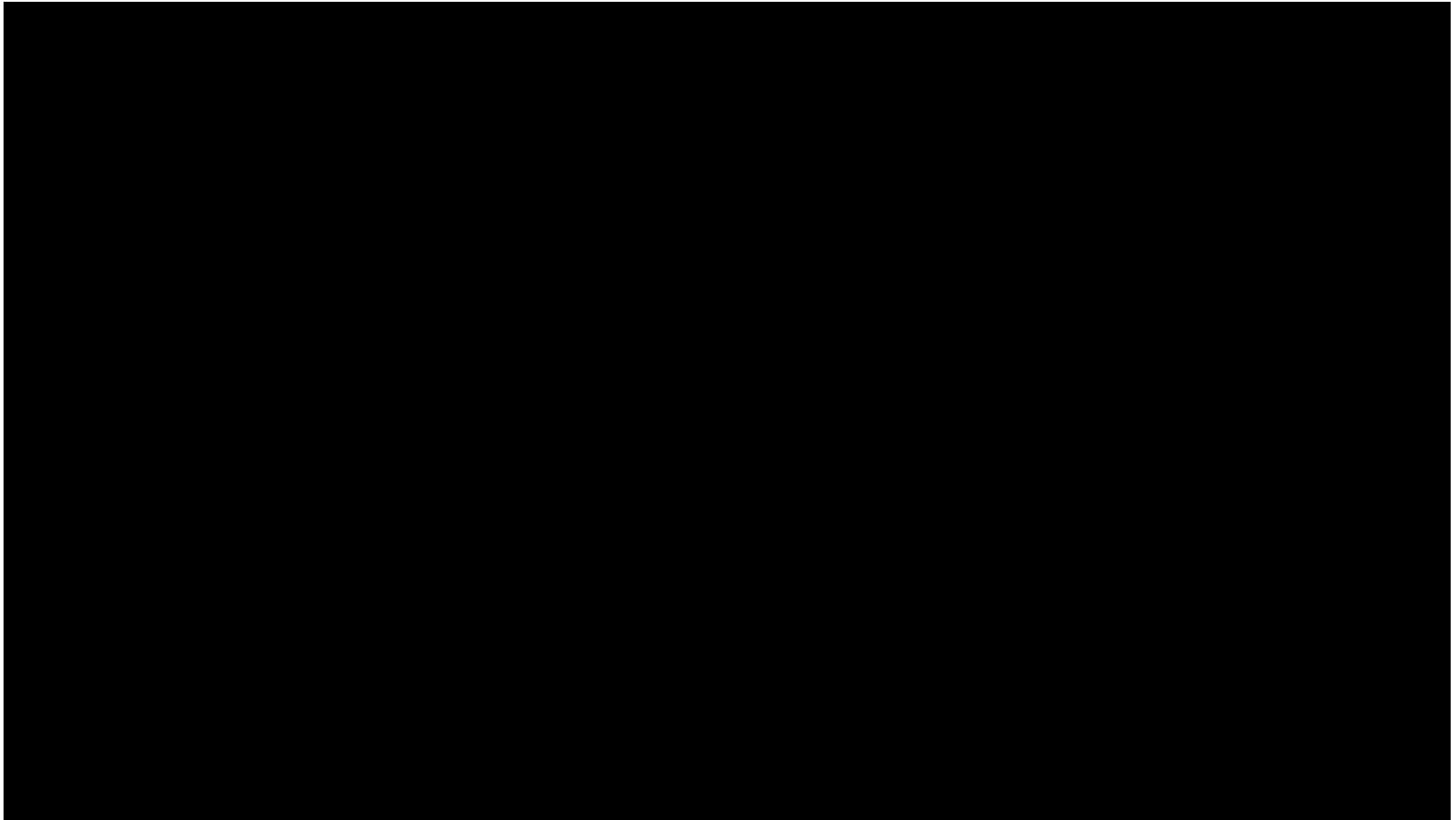
Vertical Dynamics :

$$\begin{pmatrix} \tau_1 \\ \tau_2 \\ \tau_3 \\ \tau_4 \\ \tau_5 \\ \tau_6 \end{pmatrix} = J^T \bullet \begin{pmatrix} 0 \\ 0 \\ mg \\ 0 \\ 0 \\ 0 \end{pmatrix}$$



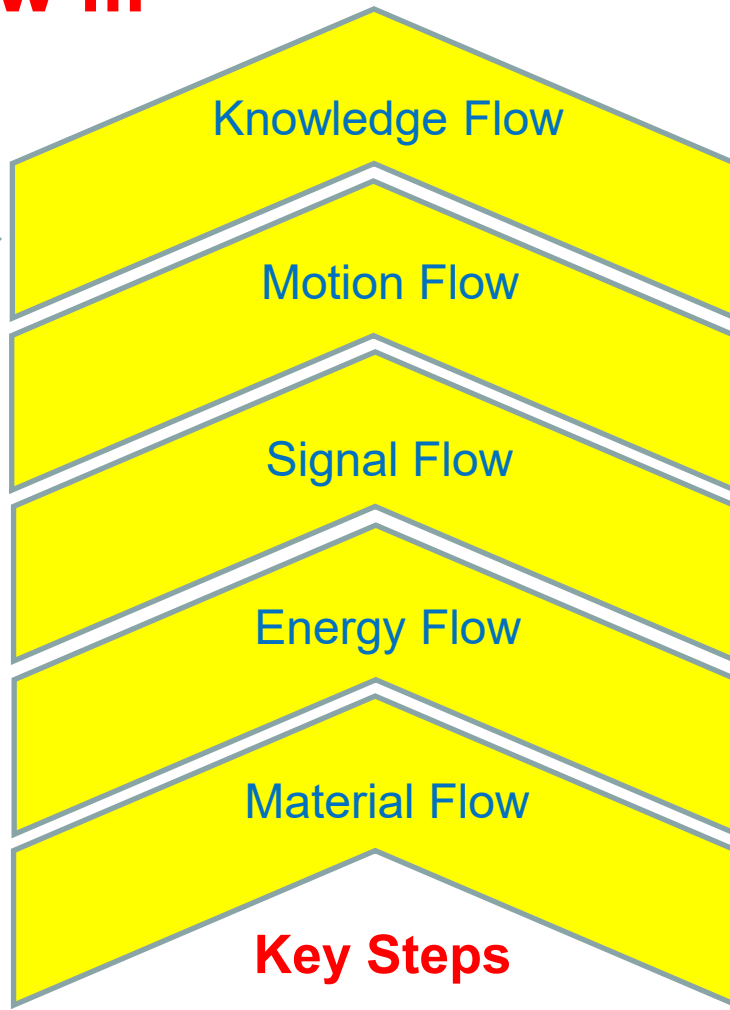
$$\begin{cases} m\ddot{z} = 0 \\ \dot{P} = J \bullet \dot{q} \end{cases}$$

Example of Implementation Done by Boston Dynamics Co. ...

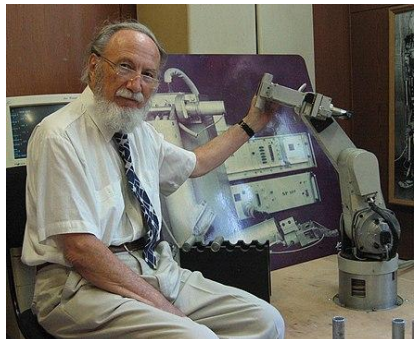


The key solutions underlying the development of humanoid robot could be grouped into these five layers of flow ...

Sensory signals could be transformed into knowledge, which could in return be transformed into motor signals

