



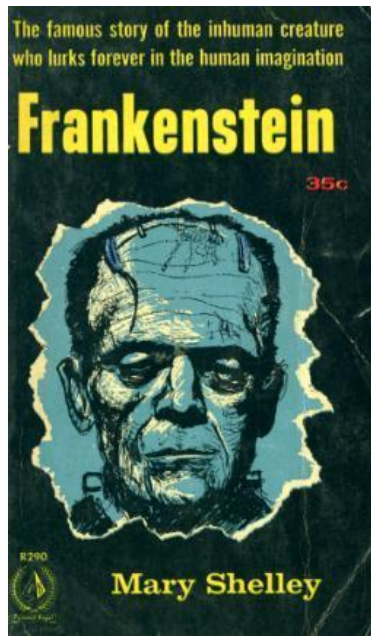
# Flowers and Light: What to Expect from AI

Matthew Turk  
Professor and Chair  
Dept. of Computer Science  
UC Santa Barbara

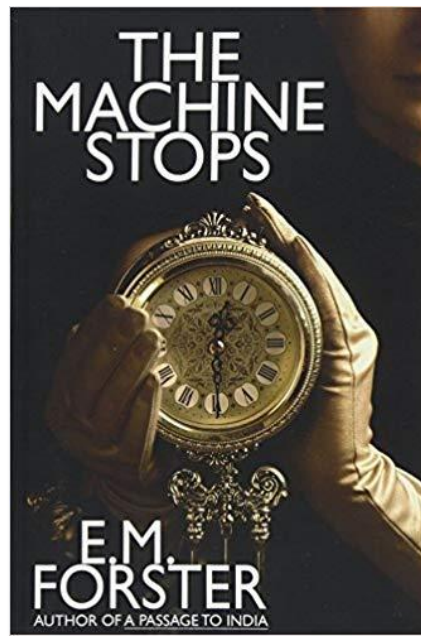
47<sup>th</sup> Annual SCALL Institute



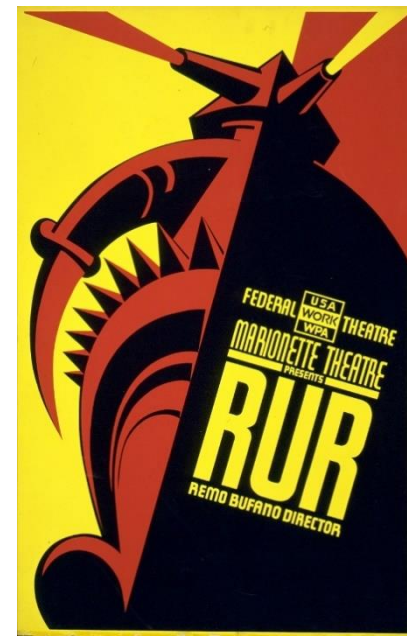
**WHAT IS  
A.I.?**



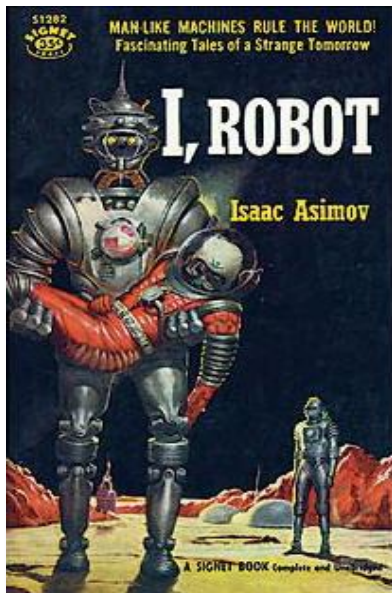
1818



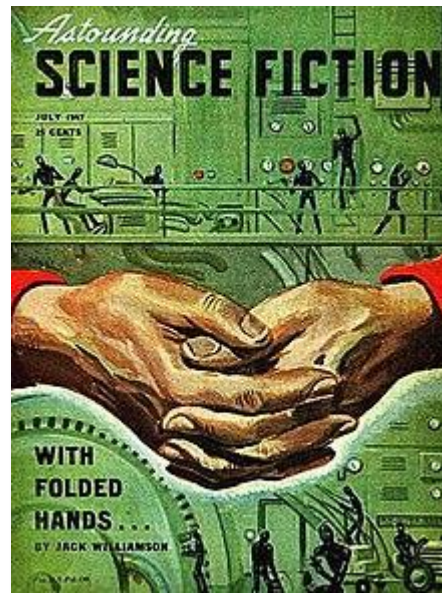
1909



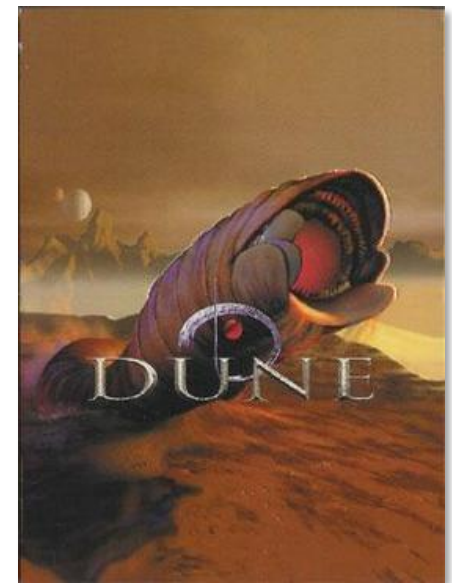
1920



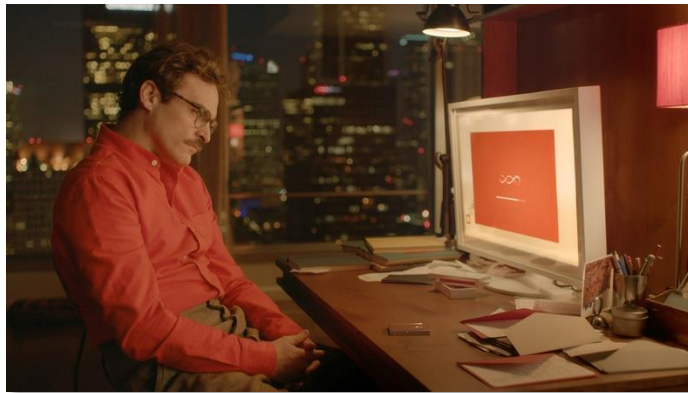
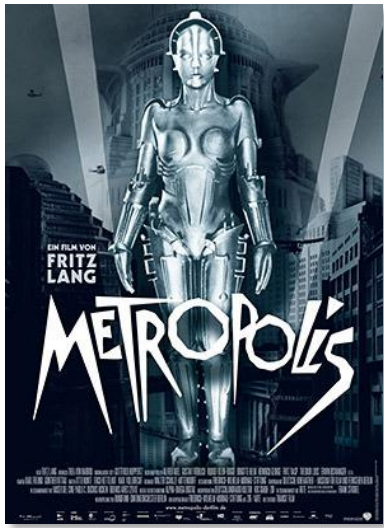
1942



1947



1965



# 2001: A Space Odyssey (1968)

HAL was “born” on January 12, 1997 in Urbana, Illinois

January 12, 1992 in the film

What does HAL do?

