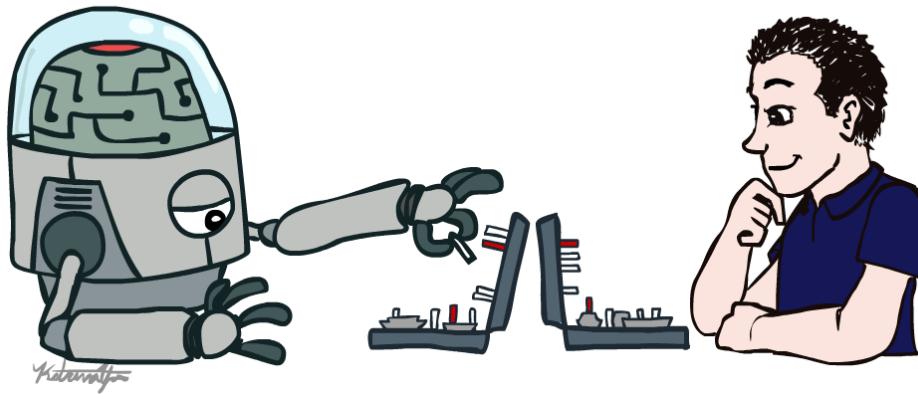


# CS 188: Artificial Intelligence

## Introduction



Instructors: Sergey Levine and Stuart Russell

# Course Staff

## Professors



Sergey Levine



Stuart Russell

## GSI



Aditya  
Baradwaj



Adam Gleave



Alex Li



Austen Zhu



Avi Singh



Charles Tang



Dennis Lee



Dequan Wang



Ellen Luo



Fred Ebert



Henry Zhu



Jasmine Deng



Jason Peng



Katie Luo



Laura Smith



Micah Carroll



Mike Chang



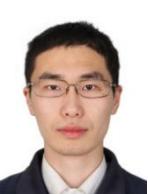
Murtaza Dalal



Rachel Li



Rishi  
Veerapaneni



Ronghang Hu



Sid Reddy



Simin Liu



Tony Zhao



Wilson Yan



Xiaocheng  
(Mesut) Yang

# Course Information

<http://inst.cs.berkeley.edu/~cs188>

CS 188 | Spring 2019      Syllabus    Staff    Schedule    Policies    Projects

CS 188 | Introduction to Artificial Intelligence  
Spring 2019

Lecture: M/W 5:00-6:30 pm, Wheeler 150



Description

This course will introduce the basic ideas and techniques underlying the design of intelligent computer systems. A specific emphasis will be on the statistical and decision-theoretic modeling paradigm.

By the end of this course, you will have built autonomous agents that efficiently make decisions in fully informed, partially observable and adversarial settings. Your agents will draw inferences in uncertain environments and optimize actions for arbitrary reward structures. Your machine learning algorithms will classify handwritten digits and photographs. The techniques you learn in this course apply to a wide variety of artificial intelligence problems and will serve as the foundation for further study in any application area you choose to pursue.

See the syllabus for slides, deadlines, and the lecture schedule.

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Syllabus

Wk	Date	Lecture Topic	Readings	Section	Homework	Project
0	1/23 Wed	Intro to AI	Ch. 1, 2	No Section	HW0 Math Diagnostic	PO Tutorial

## ■ Communication:

- Announcements, questions on Piazza
- Staff email: [cs188@berkeley.edu](mailto:cs188@berkeley.edu)
- Office hours in 730 Sutardja Dai Hall
  - Sergey: Monday 9-10, **after lectures**
  - Stuart Tuesday 9-11 (**not next week**)
- Sections, tutoring signup, videos

## ■ Course technology:

- Website
- Piazza
- Gradescope
- This course is webcast

# Course Information

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- Prerequisites:
  - (CS 61A or CS 61B) and (CS 70 or Math 55)
    - Recommended: CS 61A and CS 61B and CS 70
  - There will be some math and some programming
- Work and Grading:
  - 5 programming projects (25%): Python, groups of 1 or 2
    - 5 late days for semester, maximum 2 per project
  - 11 homework assignments (15%):
    - Electronic component: Online, interactive, solve alone/together, submit alone
    - Written component: On paper, solve alone/together, submit alone, self-assess
  - One midterm (20%), one final (40%)
  - Fixed grading scale (85% A, 80% A-, etc.)
  - Participation (class, section, Piazza, contests) can help on margins
  - Academic integrity policy