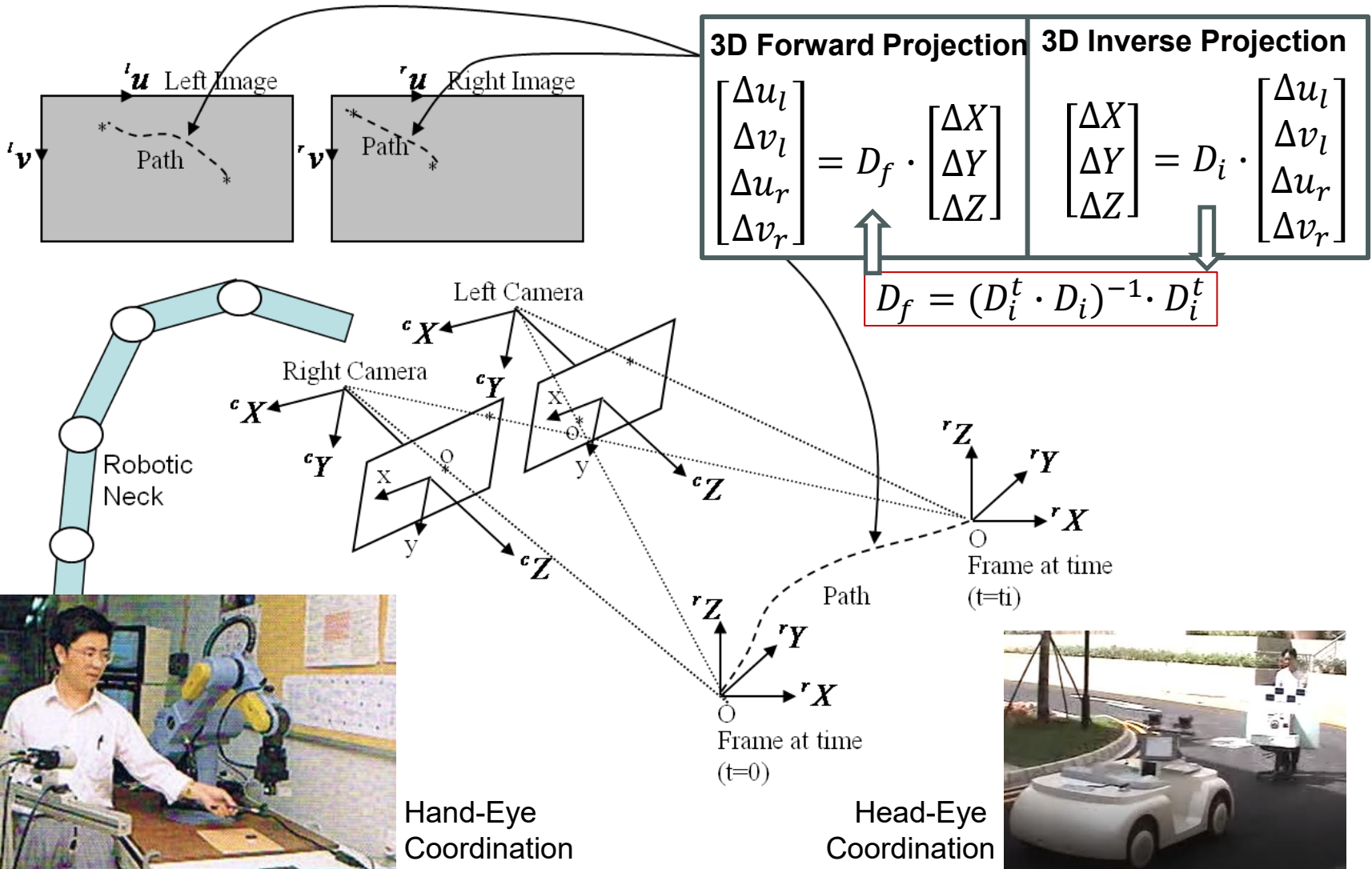


- Cognition
- Recognition
- Interaction
- Perception
- Planning
- Control
- Motion Kinematics
- Motion Dynamics
- Position Sensors
- Velocity Sensors
- Force/Torque Sensors
- Visual/Acoustic Sensors
- Power Suppliers
- Actuators and Controllers
- Appearance
- Structure
- Mechanism
- Computing
- Memory



Miomir Vukobratovic
(1931-2012)
Discovery of ZMP

On-fly Motion Planning with X-Eye Coordination Algorithm Developed in 1997



Validation with Robot (1997)

RESEARCH OPPORTUNITIES IN SINGAPORE

Be in the right place! Come to Singapore, the gateway to the Asia Pacific Region. Come to the School of Mechanical and Production Engineering, Nanyang Technological University, the premier university in the region.

We have excellent infra-structures, state-of-the-art facilities, conducive work environment, and pleasant surroundings for you to realize your potential.

Hand-Eye Coordination

RESEARCH AREAS:

- Product Design
- Intelligent Manufacturing Systems
- Precision Engineering
- Rapid Prototyping
- Robotics and Vision Systems

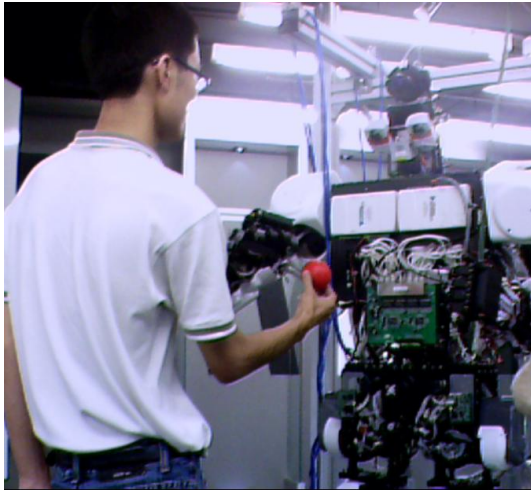


Validation with Simulation (2000)

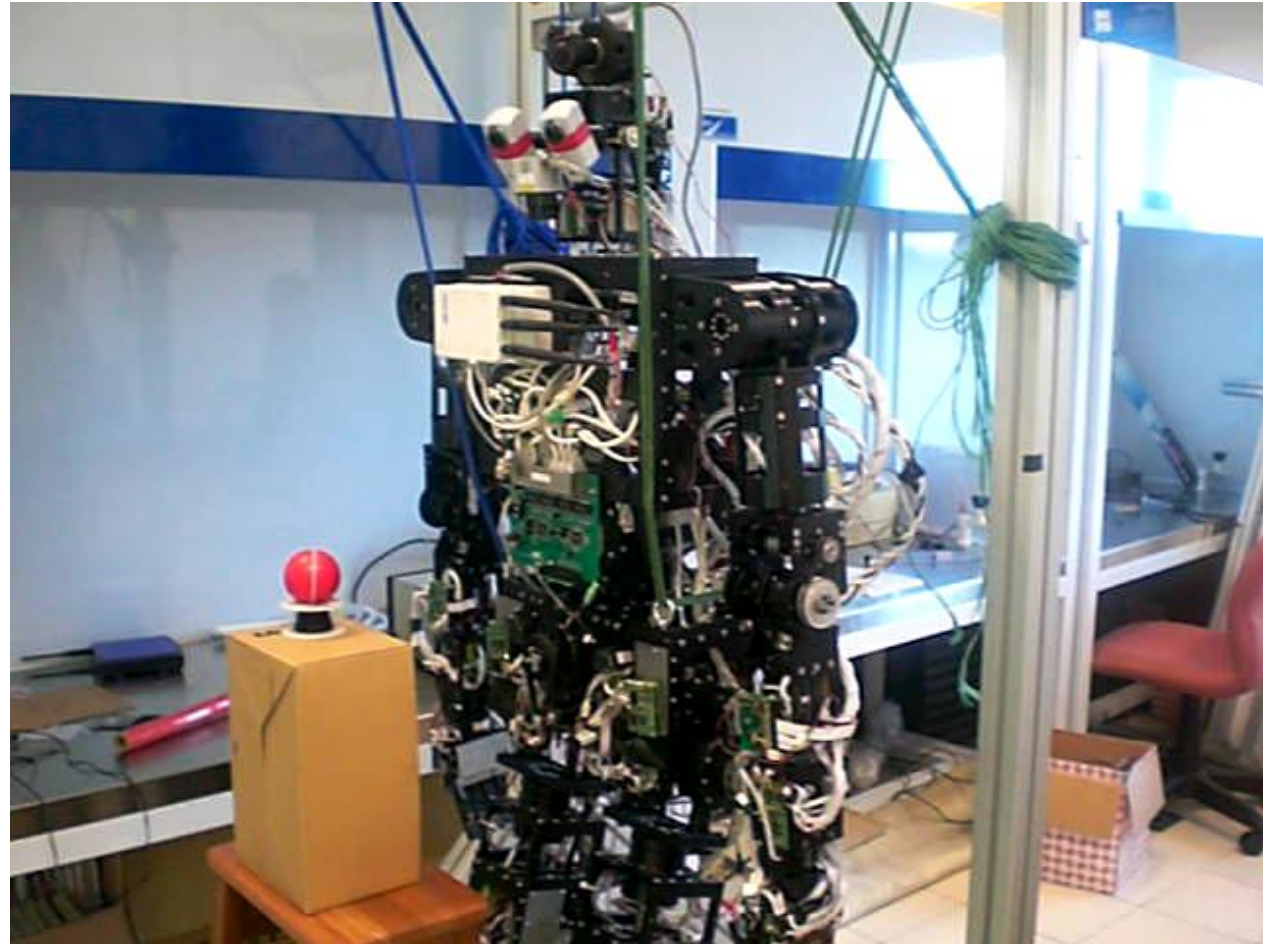
Validation with Monkey (2007)



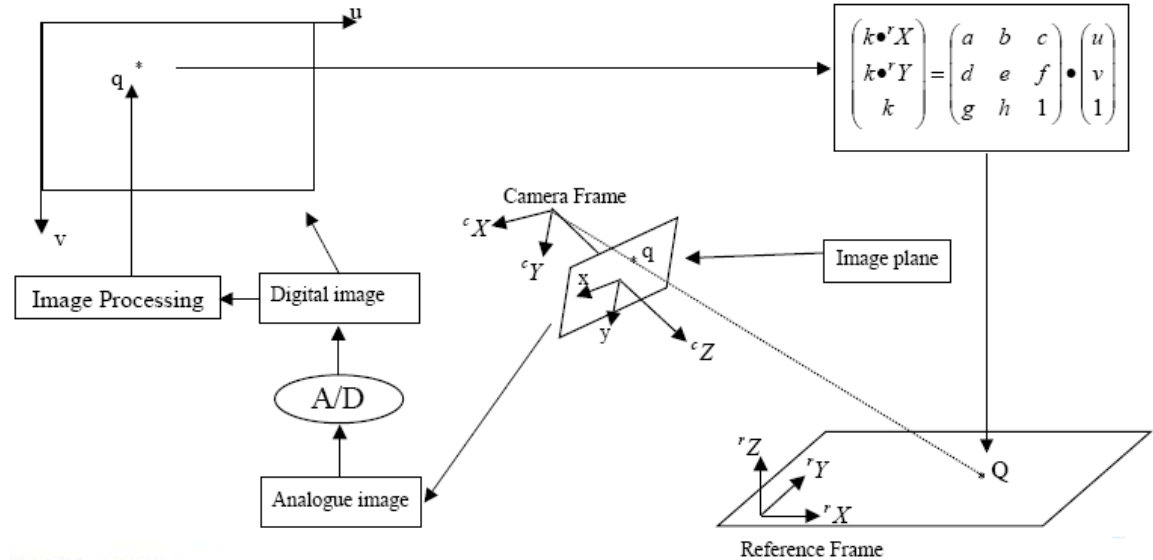
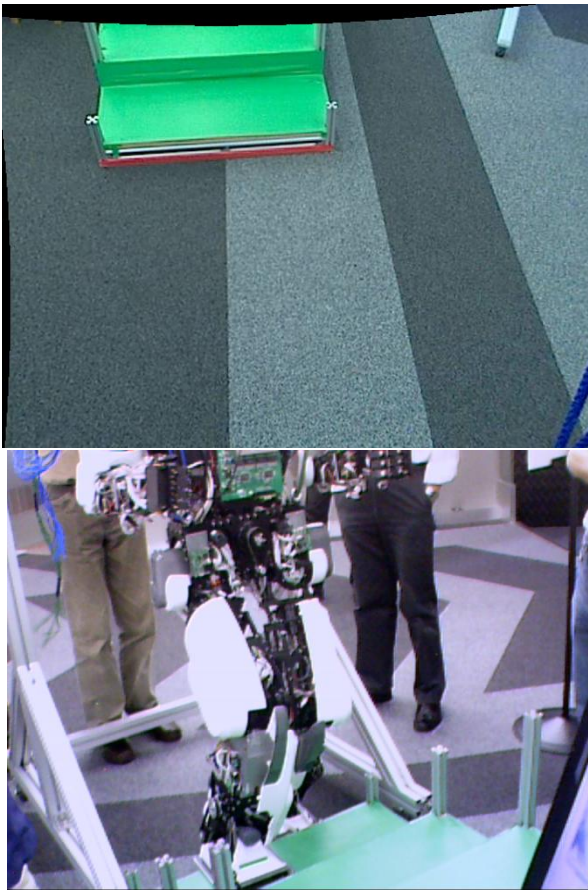
Example of Cognitively-Intelligent Humanoid Robot in Doing Hand-Eye Coordination (2008)