Plays chess

Talks, converses w/people

Exhibits common sense

Sees

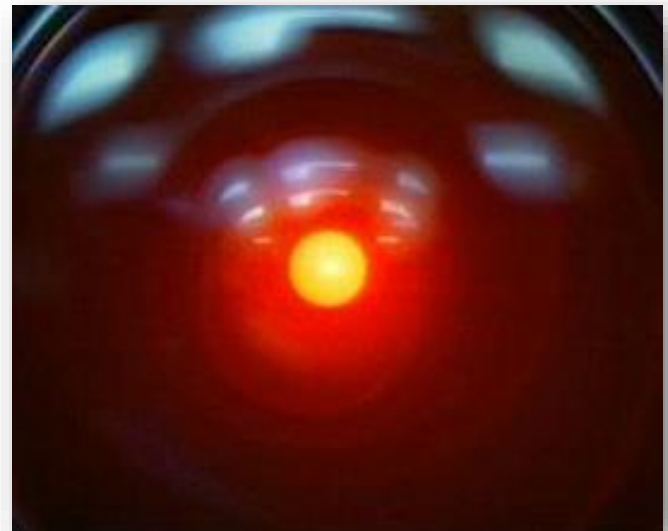
Appreciates art

Reads lips!

Has feelings, emotions

Tries to manipulate people

Exhibits fear of non-existence



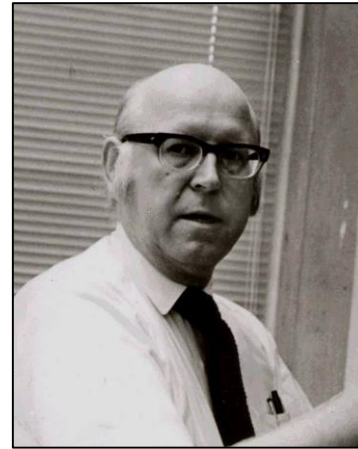
Meanwhile, in the real world...



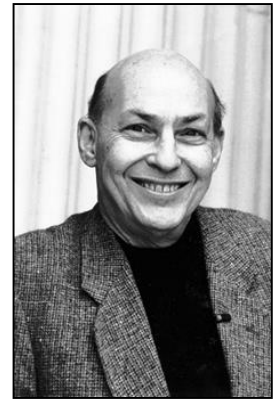
John McCarthy



Herb Simon



Allen Newell



Marvin Minsky

## Seminal event for Artificial Intelligence as a field, in 1956: **The Dartmouth Summer Research Conference on Artificial Intelligence**

“We propose that a 2 month, 10 man study of artificial intelligence be carried out during the summer of 1956 at Dartmouth College in Hanover, New Hampshire. The study is to proceed on the basis of **the conjecture that every aspect of learning or any other feature of intelligence can in principle be so precisely described that a machine can be made to simulate it.** An attempt will be made to find how to make machines use language, form abstractions and concepts, solve kinds of problems now reserved for humans, and improve themselves. We think that a significant advance can be made in one or more of these problems if a carefully selected group of scientists work on it together for a summer.”

# Foundations of AI

## Philosophy

Framed the ideas of AI

Dualism/materialism, logical/rational/empirical, causality, consciousness, mind/body...

## Mathematics

Formalized computation, logic, probability

Possibilities and limitations of computation

## Psychology

Experimental: the brain as an information processing device  
(Cognitive Science, Neuroscience, Psychophysics)

## Computer Science and Engineering

Algorithms

Built real machines, Moore's Law progress

# So what is Artificial Intelligence?

- “The science and engineering of making intelligent machines, especially intelligent computer programs.”
- “The study of how to make computers do things at which, at the moment, people are better.”
- “The design of flexible programs that respond productively in situations that were not specifically anticipated by the designer.”
- “The construction of computations that perceive, reason, and act effectively in uncertain environments.”
- “The branch of CS concerned with enabling computers to simulate such aspects of human intelligence as speech recognition, deduction, inference, creative response, the ability to learn from experience, and the ability to make inferences given incomplete information.”
- “Modeling aspects of human cognition on computers”
- “What AI people do”

# What AI people study

Logic

Knowledge representation

Search

Reasoning/inference

Non-monotonic reasoning

Planning

Probabilistic reasoning

Naïve physics

Machine learning

Speech recognition

Natural language processing

Computer vision

Pattern recognition

Intelligent agents

Robotics

Neural networks

Data mining

Expert systems

... and more...

# IJCAI topics (keywords for submission)

## ***Agent-based and Multi-agent Systems***

Agent/AI Theories and Architectures  
Agent-based Simulation and Emergent Behavior  
Agent Communication  
Argumentation  
Auctions And Market-Based Systems  
Coordination And Collaboration  
Distributed AI  
E-Commerce  
Game Theory  
Information/Mobile/Software Agents  
Multiagent Learning  
Multiagent Planning  
Multiagent Systems (General/other)  
Negotiation And Contract-Based Systems  
Social Choice Theory

## ***Constraints, Satisfiability, and Search***

Applications  
Constraint Optimization  
Constraint Satisfaction (General/other)  
Distributed Search/CSP/Optimization  
Dynamic Programming  
Search, SAT, CSP: Evaluation and Analysis  
Global Constraints  
Heuristic Search  
Search, SAT, CSP: Meta-heuristics  
Meta-Reasoning  
Quantifier Formulations  
Satisfiability (General/other)  
SAT and CSP: Modeling/Formulations  
Search (General/other)  
SAT and CSP: Solvers and Tools

## ***Knowledge Representation, Reasoning and Logic***

Action, Change and Causality  
Automated Reasoning and Theorem Proving  
Belief Change  
Common-Sense Reasoning  
Computational Complexity of Reasoning  
Description Logics and Ontologies  
Diagnosis and Abductive Reasoning  
Geometric, Spatial, and Temporal Reasoning  
Knowledge Representation Languages  
Knowledge Representation (General/other)  
Logic Programming

Many-Valued And Fuzzy Logics

Nonmonotonic Reasoning  
Preferences

Qualitative Reasoning  
Reasoning with Beliefs

## ***Machine Learning***

Active Learning  
Case-based Reasoning  
Classification  
Cost-Sensitive Learning  
Data Mining  
Ensemble Methods  
Evolutionary Computation  
Feature Selection/Construction  
Kernel Methods  
Learning Graphical Models  
Learning Preferences/Rankings  
Learning Theory  
Machine Learning (General/other)