# Exam Dates

---

- Midterm: March 20<sup>th</sup>, 7:00pm-9:00pm
- Final: May 16<sup>th</sup>, 7.00pm-10.00pm
  
- There will be no alternate exams
  - Conflict with other class final exam: see web site form

# Discussion Section

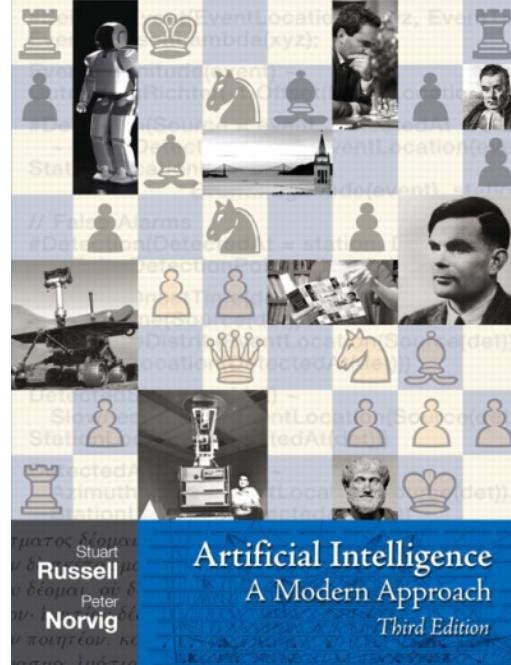
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- Topic: review / warm-up exercises / questions not handled in class
  - There will also be recorded videos of how to think through the solution process
- Currently, none of you are assigned to sections
- You are welcome to attend any section of your preference
- Piazza survey later this week to help keep sections balanced
- From past semesters' experience we know sections will be (over)crowded the first two weeks of section, but then onwards section attendance will be lower and things will sort themselves out
- Sections begin next week (1/28).

# Textbook

Russell & Norvig, AI: A Modern Approach, 3<sup>rd</sup> Ed.

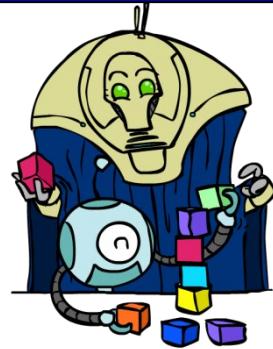
(sorry!)



Artificial Intelligence  
A Modern Approach  
*Third Edition*

Stuart  
**Russell**  
Peter  
**Norvig**

# Instruction vs. Assessment



Instruction

Grow knowledge, collaborate,  
work until success



Assessment

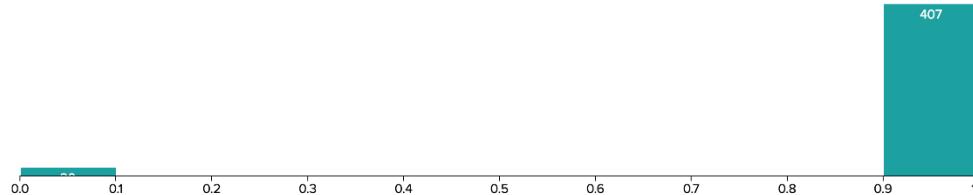
Measure knowledge, each student  
on their own, stopped before success