- Signal to Knowledge
- Knowledge to Knowledge
- Knowledge to Signal



Example of Cognitively-Intelligent Humanoid Robot in Doing Leg-Eye Coordination (2008)



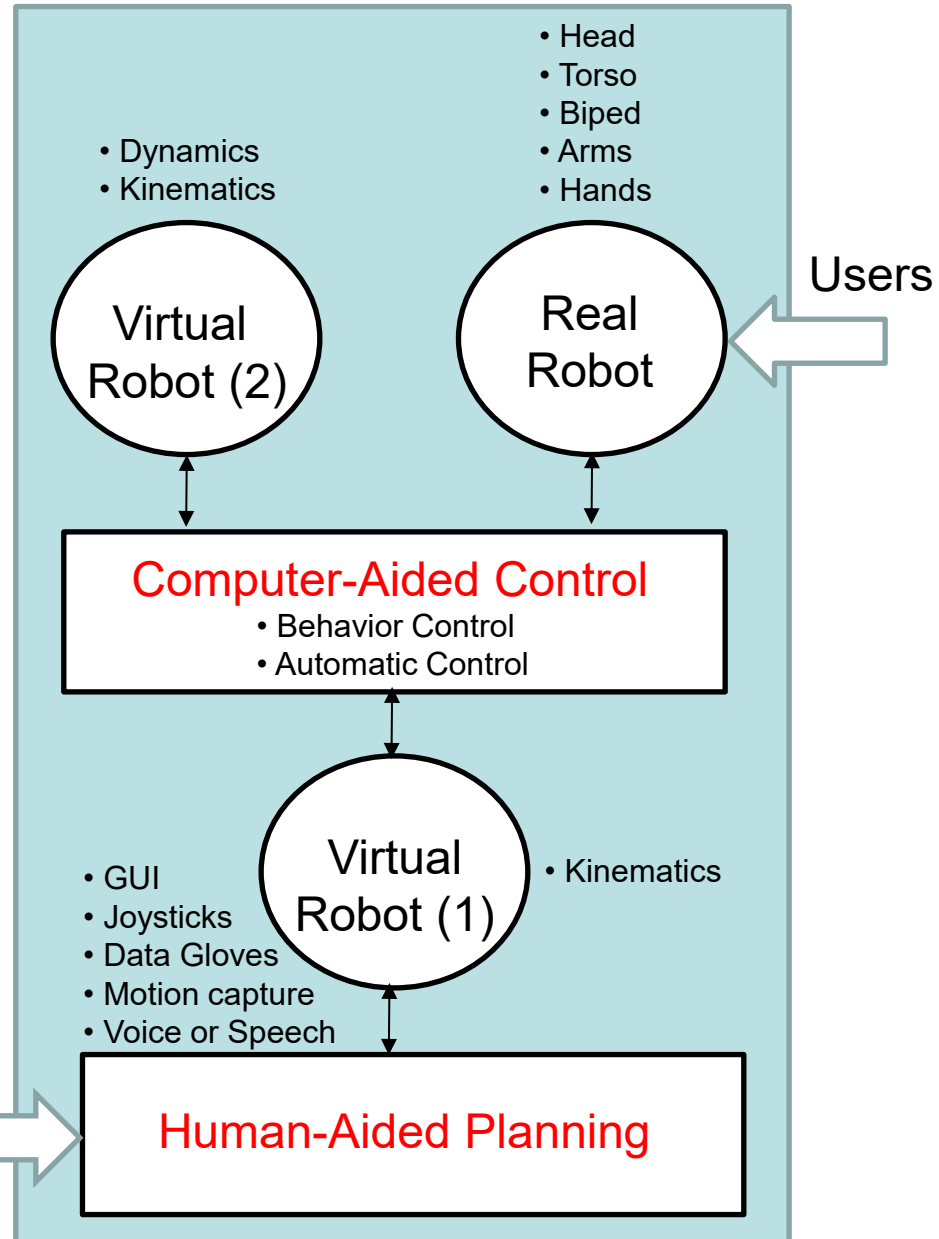
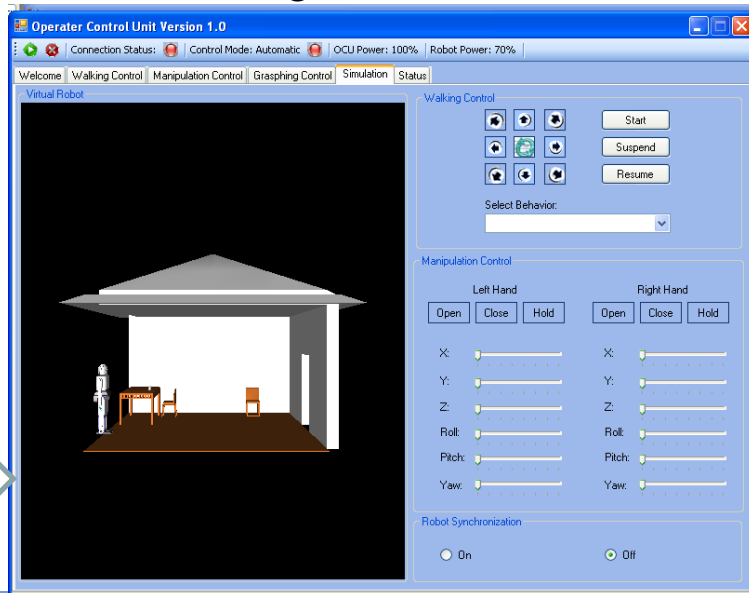
- Signal to Knowledge
- Knowledge to Knowledge
- Knowledge to Signal

Human-Robot Interaction Could Occur At ...

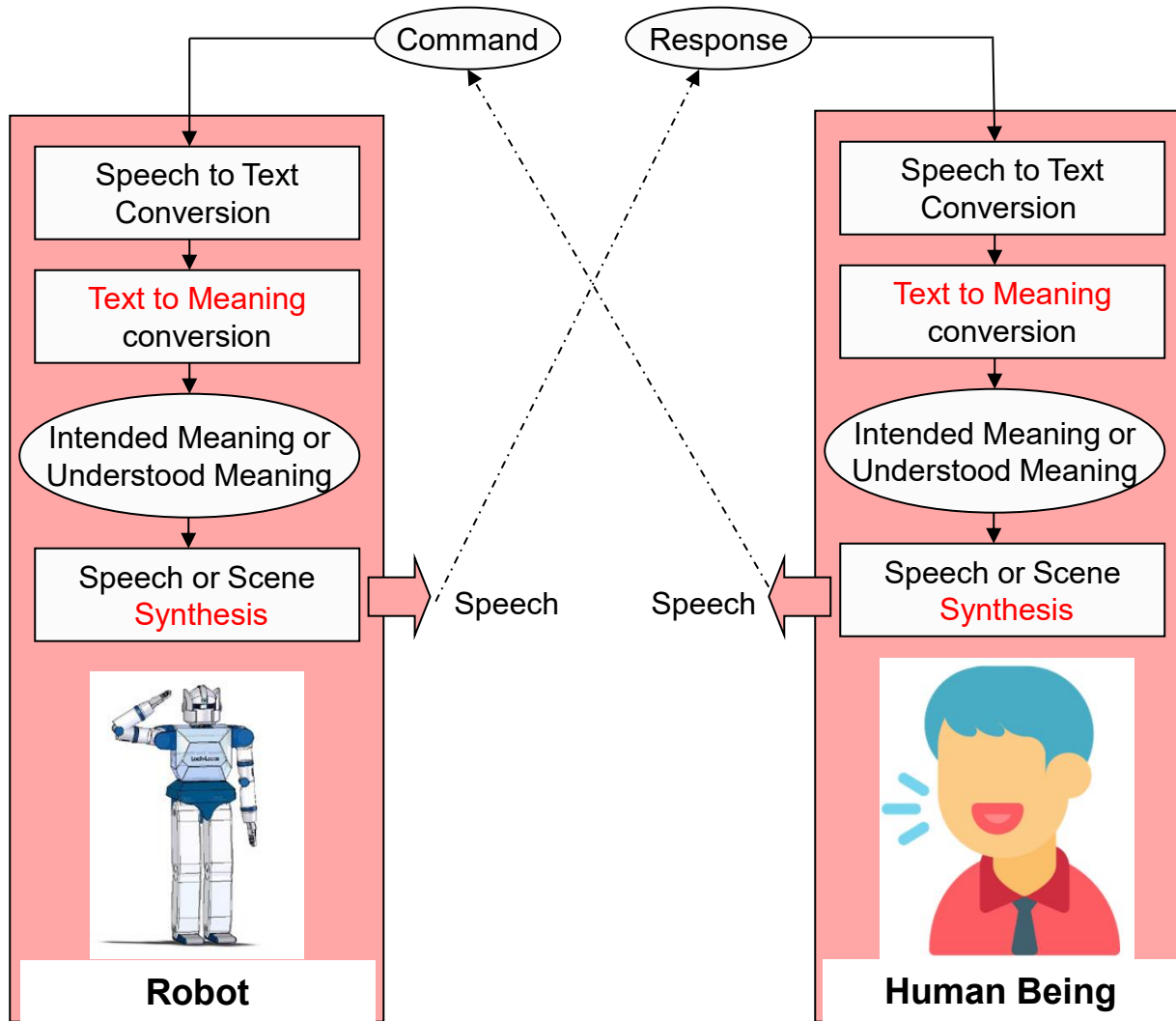
- Signal Level, and
- Cognitive Level →

Cognitively-Intelligent Humanoid Robots

Digital Twin



Scenario of Human-Robot Interaction at Cognitive Level ...