Neural Networks  
Online Learning  
Reinforcement Learning  
Relational Learning  
Time-series/Data Streams  
Transfer, Adaptation, Multi-task Learning  
Semi-Supervised/Unsupervised Learning  
Structured Learning

## ***Multidisciplinary Topics and Applications***

AI and Natural Sciences  
AI and Social Sciences  
Art And Music  
Autonomic Computing  
Cognitive Modeling  
Computational Biology  
Computer Games  
Computer-Aided Education  
Database Systems  
Philosophical and Ethical Issues  
Human-Computer Interaction  
Intelligent User Interfaces  
Interactive Entertainment  
Personalization and User Modeling  
Real-Time Systems  
Security and Privacy  
Validation and Verification

## ***Natural-Language Processing***

Dialogue  
Discourse  
Information Extraction  
Information Retrieval  
Machine Translation  
Morphology and Phonology  
Natural Language Generation  
Natural Language Semantics  
Natural Language Summarization  
Natural Language Syntax  
Natural Language Processing (General/other)  
Psycholinguistics  
Question Answering  
Speech Recognition And Understanding  
Text Classification

## ***Planning and Scheduling***

Activity and Plan Recognition  
Hybrid Systems  
Markov Decisions Processes  
Model-Based Reasoning  
POMDPs  
Plan Execution And Monitoring  
Plan/Workflow Analysis  
Planning Algorithms  
Planning under Uncertainty  
Planning (General/other)  
Scheduling  
Theoretical Foundations of Planning

## ***Robotics and Vision***

Behavior And Control  
Cognitive Robotics  
Human Robot Interaction  
Localization, Mapping, State Estimation  
Manipulation  
Motion and Path Planning  
Multi-Robot Systems  
Robotics  
Sensor Networks  
Vision and Perception  
***Uncertainty in AI***  
Approximate Probabilistic Inference  
Bayesian Networks  
Decision/Utility Theory  
Exact Probabilistic Inference

Graphical Models

Preference Elicitation  
Sequential Decision Making  
Uncertainty Representations  
Uncertainty in AI (General/other)

## ***Web and Knowledge-based Information Systems***

Information Extraction  
Information Integration  
Information Retrieval  
Knowledge Acquisition  
Knowledge Engineering  
Knowledge-based Systems (General/other)  
Ontologies  
Recommender Systems  
Semantic Web  
Social Networks  
Source Wrapping  
Web Mining  
Web Search  
Web Technologies (General/other)

“Artificial”

+

“Intelligence”

“Artificial”



?



**Weak AI**  
Artificial Narrow  
Intelligence (ANI)

**Strong AI**  
Artificial General  
Intelligence (AGI)

# “Intelligence”

Interact/communicate using language and speech

Appropriately apply vast amounts of knowledge

Adaptive, goal-oriented behavior

Self-awareness

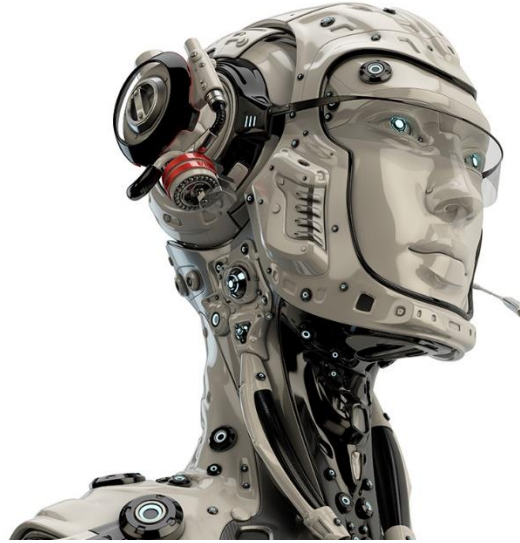
Learn from experience

Tolerate error and ambiguity in the world; robustness

Timely response

Sound reasoning





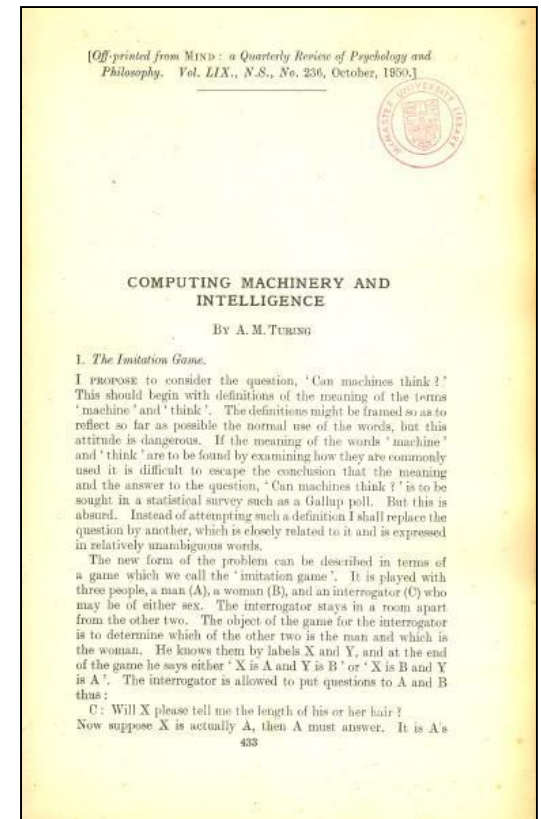
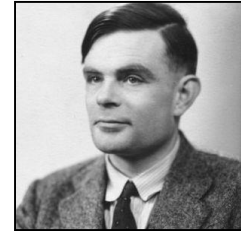
How could we know if a machine is intelligent?