Our experience: these two goals don't mix

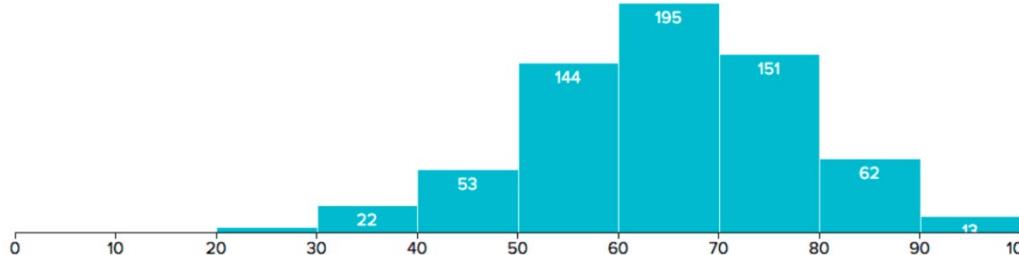
- Lecture / Section / OH / Piazza / Homework / Projects are instruction
  - collaborative, work until success (but please no spoilers, no cheating)
- Exams are assessment
  - on your own

# Some Historical Statistics

- Homework and projects: work alone/together, iterate/learn till you nailed it



- Exams: assessment



# Announcements This Week

---

- Important this week:
  - Check out website: <https://inst.eecs.berkeley.edu/~cs188> (has links to homework, projects)
  - Register on Gradescope and Piazza (check your email for links)
  - HW0: Math self-diagnostic is online now (due on Monday 1/28 at 11:59pm)
  - P0: Python tutorial is online now (due on Monday 1/28 at 11:59pm)
  - One-time (optional) P0 lab hours (Thursday 7-8.30pm, Friday 6-7.30pm, 330 Soda Hall)
  - Instructional accounts: if you want one, go to <https://inst.eecs.berkeley.edu/webacct>
- Also important:
  - Waitlist: See <https://eecs.berkeley.edu/resources/undergrads/cs/degree-reqs/enrollment-policy> or google “Berkeley EECS enrollment”
  - Concurrent enrollment (with certain administrative exceptions) occurs when waitlist is empty

# Laptops in Lecture

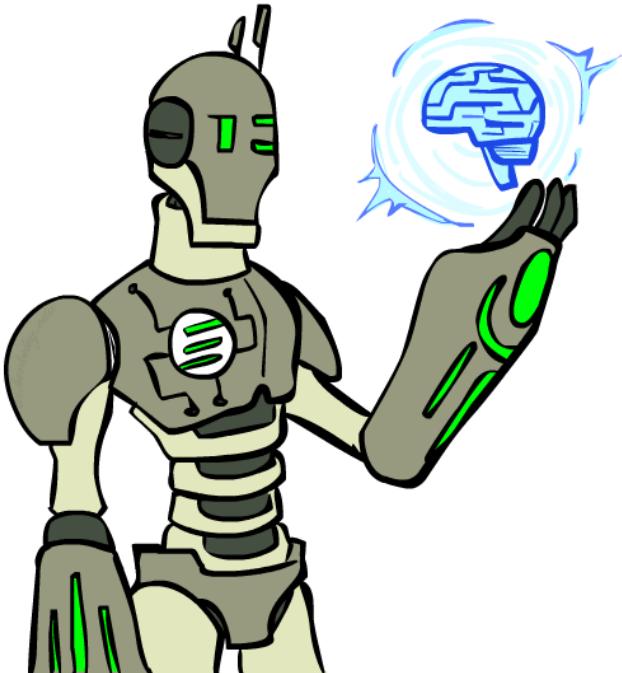
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- Laptops can easily distract students behind you  
Please consider sitting towards the back if using your laptop in lecture