Seven Specific Skills

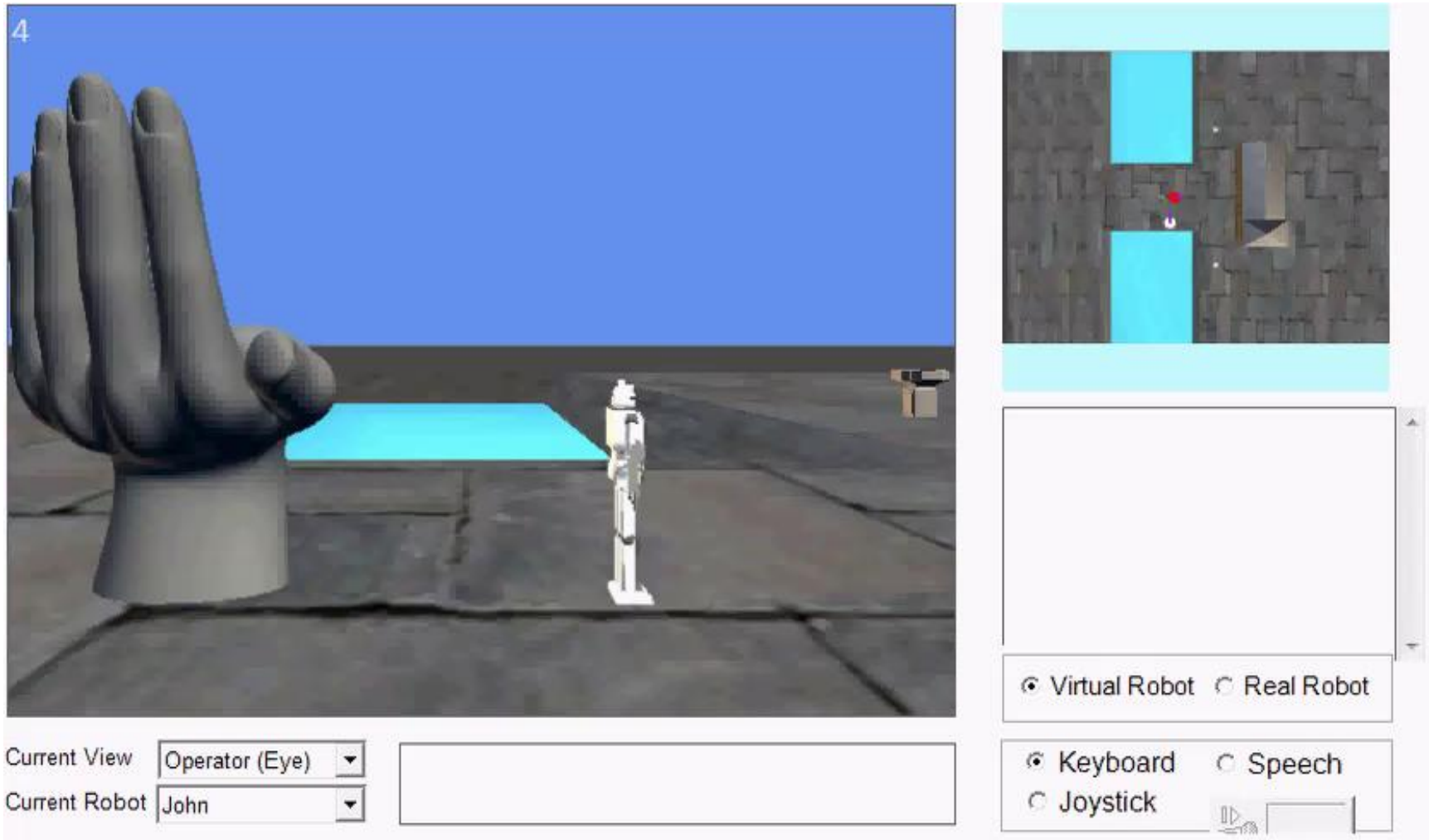
1. To hear
2. To speak
3. To see
4. To read
5. To write
6. To do
7. To walk

Four Domain Knowledge

1. Speech-centric knowledge
2. Vision-centric knowledge
3. Motion-centric knowledge
4. Task-centric knowledge

Example of Human-Robot Interaction at Cognitive Level ...

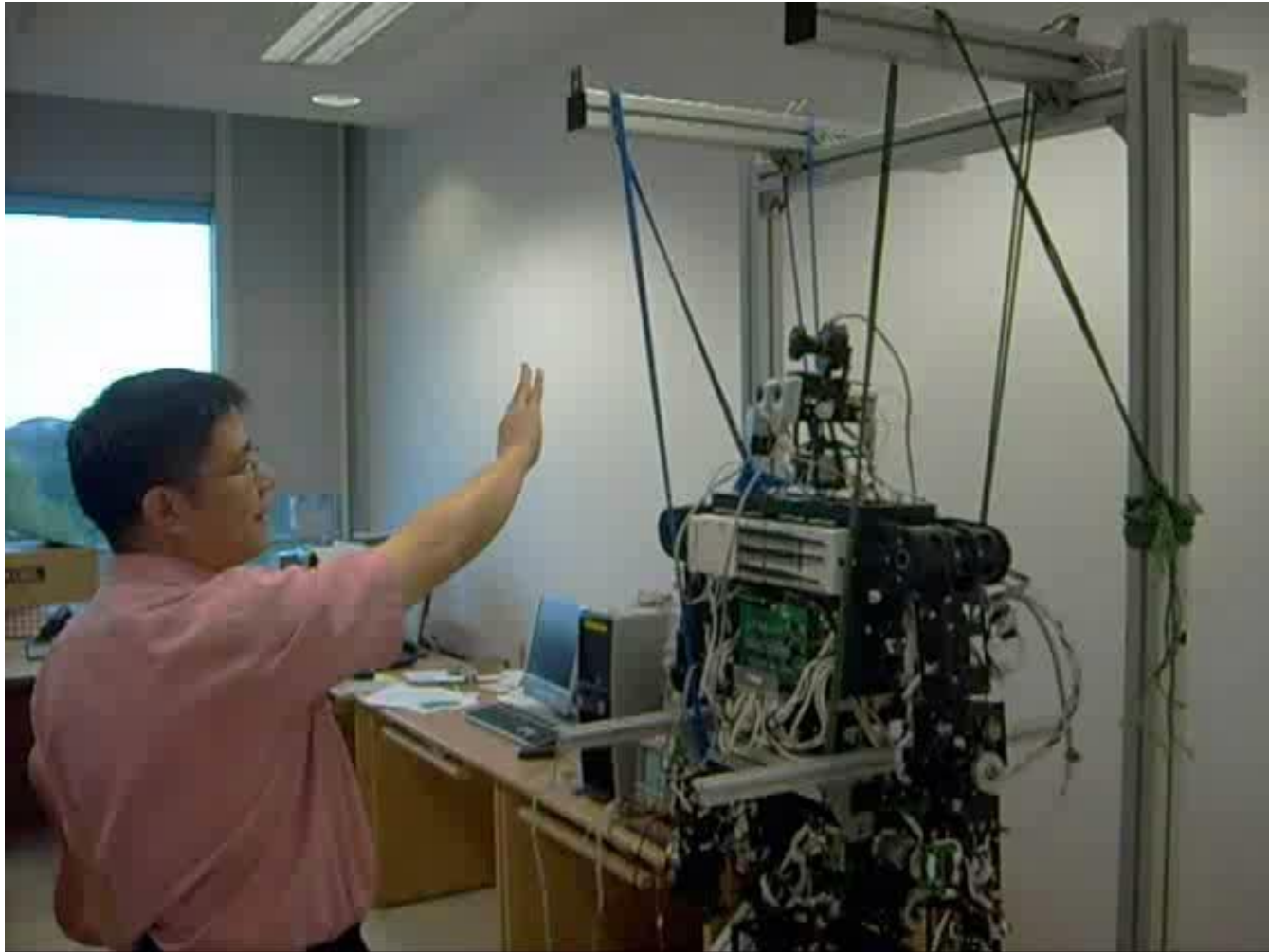
Signal (voice/text) → Knowledge → Knowledge → Signal