# Computing machinery and intelligence (Turing 1950)

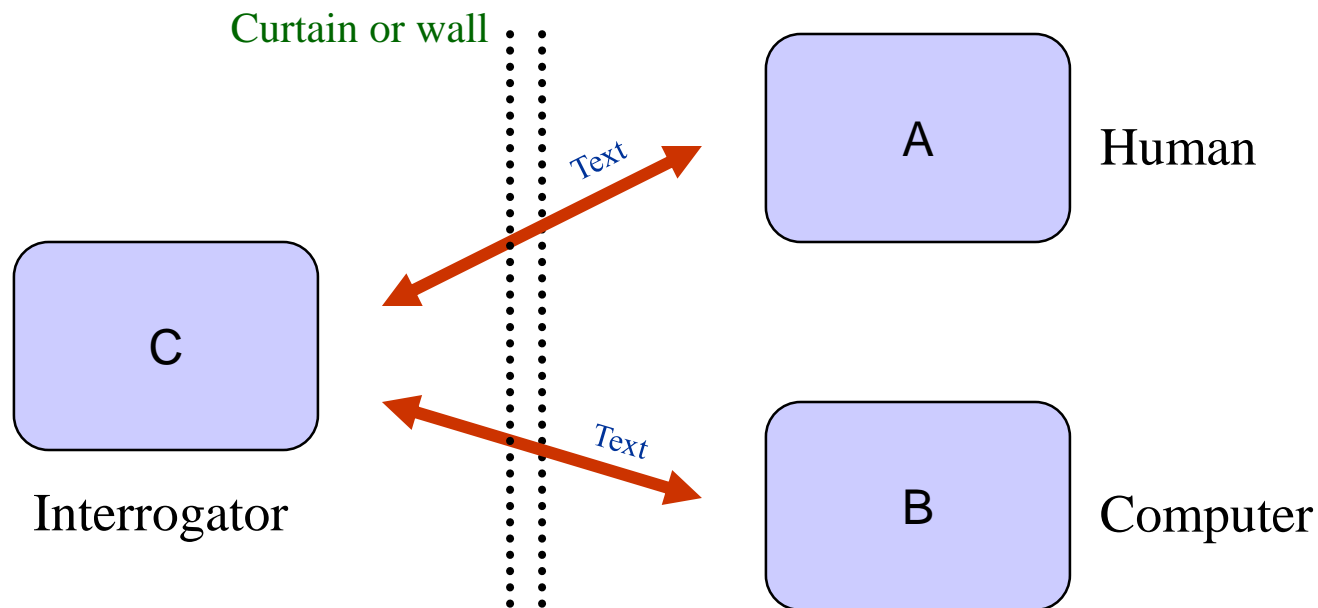
I propose to consider the question, "Can machines think?" This should begin with definitions of the meaning of the terms "machine" and "think."

Instead of attempting such a definition I shall replace the question by another, which is closely related to it and is expressed in relatively unambiguous words.

The new form of the problem can be described in terms of a game which we call the "imitation game."



# The Imitation Game



Q: Please write me a sonnet on the subject of the Forth Bridge.

A : Count me out on this one. I never could write poetry.

Q: Add 34957 to 70764.

A: (Pause about 30 seconds and then give as answer) 105621.

Q: Do you play chess?

A: Yes.

Q: I have K at my K1, and no other pieces. You have only K at K6 and R at R1. It is your move. What do you play?

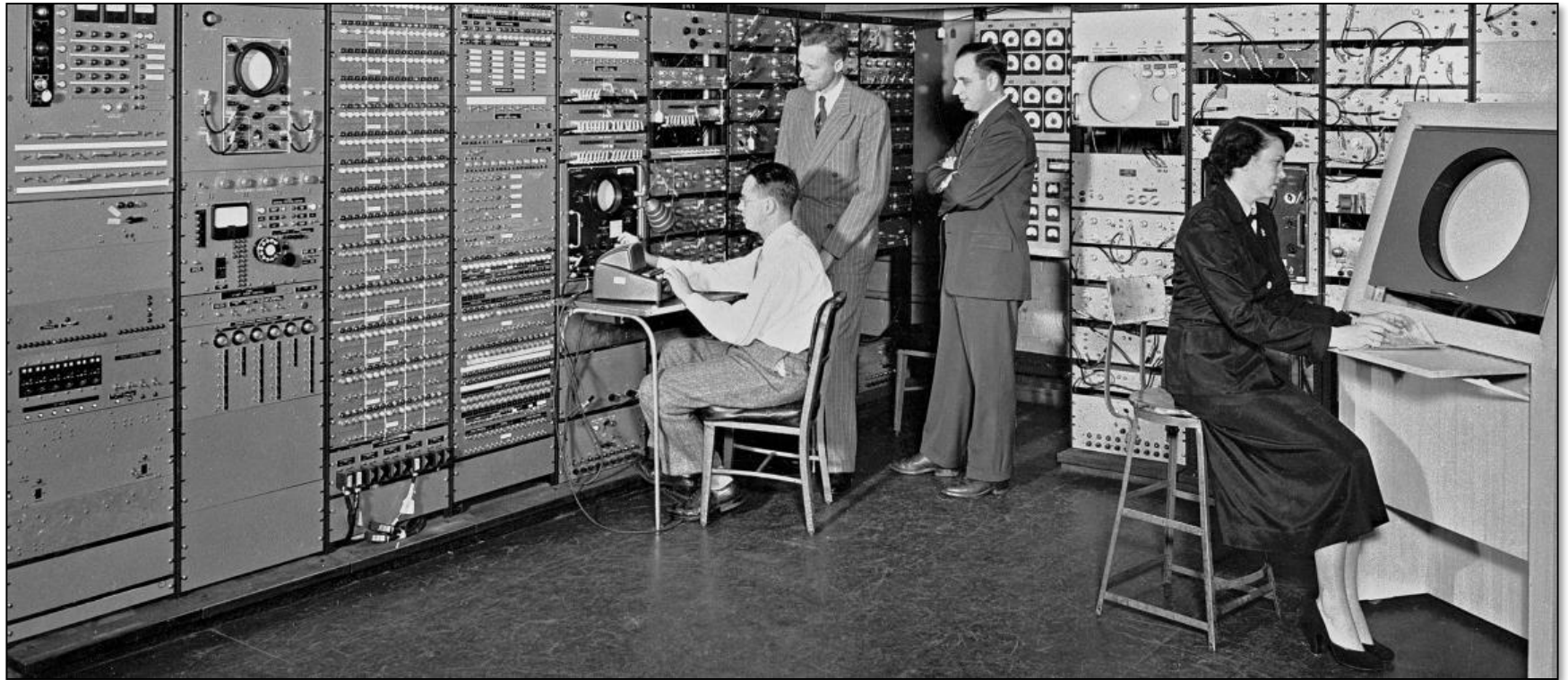
A: (After a pause of 15 seconds) R-R8 mate.