# Today

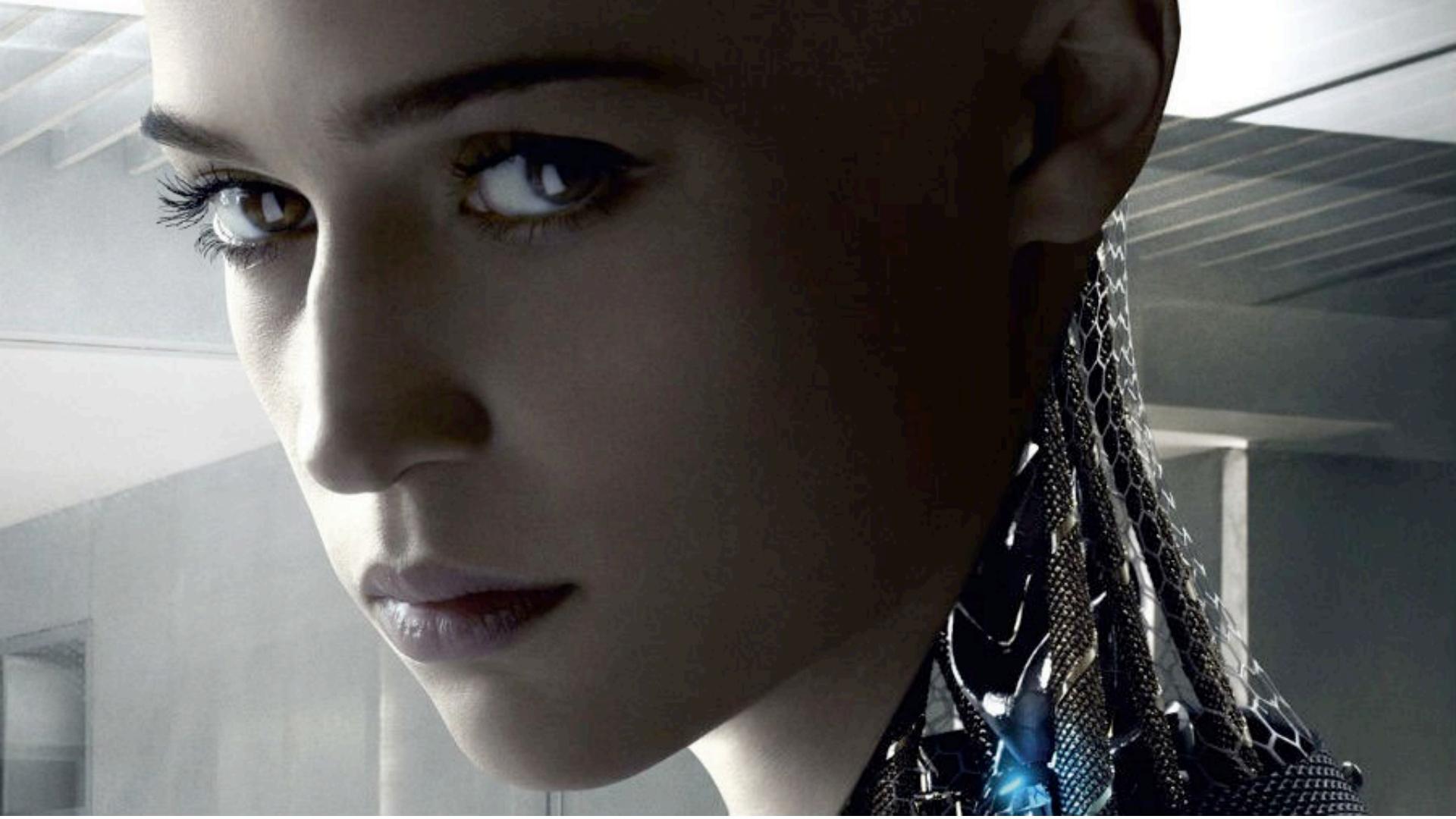
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- What is artificial intelligence?
- Past: how did the ideas in AI come about?
- Present: what is the state of the art?
- Future: will robots take over the world?



# Movie AI





YESTERDAY DR. WILL CASTER WAS ONLY HUMAN



# TRANSCENDENCE

ALCON STUDIOS PRESENTS IN ASSOCIATION WITH DMG ENTERTAINMENT A STRAIGHT UP FILMS PRODUCTION DIRECTED BY WALLY PESER. JOHNNY DEPP, MORGAN FREEMAN, "TRANSCENDENCE" REBECCA HALL, KATE MARA, CILLIAN MURPHY, COLE HAUSER AND PAUL BETTANY  
PRODUCED BY CHRISTOPHER GRANT, ANDREAS KARLOF, GEORGE L. LITTLE, DUSTY ROSENBLUM, JEFFREY L. STONE, CHRIS SEAGER, JESS HALL, JESSE RAYMOND, YOLANDA T. CORRAN, STEVEN P. WEISER, RESINCY BOLES, CHRISTOPHER NELAN, ELIZABETH THOMAS, DAVID MITCHELL, RANDI A. JOSEPHINE BRODERICK, JOSEPHINE BRODERICK, KATE CRAIN, MARISA POTOVSKY, ANNIE KATZNER, DAVID VALDES, AARON RYDER, JACK PAGEN, WRITTEN BY WALLY PESER