Results in 2010

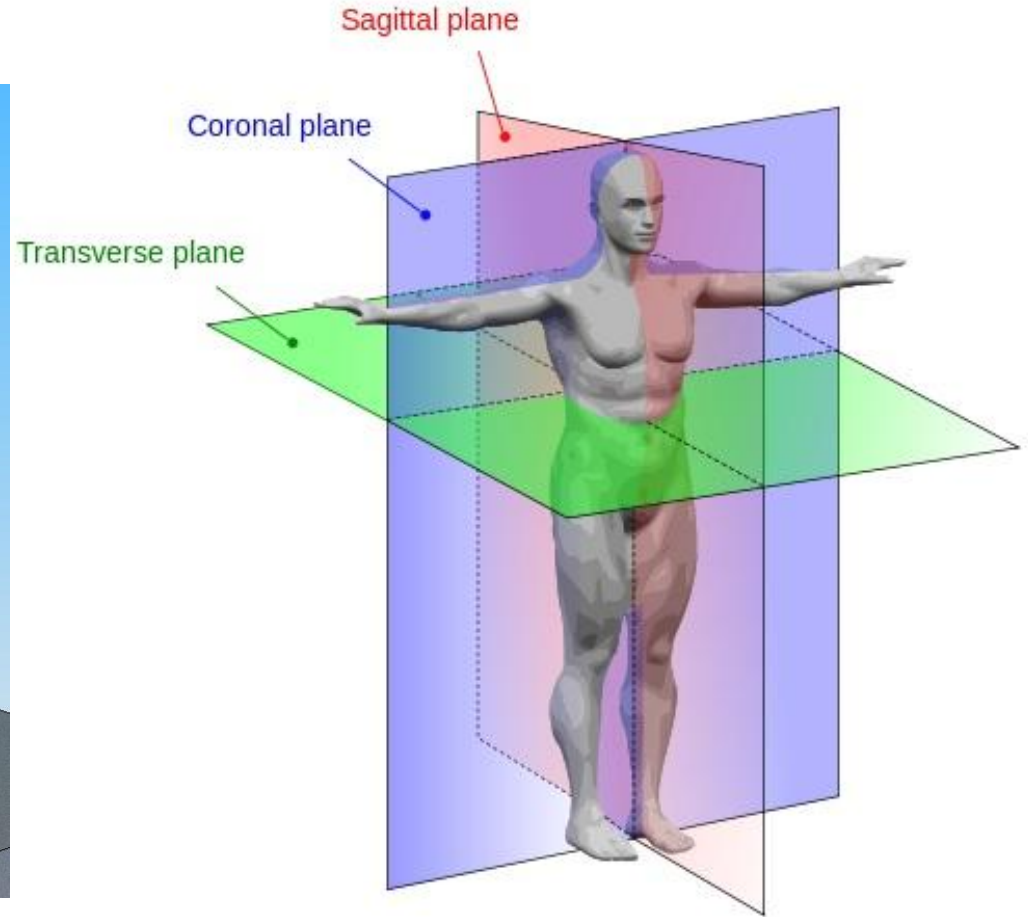
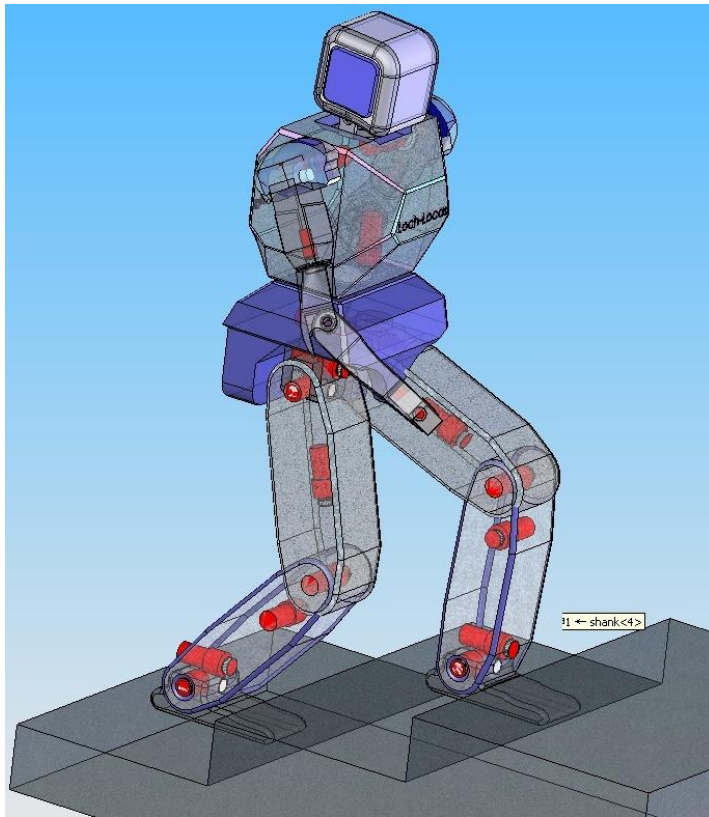
Example of Human-Robot Interaction at Cognitive Level ...

Visual Signal → Knowledge → Knowledge → Signal



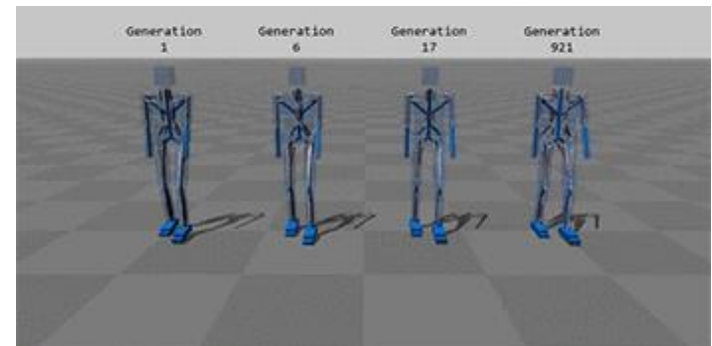
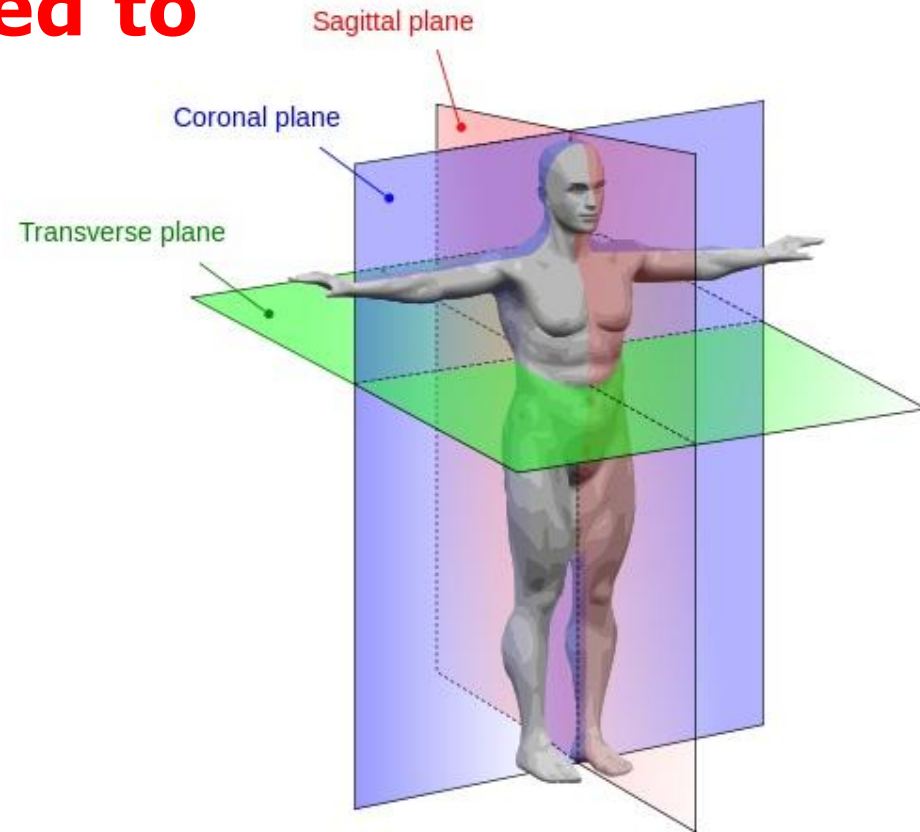
Knowledge Flow Related to Biped Walking

- Physical Space and Definitions of Planes



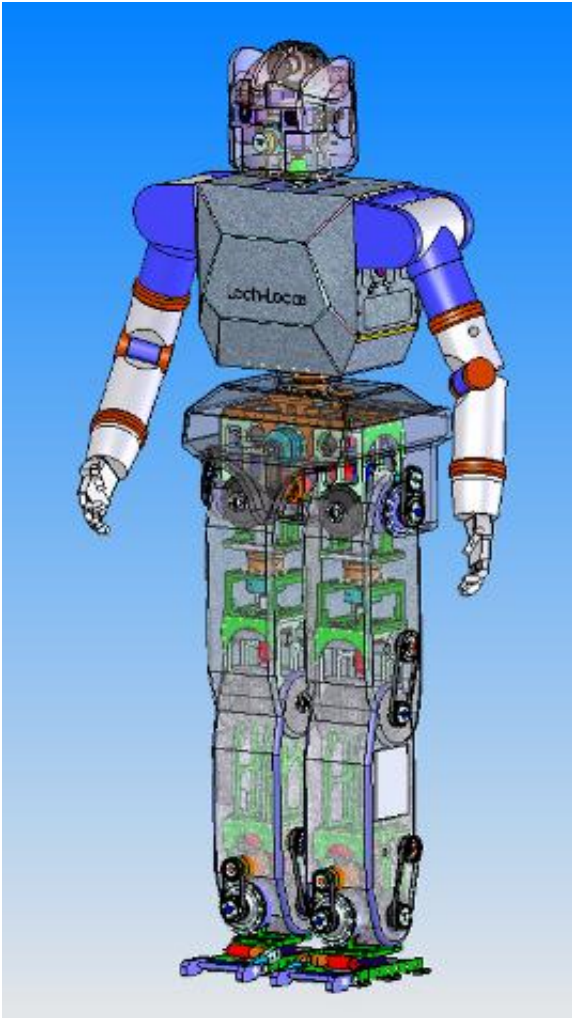
Knowledge Flow Related to Biped Walking

- **Stability of Walking:**
 - If a humanoid robot can sustain its walking, then the walking is stable.
- **Stability of Static Walking**
 - If a humanoid robot can sustain its walking in which **accelerations** are not influential factors, then the walking is statically stable.
- **Stability of Dynamic Walking**
 - If a humanoid robot can sustain its walking in which **accelerations** are influential factors, then the walking is dynamically stable.