# Computing machinery and intelligence (Turing 1950)

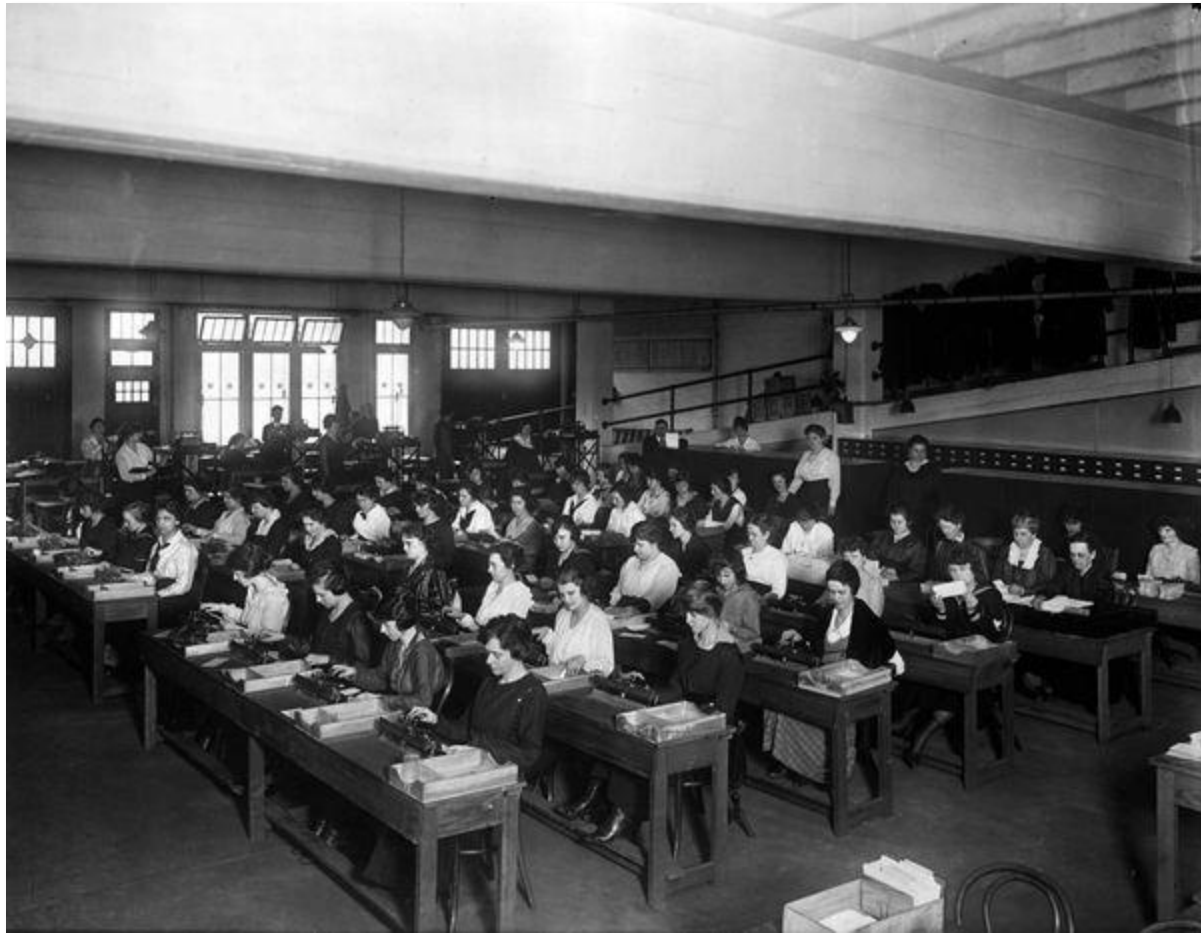
I believe that in about fifty years' time it will be possible, to programme computers, with a storage capacity of about  $10^9$ , to make them play the imitation game so well that an average interrogator will not have more than 70 per cent chance of making the right identification after five minutes of questioning.

The original question, "Can machines think?" I believe to be too meaningless to deserve discussion. Nevertheless I believe that at the end of the century the use of words and general educated opinion will have altered so much that one will be able to speak of machines thinking without expecting to be contradicted.

# Computers in 1950



...and before that



# Turing paper (cont.)

## The Turing Test

“Are there **imaginable digital computers** which would do well in the imitation game?”

I.e., Can a computer fool an interrogator into thinking it is a person?

## Properties of the Turing Test

**Operational/functional/behavioral** definition of intelligence

Distinguishes between **physical** and **intellectual** capacities

Question and answer method – **language** comprehension and generation

## Might there be other kinds of Turing Tests?

Emotional, physical, visual...



# “Strong AI” vs. “Weak AI”

## “Strong AI” (Artificial General Intelligence)

Goal: To understand the **principles and mechanisms** that account for intelligent action

Makes the **bold claim** that computers can be made to think on a level (at least) equal to humans. [Intelligence = information processing]

## “Weak AI” (Artificial Narrow Intelligence)

Goal: To design intelligent systems that can survive and operate in the real world and **solve problems** of considerable scientific difficulty at high levels of competence

Some “thinking-like” features can be added to computers to make them more **useful** tools

Examples: expert systems, speech recognition, natural language understanding, recommender systems, etc.

# “Strong AI” vs. “Weak AI” (cont.)

## Principles of Strong AI

Intelligent behavior is explicable in scientific terms; a rigorous understanding of intelligence is possible

Intelligence can take place outside the human skull

Intelligence = symbol manipulation (perhaps grounded in perception and action)

The computer is the best laboratory instrument for exploring these propositions

## Principle of Weak AI

Who cares??



# AI and human intelligence

AI (even Strong AI) doesn't *necessarily* seek to replicate human intelligence

Sometimes more, sometimes less...

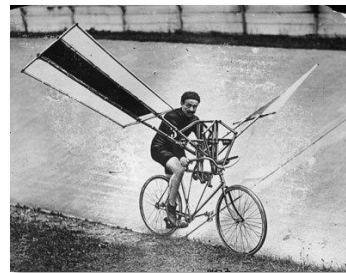
Creating the “essence of X” vs. creating “X”

Examples

Physical vs. electronic newspaper

Physical vs. virtual shopping

Birds vs. planes



# What is an AI Program?

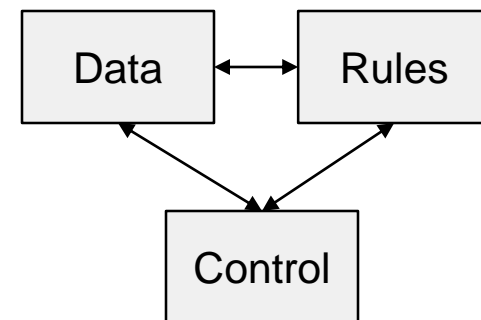
Classical AI programs can generally be thought of as comprising three *separated* parts

Data / knowledge (“knowledge base”)

Operations / rules (“production rules”)

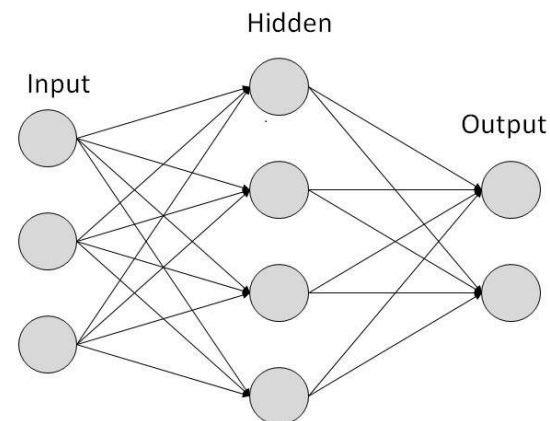
Control: Which rules to apply when

*Data* and *Operations* should be modular and easy to modify



On the other end of the spectrum, we have *neural networks* and specifically *deep learning*

Input/output black box!