ALCON

entertainmentfilms.co.uk



**Stuart Russell**

Become a fan



Computer science professor at Berkeley; Co-author, 'Artificial Intelligence: a Modern Approach'

# ***Transcendence: An AI Researcher Enjoys Watching His Own Execution***

**THE BLOG** 04/19/2014 09:14 am ET | Updated Jun 19, 2014

## **Transcending Complacency on Superintelligent Machines**

By Stephen Hawking, Max Tegmark, Stuart Russell, and Frank Wilczek



# News AI

AI is the biggest risk we face as a civilisation, Elon Musk says

## Billionaire burn: Musk says Zuckerberg's understanding of AI threat 'is limited'

[HOME](#) » [FINANCE](#) » [FINANCE TOPICS](#) » [DAVOS](#)

understanding

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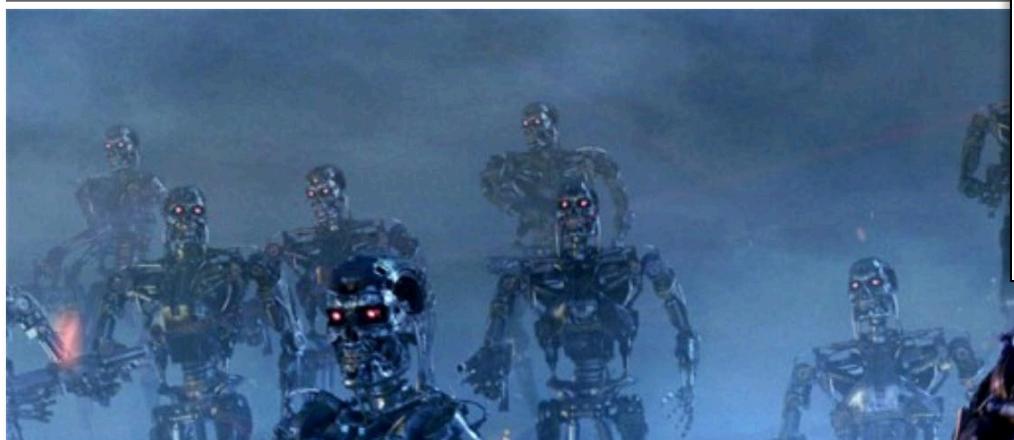
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### 'Sociopathic' robots could overrun the human race in a generation

Computers should be trained to serve humans to reduce their threat to the human race, says a leading expert on artificial intelligence



# LIVE SCIENCE

NEWS TECH HEALTH PLANET EARTH

Live Science > Tech

## Lifelike 'Sophia' Robot Granted Citizenship to Saudi Arabia

By Mindy Weisberger, Senior Writer | October 30, 2017 03:39pm ET



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# News AI

TECH • ARTIFICIAL INTELLIGENCE

## United Kingdom Plans \$1.3 Billion Intelligence Push

France to spend \$1.8 billion on compete with U.S., China

EU wants to invest £18b development

## China's Got a Huge Artificial Intelligence Plan

'Whoever leads in AI will rule the world': Putin to Russian children on Knowledge Day

Published time: 1 Sep, 2017 14:08

Edited time: 1 Sep, 2017 14:40



# News AI

## IBM's Watson Jeopardy Computer Shuts Down Humans in Final Game

Silicon prevails ir

DAILY NEWS 9 March 2016

**'I'm in shock!  
world's best**



## Blizzard will show off Google's Deepmind AI in StarCraft 2 later this week

By Andy Chalk 4 hours ago

Google and Blizzard launched the artificial intelligence project in 2016.