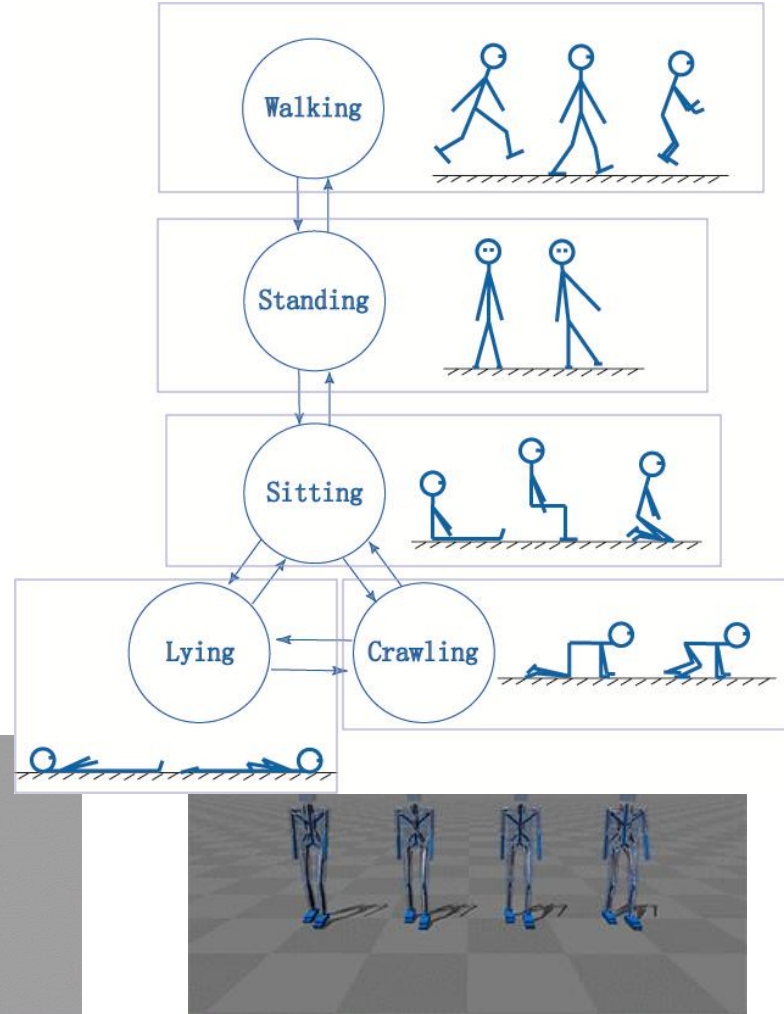
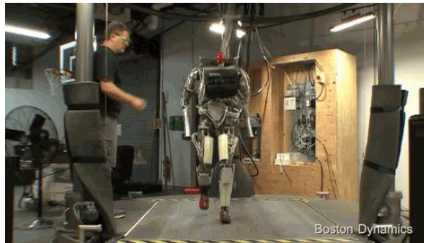


Knowledge Flow Related to Biped Walking

- Walking Behavior Types



- Pacing Gait
- Walking Gait
- Trotting Gait
- Cantering Gait
- Galloping Gait

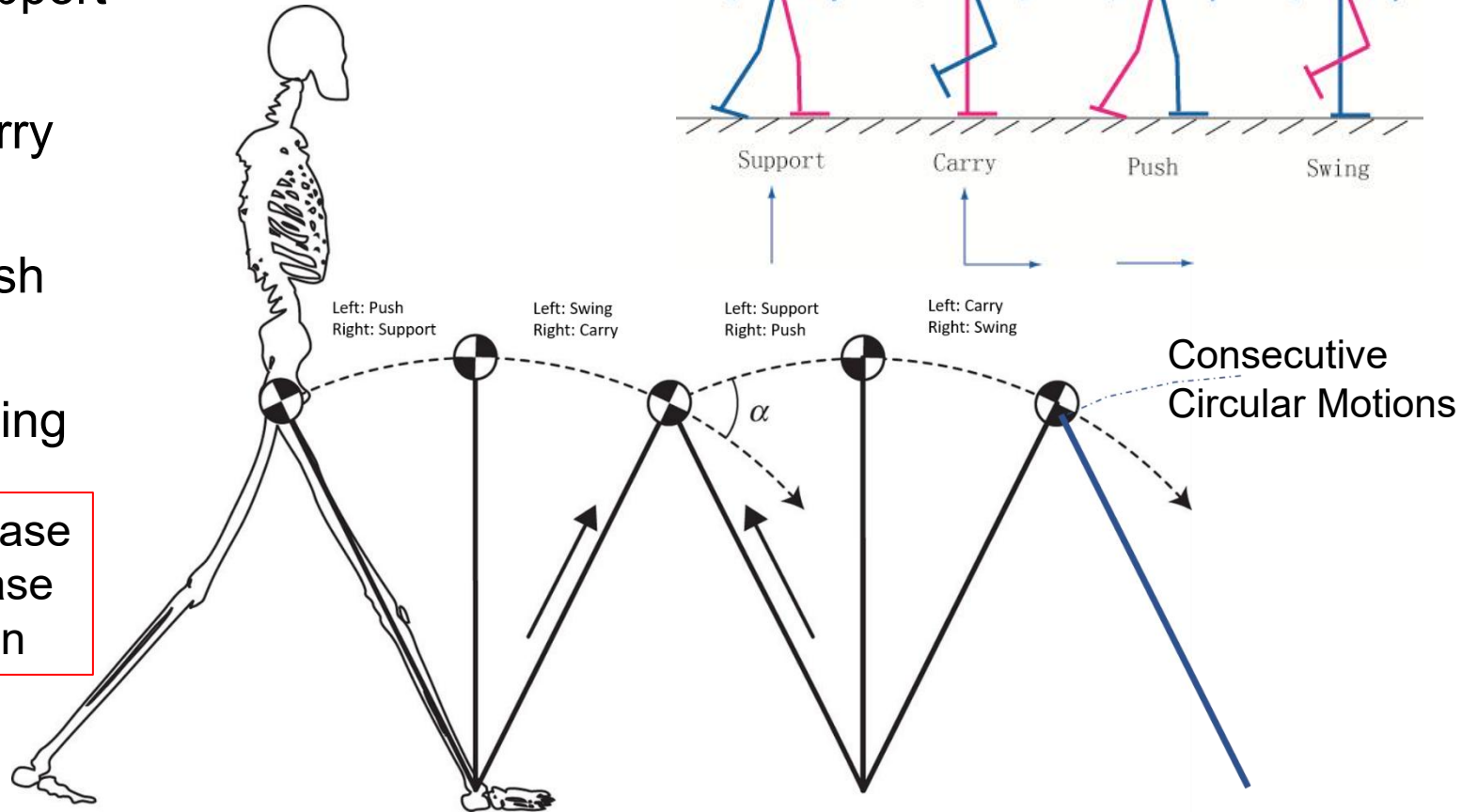
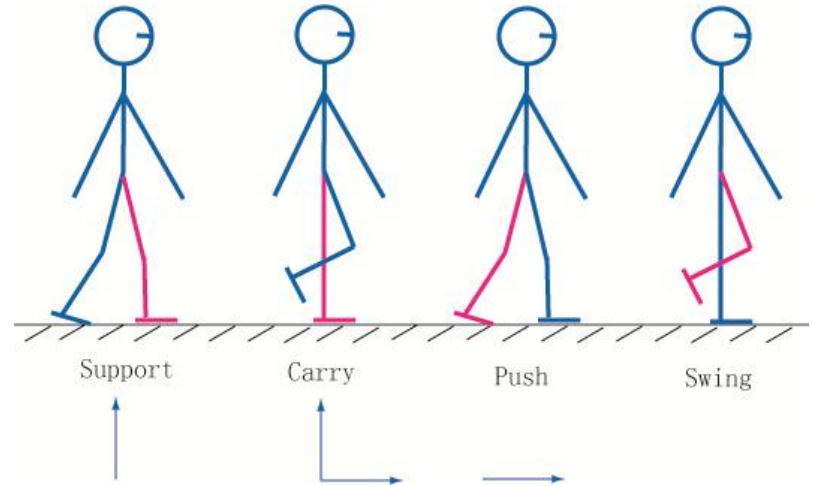


Knowledge Flow Related to Biped Walking

- Four basic actions by each leg:

Stance Phase

- Support
- Carry
- Push
- Swing



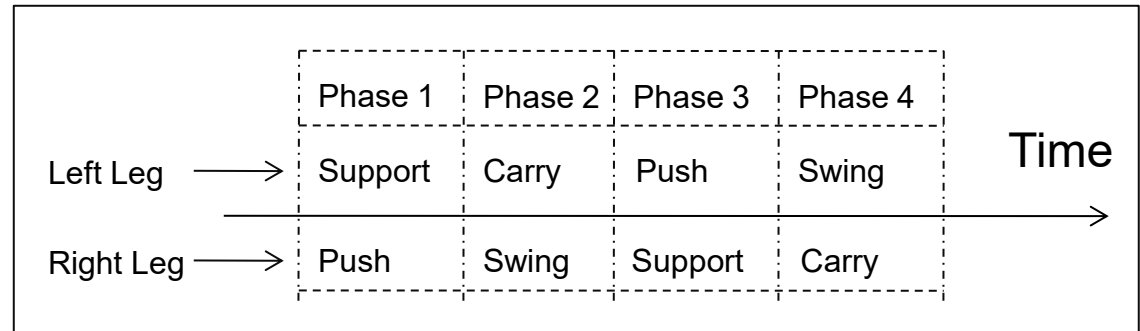
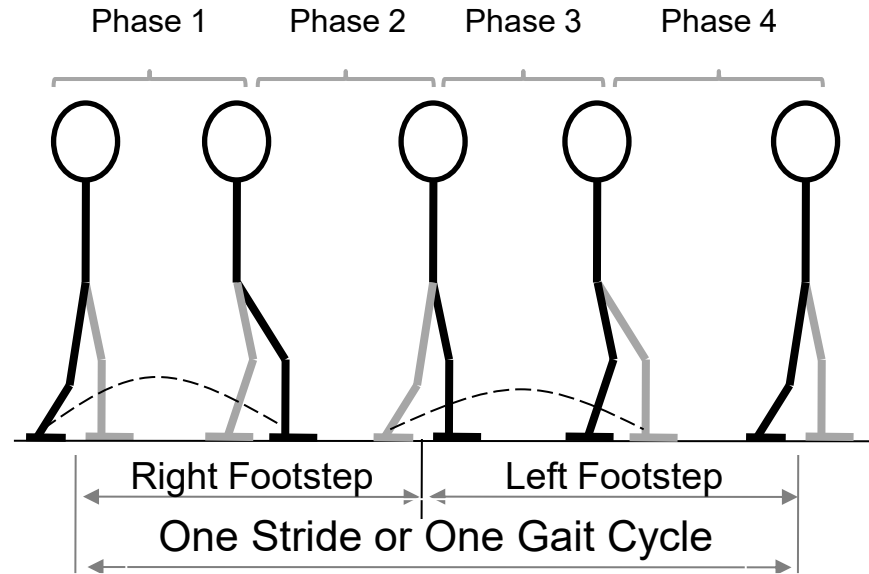
Knowledge Flow Related to Biped Walking