# Classical vs. Deep Learning approaches

## Classical AI

Think about the world,  
interview domain experts

Write down rules that  
encapsulate intelligent  
behavior

Hope that these adequately  
cover the range of real-world  
situations

**Deductive reasoning**

## NN / Deep Learning

Collect massive amounts of  
data

Provide an architecture for  
learning (primed with some  
goals)

Hope that the data can be  
abstracted into meaningful  
general concepts

**Inductive reasoning**

How do people tend to reason?

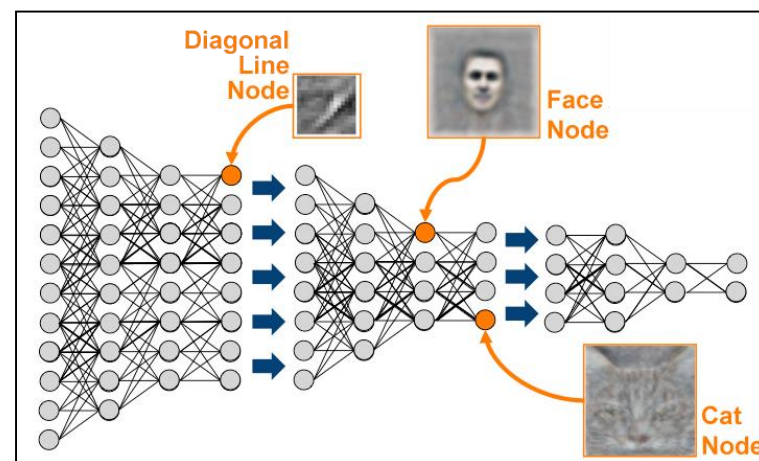
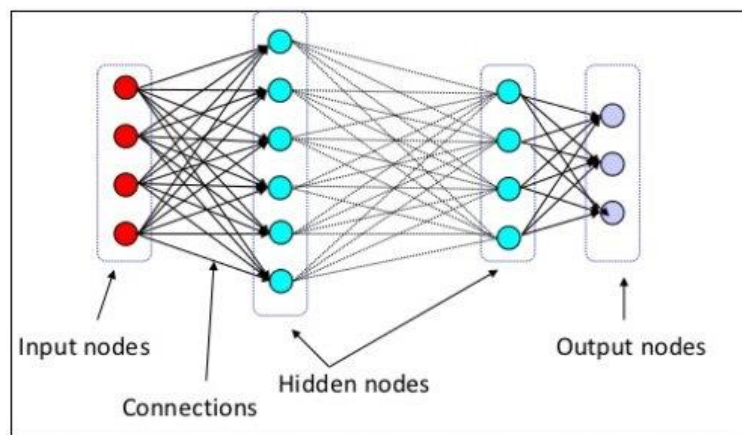
# Deep Learning

Deep Learning: Machine learning-based AI motivated by the structure and function of the brain, characterized by huge amounts of data, **neural network** architectures, advanced learning algorithms, and fast computers

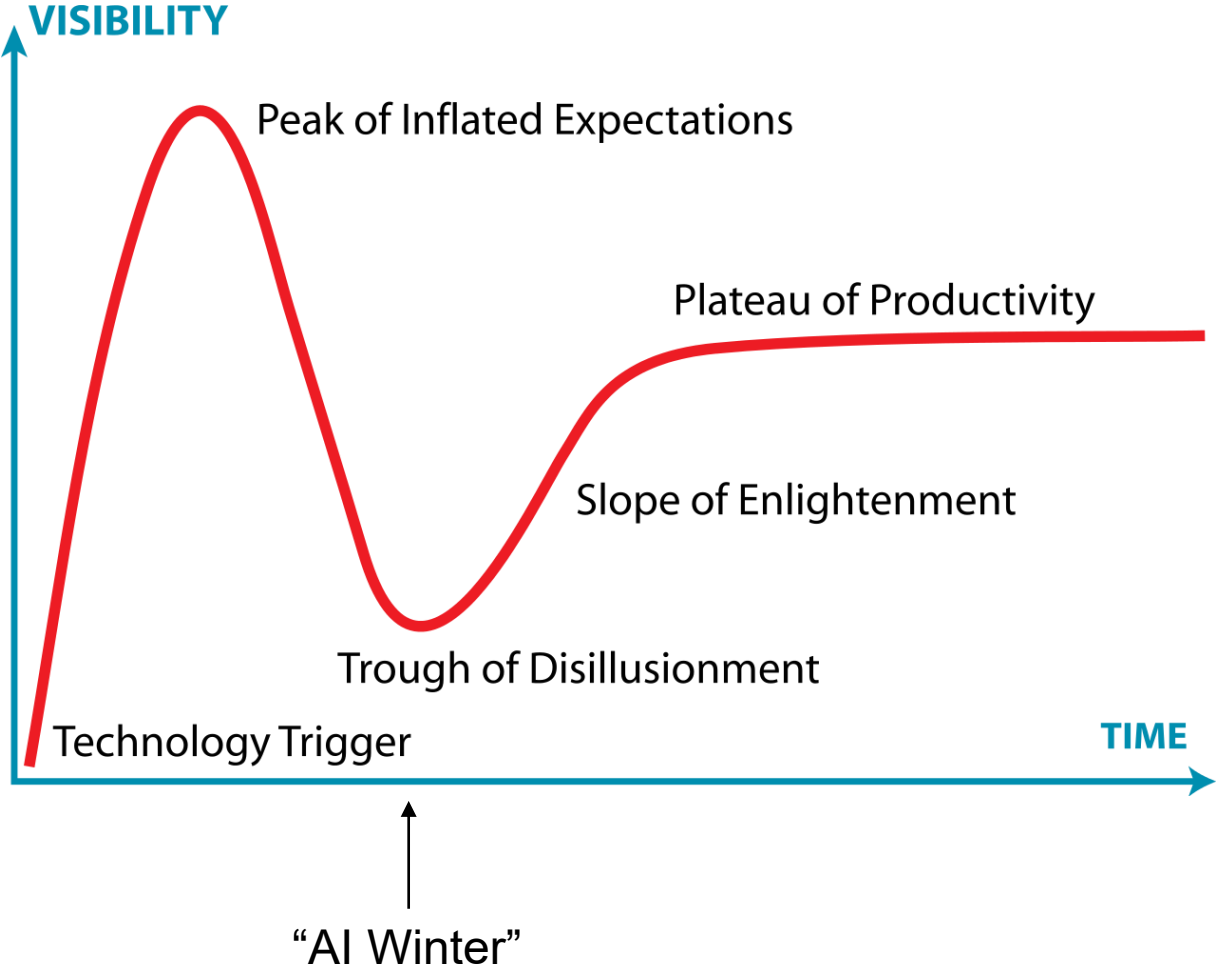
Learning hierarchies of features, factors, concepts