[f](#) [t](#) [r](#) [e](#) [m](#) | [COMMENTS](#)



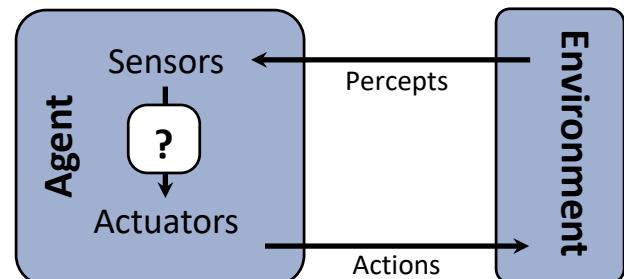
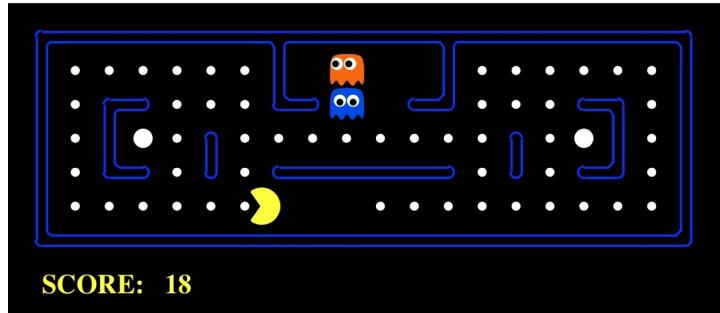
# AI as computational rationality

---

- Humans are intelligent to the extent that our actions can be expected to achieve our objectives
- Machines are intelligent to the extent that their actions can be expected to achieve their objectives
  - Control theory: minimize cost function
  - Economics: maximize expected utility
  - Operations research: maximize sum of rewards
  - Statistics: minimize loss function
  - AI: all of the above, plus logically defined goals
- AI ≈ computational rational agents

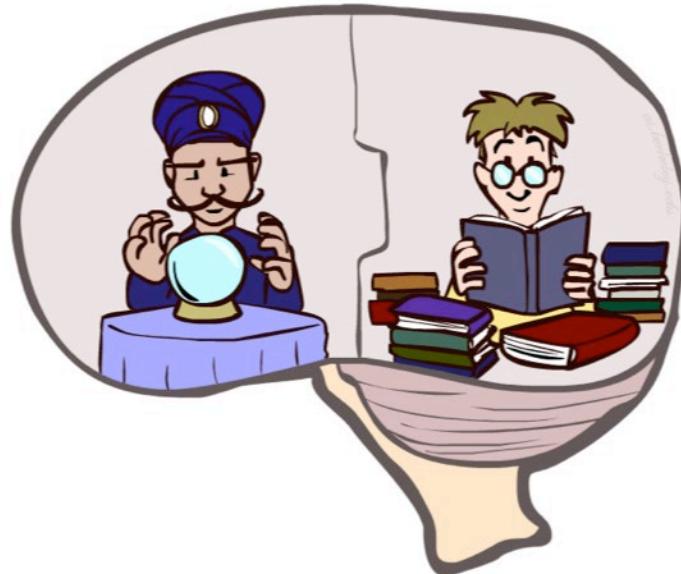
# Designing Rational Agents

- An **agent** is an entity that *perceives* and *acts*.
- A **rational agent** selects actions that maximize its (expected) **utility**.
- Characteristics of the **percepts**, **environment**, and **action space** dictate techniques for selecting rational actions
- **This course** is about:
  - General AI techniques for many problem types
  - Learning to choose and apply the technique appropriate for each problem