- Four basic walking phases:

- Support-Push
- Carry-Swing
- Push-Support
- Swing-Carry

- Pacing Gait
- Walking Gait
- Trotting Gait
- Canter Gait
- Galloping Gait

by adding suspension phase





Nanyang Technological University



(Learning, Teaching) <o> (Research, Innovation) <o> (Leadership, Service)



Mid-2010s



Outline of Today's Talk

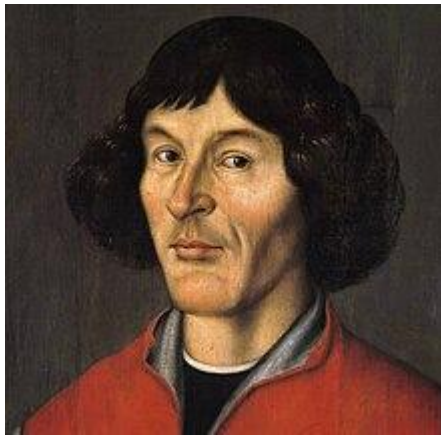
- What is humanoid robot?
- What are the domain knowledge behind humanoid robot?
- What are the key steps toward development of humanoid robot?
 - Material Flow Inside Humanoid Robots
 - Energy Flow Inside Humanoid Robots
 - Signal Flow Inside Humanoid Robots
 - Motion Flow Inside Humanoid Robots
 - Knowledge Flow Inside Humanoid Robots
- **Concluding Remarks**



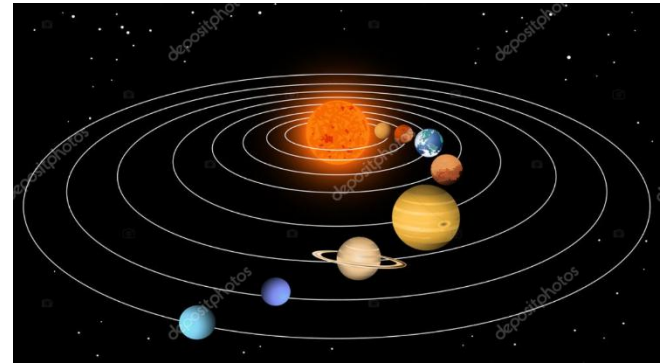
Dilemma before 15th Century

In the study of astronomy, one of the biggest dilemma was about the center of the solar system:

- Hypothesis 1 (Geo-centrism): Earth is the center of the solar system.
(e.g., What is 昆仑? Point of Sunrise? Point of Sunset?)
- Hypothesis 2 (Helio-centrism): Sun is the center of the solar system.



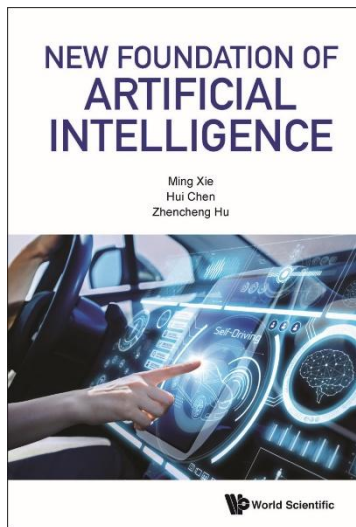
Nicolaus Copernicus
(1473 - 1543)



Dilemma before 21th Century

In the study of artificial intelligence, one of the biggest dilemma was about the origin of intelligence:

- Hypothesis 1 (Brain-centrism): Brain is generator of intelligence.
- Hypothesis 2 (Mind-centrism): Mind is generator of intelligence.



2021



It is an Interesting Parallel in History ...

Earth-Sun Relationship

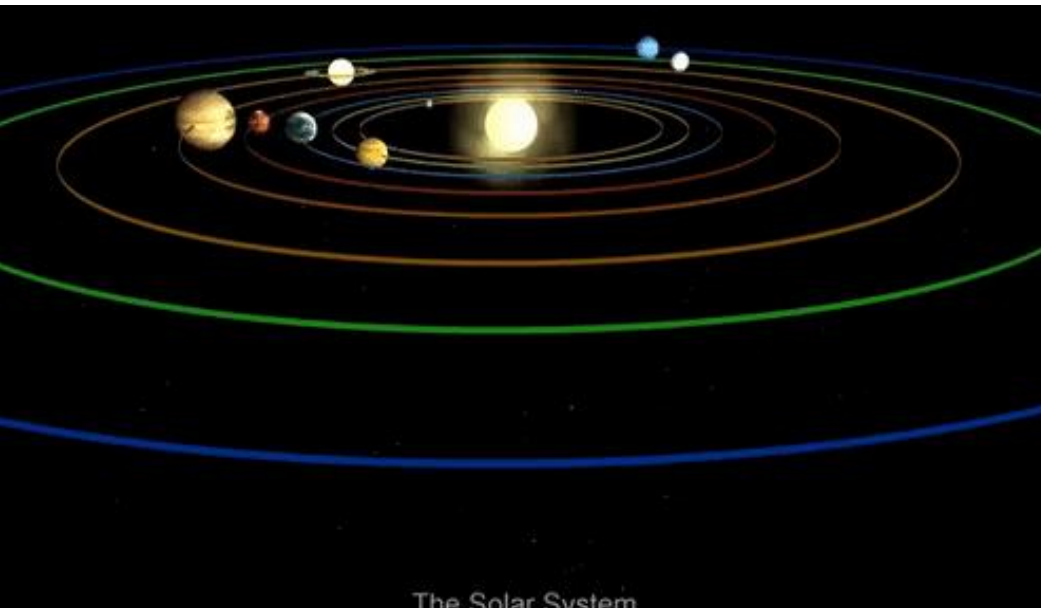
- Nicolaus Copernicus was an astronomer who proposed a heliocentric system, that the planets orbit around the Sun; that Earth is a planet which, besides orbiting the Sun annually, also self-rotates once daily on its own axis. Sun is at the center of the universe, but not Earth which orbits the Sun.

Brain-Mind Relationship

- Brain provides hardware support to the functionalities of Mind. Brain's primary functions are computation and memorization (or storage), while Mind's primary functions are cognition and recognition. Mind is at the root of natural or artificial intelligence. Intelligence arises from Mind directly, but not Brain which supports Mind.

What is our mission on Earth?

- (1) to understand the world, and
- (2) to improve the world?



The Solar System



How to fulfill our missions on Earth, which include: (1) to understand the world, and (2) to improve the world?

Research comes first:

- What is research? What are the 1,2,3 of research?

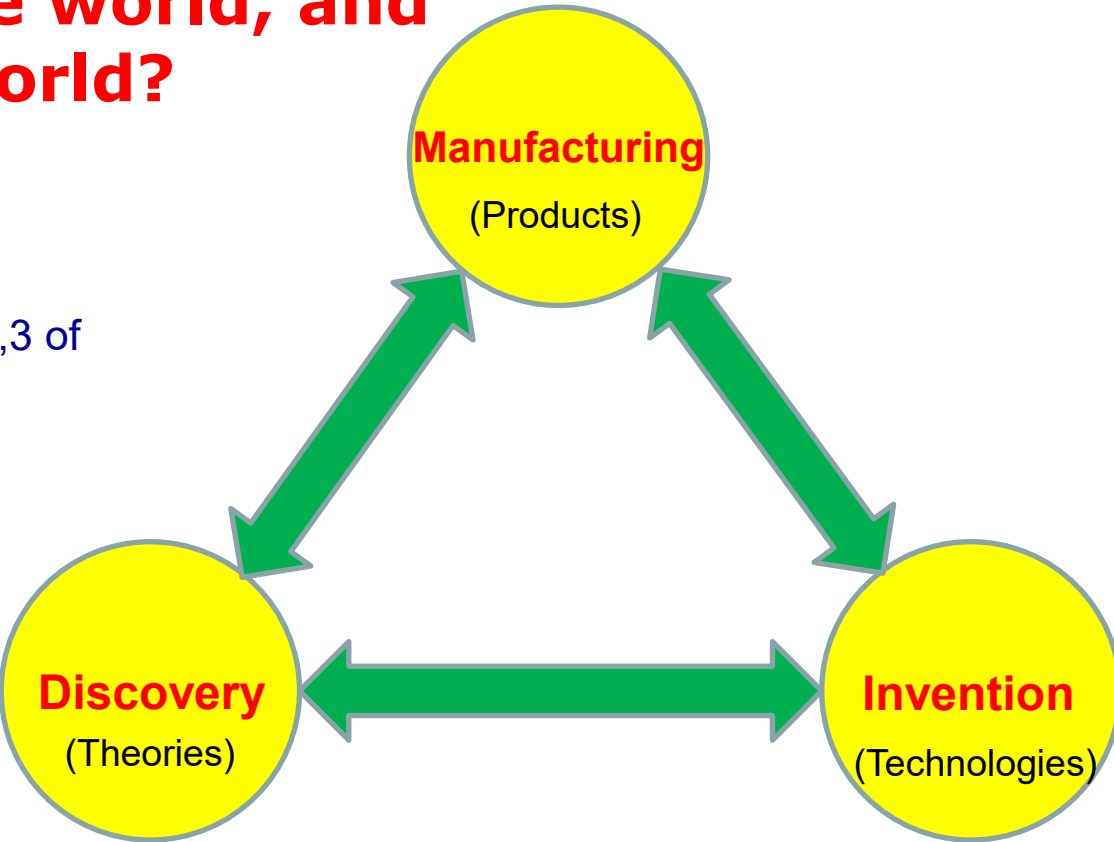
One Objective:

1. Research has one objective which is to create values by finding better ways of solving problems.



Two Driving Forces of Research

1. Scientific Problems
2. Social Needs



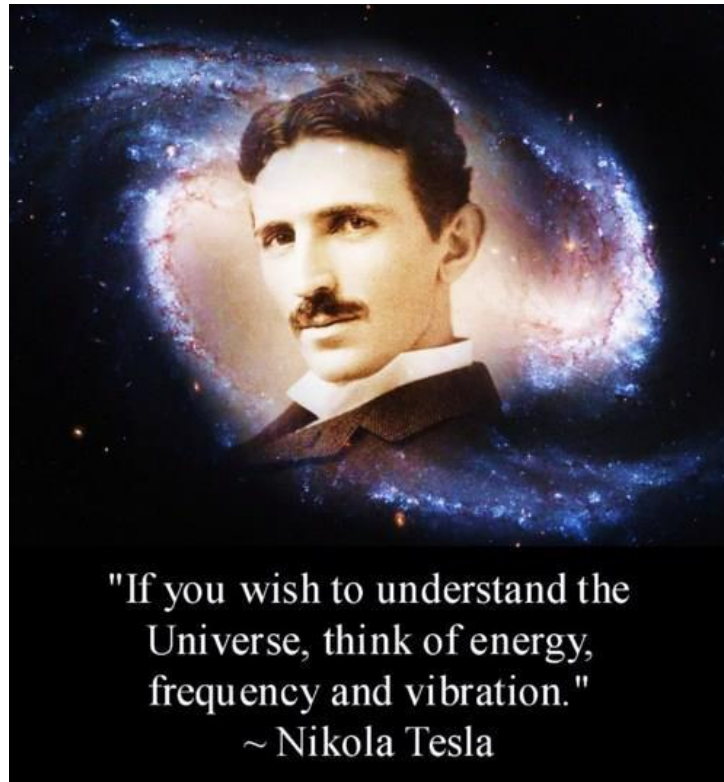
Three Outcomes:

1. Creation of Better Theories
2. Creation of Better Technologies
3. Creation of Better Products



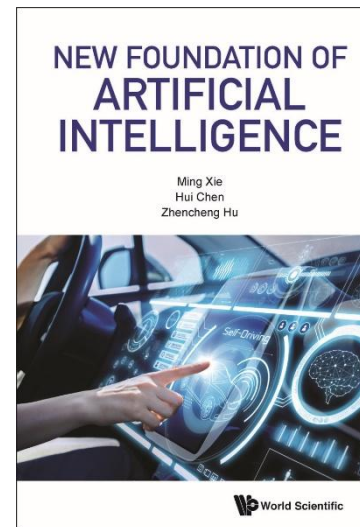
How to understand the universe?

- If you wish to understand the **secrets** of the universe, think in terms of **energy, frequency and vibration**. – Nikola Tesla

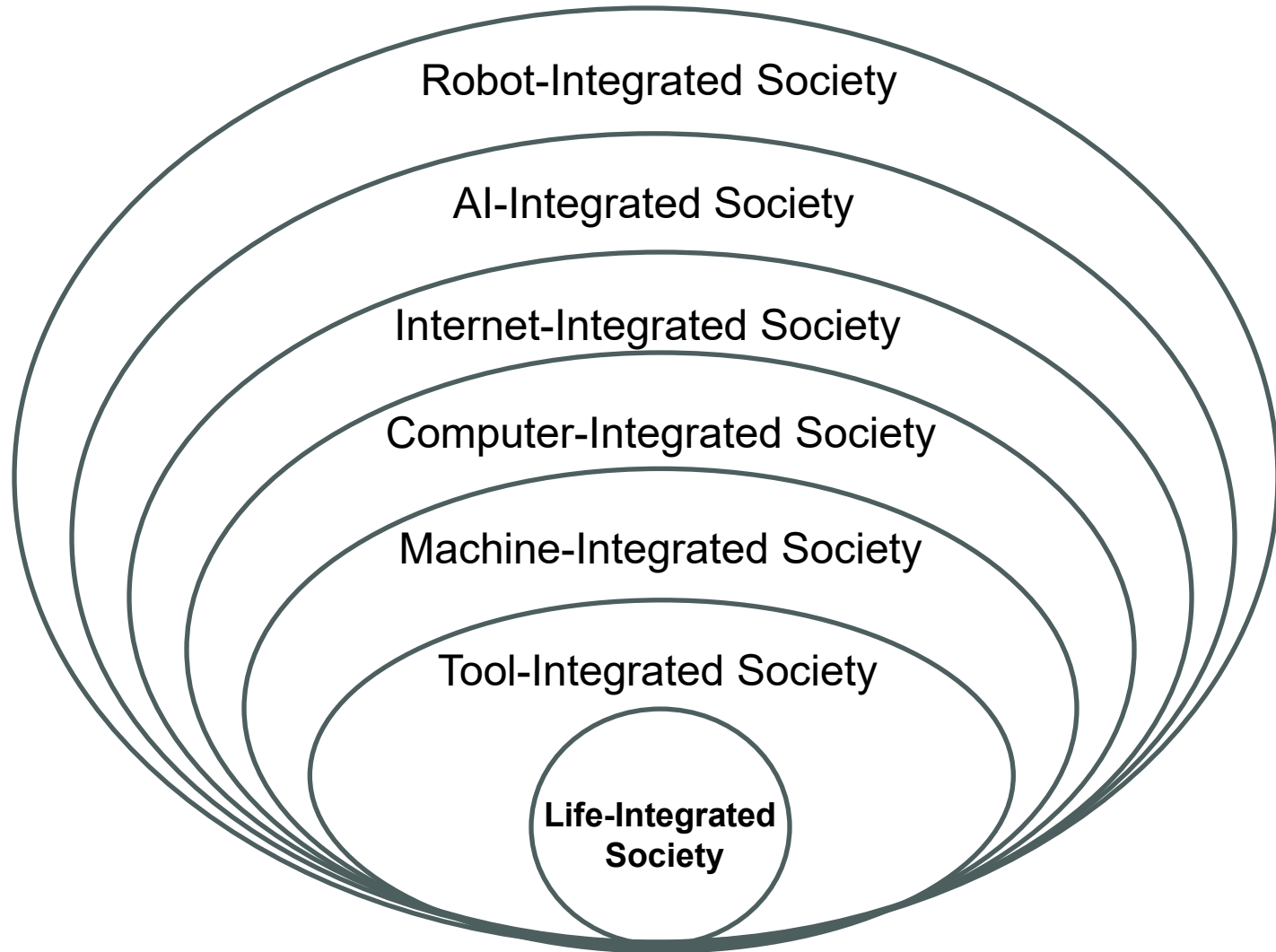


How to understand the world?

- If you wish to understand the world, think in terms of **systems, devices and materials** – Ming XIE
- If you wish to understand the **meanings** of the world, think in terms of **space (空), vector (色) and time (无常)?** - Ming XIE



How to improve the world?



How to improve the world?

- To invent smarter products, smarter systems and smarter machines



Advice 1: It is beneficial to compare Humanoid Robot's Intelligence with Human Being's Intelligence ...

Human Intelligence

- Signal to Knowledge Transformation
- Knowledge to Knowledge Transformation
- Knowledge to Signal Transformation

Robot Intelligence

- Signal to Knowledge Transformation
- Knowledge to Knowledge Transformation
- Knowledge to Signal Transformation

Advice 2: It is beneficial to compare Humanoid Robot's Learning with Human Being's Learning

...

Human Learning

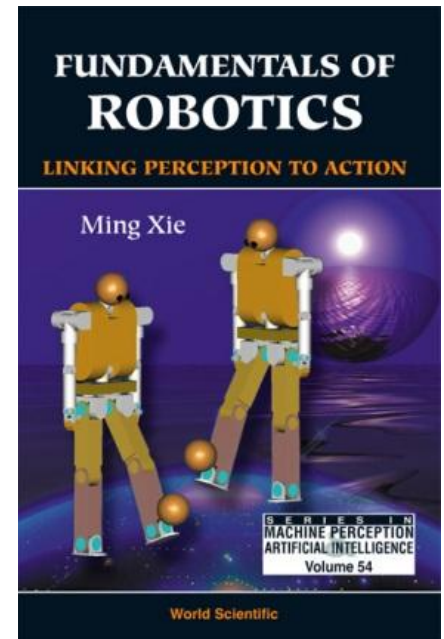
- Learning of Static Systems
- Learning of Dynamic Systems
- Learning of Properties
- Learning of Constraints

Robot Learning

- Learning of Static Systems
- Learning of Dynamic Systems
- Learning of Properties
- Learning of Constraints

Advice 3: We should not forget the prerequisite of learning ...

- Human being's intelligence makes human beings **educable or teachable**. Educable human beings will greatly grow the knowledge and skills through learning.
- Similarly, humanoid robot's intelligence must make humanoid robots **educable or teachable**. Educable humanoid robots will greatly grow the knowledge and skills through learning.



Educable Humanoid Robots

Summary of Today's Talk

- What is humanoid robot?
- What are the domain knowledge behind humanoid robot?
- What are the key steps toward development of humanoid robot?
 - Material Flow Inside Humanoid Robots
 - Energy Flow Inside Humanoid Robots
 - Signal Flow Inside Humanoid Robots
 - Motion Flow Inside Humanoid Robots
 - Knowledge Flow Inside Humanoid Robots
- Concluding Remarks



Key Takeaways: Understanding of ...

- One Definition: Robot in Image of Human Being
- Three Domains of Knowledge: Body, Brain and Mind
- Five Key Steps of Development: They are the effective ways which translate the three domains of know-hows into the achievements of these five layers of:
 - **Material Flow** Inside Humanoid Robots
 - **Energy Flow** Inside Humanoid Robots
 - **Signal Flow** Inside Humanoid Robots
 - **Motion Flow** Inside Humanoid Robots
 - **Knowledge Flow** Inside Humanoid Robots



**NANYANG
TECHNOLOGICAL
UNIVERSITY**

School of Mechanical & Aerospace Engineering

Design, Machine, Control, Intelligence

“Ask not what your country can do for you – ask what you can do for your country,” - John F. Kennedy

“Do not think that you are needy – think that you are needed in the world”, - Manis Friedman

“Study will make you knowledgeable, resourceful, and hence more needed”, - Xie Ming

Thank You for Listening!