Extracting multiple layers of representation from data

Or... neural networks with many layers



# The hype cycle of AI



# Some notable AI systems

## IBM Deep Blue

Beat world chess champion Gary Kasparov in 1997



## Google AlphaGo

Defeated world Go champion in 2017



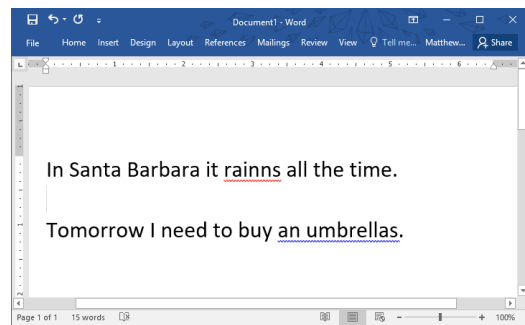
## Expert systems

Medical diagnosis

E.g., Leukemia diagnosis system

## User interface

Grammar and spelling checkers, automated help



## Speech & language understanding & translation

Web search (Google, Bing)

Phone-based systems (e.g., airline reservations)

Siri, Google Now, Amazon Alexa



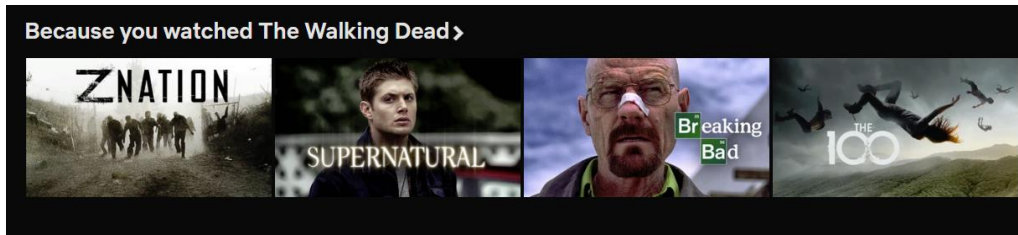
# Some notable AI systems (cont.)

IBM Watson

2011, an experiment in “Deep Q&A”



Recommender systems



Netflix (Amazon, Pandora, etc.)

Skype Voice Translator



# Some notable AI systems (cont.)

## Data mining

Fraud detection, credit scoring, customer profiles and preferences, genome analysis



## Computer vision

Face detection and recognition systems

## Robotics

Mars Rover, robots for hazard environments, factory automation

Sony, Honda, others: robot pets

1980s – DARPA ALV Program

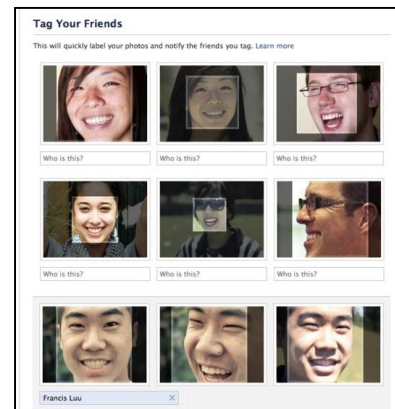
CMU Navlab drove across country (2797/2849 miles)

E.g., “Hands Across America” 1995

DARPA Grand Challenge, Urban Challenge

Autonomous cars – Google, Tesla, Toyota, GM, ...

UAVs – unmanned aerial vehicles (drones)



Reasoning, learning, planning

**Cognition**

Computer vision

**Vision**

Audio  
understanding

**Hearing**

**Speech & language**

Natural language processing

**Embodied Intelligence**

**Emotion**

Affective computing



Touch  
Haptics

**Touch**

**Manipulation**

Robotics

**Locomotion**

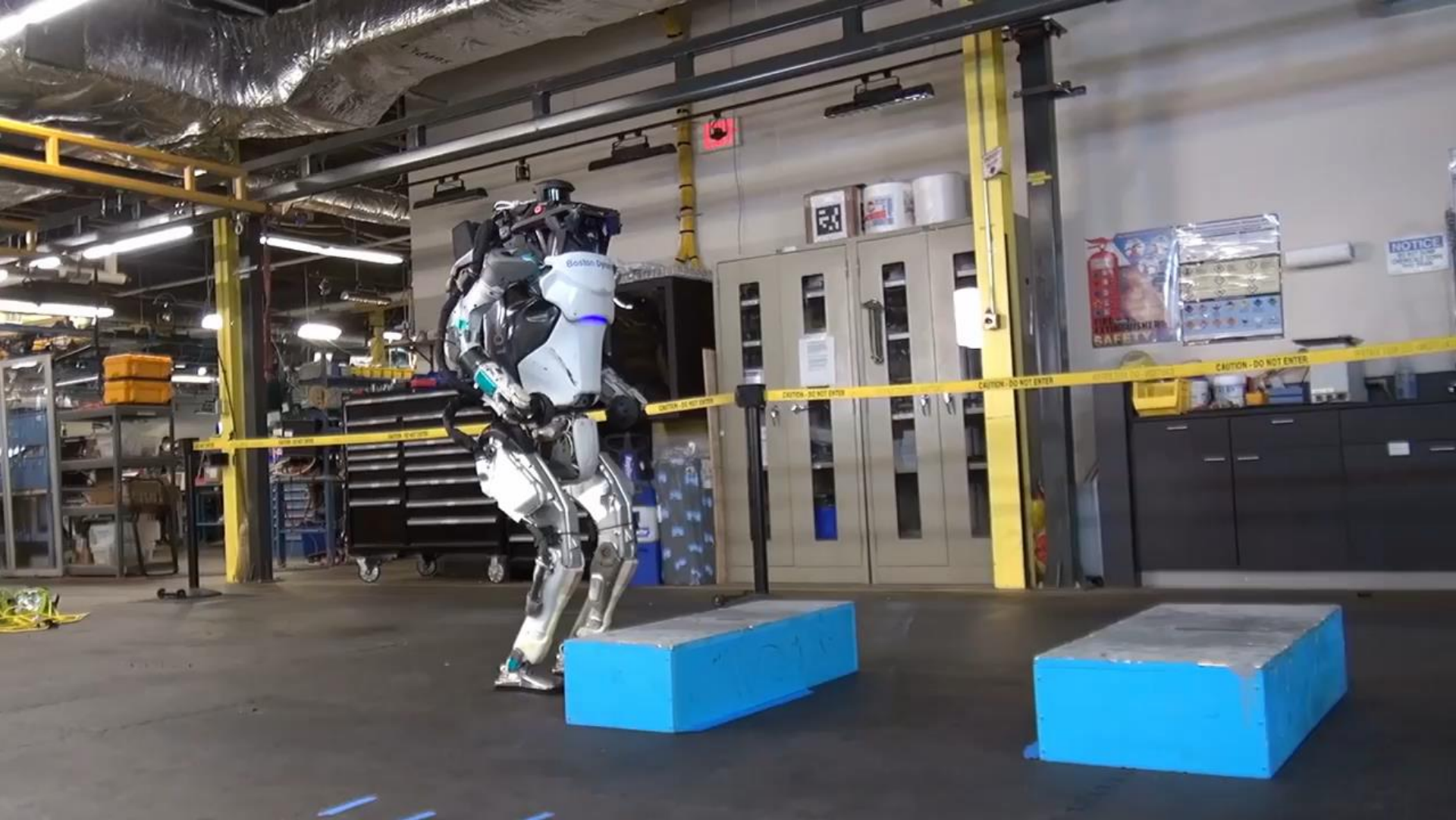


CMU Leg Lab 1983

Boston Dynamics



Boston Dynamics 2018



# iRobot Roomba Pet Series

Vacuum Cleaning Robot



**The smarter way to get it done.**

So where's it going?