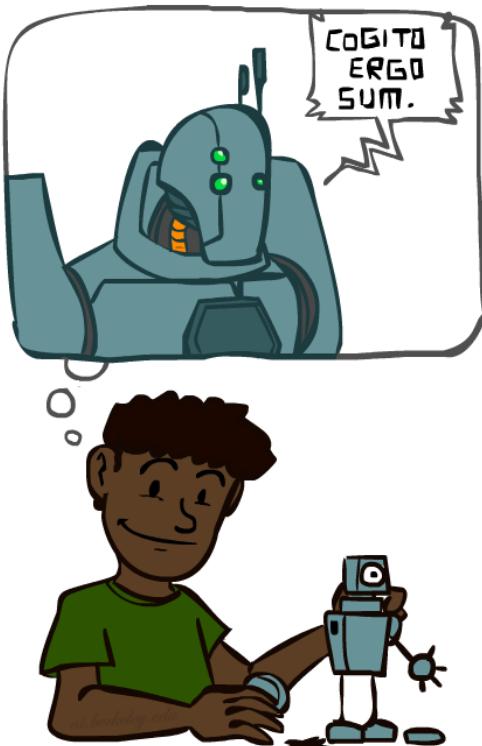


# What About the Brain?

- Brains (human minds) are very good at making rational decisions, but far from perfect; they result from accretion over evolutionary timescales
- We don't know how they work
- "Brains are to intelligence as wings are to flight"
- Lessons learned from human minds: memory, knowledge, feature learning, procedure formation, and simulation are key to decision making



# A (Short) History of AI



# A short prehistory of AI

---

- Prehistory:

- **Philosophy** from Aristotle onwards
- **Mathematics** (logic, probability, optimization)
- **Neuroscience** (neurons, adaptation)
- **Economics** (rationality, game theory)
- **Control theory** (feedback)
- **Psychology** (learning, cognitive models)
- **Linguistics** (grammars, formal representation of meaning)

- Near miss (1842):

- Babbage design for universal machine
- Lovelace: “a thinking machine” for “all subjects in the universe.”

# AI's official birth: Dartmouth, 1956



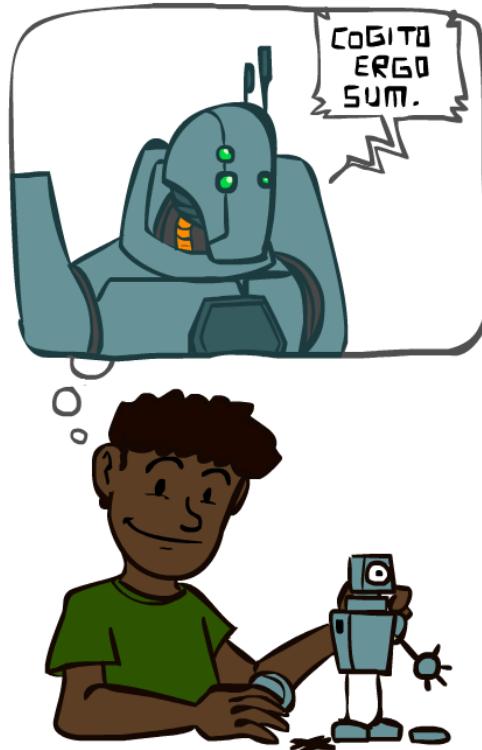
“An attempt will be made to find how to make machines use language, form abstractions and concepts, solve kinds of problems now reserved for humans, and improve themselves. ***We think that a significant advance can be made if we work on it together for a summer.***”