# The state of AI

After a long history of ups and downs, AI is now coming of age, with technical successes, huge investments, and practical benefits increasing daily.

Data, algorithms, and computational power are enabling rapid advances in **machine learning**, which is being applied widely in every industry.

Sensing and perception technologies are enabling safer driving and **autonomous vehicles**.

AI systems are increasing **productivity** in the workplace.

AI is improving medical diagnosis and **healthcare**.

Automatic **translation** systems are enabling cross-cultural communication, large-scale document translation, and real-time counter-terrorism.

Better web search, product recommendations, fraud detection, spam filtering, driving directions, computer security, drug discovery, genetics, etc. etc. etc.



# The driver: Machine learning

Rapid advances in **machine learning** are largely responsible for the accelerated advances and optimism in AI.

Especially in **deep learning** and applications in visual detection and recognition, speech processing, and natural language processing

Why?

1. Better training algorithms
2. Better machines (especially GPUs)
3. More data

# Coming soon...

Autonomous cars and trucks

More accurate radiology diagnosis

Better computer security – e.g., malware detection

Physical security and surveillance

Detection of fake news

Robot pets and companions

Search and rescue robots

AI-based tutoring and training

Artificial characters: entertainment and gaming

Document analysis and powerful information retrieval tools

Personalized everything

Continued improvements in productivity, efficiency, and accuracy across an organization

# AI will transform...

Transportation

Healthcare

Finance

Energy

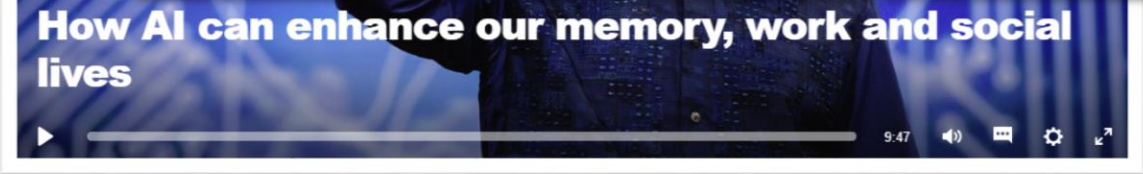
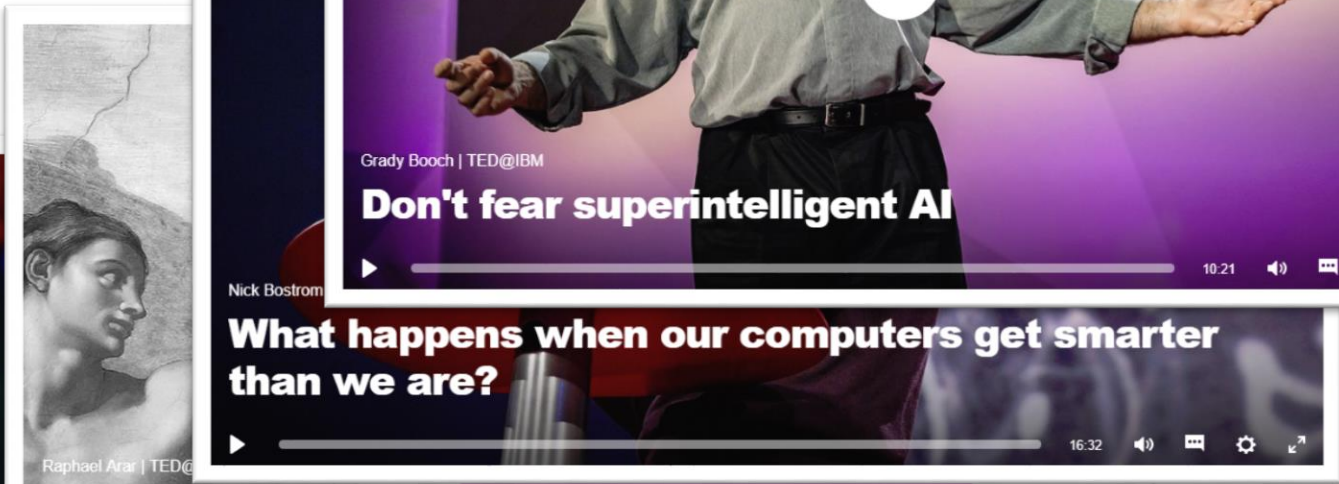
Agriculture

Manufacturing

Art and entertainment

Amara's Law: We tend to overestimate the effect of a technology in the short run and underestimate the effect in the long run.

Every industry is now investing heavily in AI!



## TECH & SCIENCE

# STEPHEN HAWKING AI WARNING: ARTIFICIAL INTELLIGENCE COULD DESTROY CIVILIZATION

BY **HANNAH OSBORNE** ON 11/7/17 AT 4:43 AM



Stephen Hawking sits onstage during an announcement of the Breakthrough Starshot initiative with investor Yuri Milner in New York City, on April 12, 2016. Hawking, the English physicist, warns humanity needs to become a multiplanetary species to ensure its survival.

REUTERS/LUCAS JACKSON



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From the Magazine

# ELON MUSK'S BILLION-DOLLAR CRUSADE TO STOP THE A.I. APOCALYPSE

Elon Musk is famous for his futuristic gambles, but Silicon Valley's latest rush to embrace artificial intelligence scares him. And he thinks you should be frightened too. Inside his efforts to influence the rapidly advancing field and its proponents, and to save humanity from machine-learning overlords.



Perhaps we should learn from this old Twilight Zone episode?

# Some issues to consider

**Unemployment.** What happens after the end of jobs?

**Inequality.** How do we distribute the wealth created by machines?

**Access.** How do we share access to powerful tools?

**Humanity.** How do machines affect our behavior and interaction?

**Artificial stupidity.** How can we guard against mistakes?

**Racist robots.** How do we eliminate AI bias?

**Security.** How do we keep AI safe from adversaries?

**Explainability.** How do we understand, evaluate, and trust AI decisions?

**Evil genies.** How do we protect against unintended consequences?

**Robot rights.** How do we define the humane treatment of AI?

The new Manhattan Project is not AI R&D – it's AI that is safe, responsible, accessible, and ethical.





<http://www.cs.ucsb.edu/~mturk>

<http://www.cs.ucsb.edu>