**John McCarthy and Claude Shannon  
Dartmouth Workshop Proposal**

# A (Short) History of AI

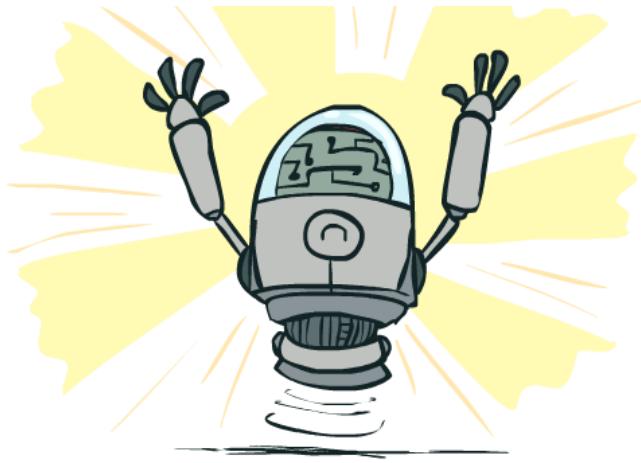
- 1940-1950: Early days
  - 1943: McCulloch & Pitts: Boolean circuit model of brain
  - 1950: Turing's "Computing Machinery and Intelligence"
- 1950—70: Excitement: Look, Ma, no hands!
  - 1950s: Early AI programs: chess, checkers program, theorem proving
  - 1956: Dartmouth meeting: "Artificial Intelligence" adopted
  - 1965: Robinson's complete algorithm for logical reasoning
- 1970—90: Knowledge-based approaches
  - 1969—79: Early development of knowledge-based systems
  - 1980—88: Expert systems industry booms
  - 1988—93: Expert systems industry busts: "AI Winter"
- 1990— 2012: Statistical approaches + subfield expertise
  - Resurgence of probability, focus on uncertainty
  - General increase in technical depth
  - Agents and learning systems... "AI Spring"?
- 2012— \_\_ : Excitement: Look, Ma, no hands again?
  - Big data, big compute, neural networks
  - Some re-unification of sub-fields
  - AI used in many industries



# What Can AI Do?

Quiz: Which of the following can be done at present?

- ✓ Play a decent game of table tennis?
- ✓ Play a decent game of Jeopardy?
- ✓ Drive safely along a curving mountain road?
- ✗ Drive safely along Telegraph Avenue?
- ✓ Buy a week's worth of groceries on the web?
- ✗ Buy a week's worth of groceries at Berkeley Bowl?
- ✗ Discover and prove a new mathematical theorem?
- ✗ Converse successfully with another person for an hour?
- ✗ Perform a surgical operation?
- ✓ Translate spoken Chinese into spoken English in real time?
- ✗ Fold the laundry and put away the dishes?
- ✗ Write an intentionally funny story?



# Unintentionally Funny Stories



Janelle Shane  
@JanelleCShane

Follow

Tried retraining the neural net on just "what do you get when you cross a X with a X?" jokes. Results did not improve. And for some reason, bungees are its favorite thing.

What do you get when you cross a dog and a vampire? A bungee

What do you get when you cross a gorilla and a bull? A spider.

What do you get when you cross a cow with a rhino? A bungee with a dog.

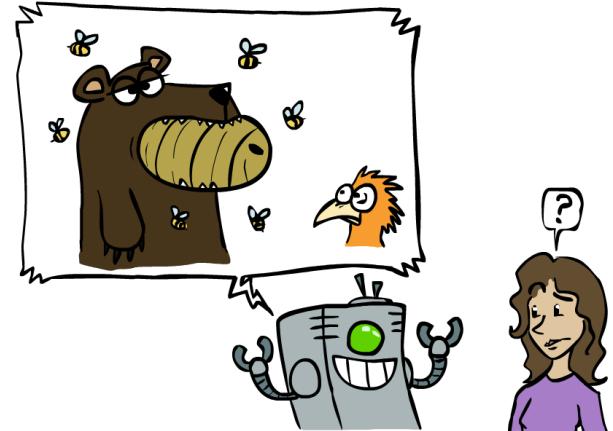
What do you get when you cross a mountain and a bungee and a cow? A cow with a rhinocero.

What do you get when you cross a street and a bungee with a cow? A bungee and a pig with a cow.

What do you get when you cross a street and a cow? A bungee with a bungee and a rhino.

What do you get when you cross a pig with a cow with a party? Because the engineers with a dog.

friend  
I him  
ed to  
  
the  
sitting.  
owned.



nd a vain crow. One day the cheese in his mouth. He noticed he became hungry, and swallowed The End.

[Shank, Tale-Spin System, 1984]

# Natural Language

- Speech technologies (e.g. Siri)
  - Automatic speech recognition (ASR)
  - Text-to-speech synthesis (TTS)
  - Dialog systems
- Language processing technologies
  - Question answering
  - Machine translation

**"Il est impossible aux journalistes de rentrer dans les régions tibétaines"**

Bruno Philip, correspondant du "Monde" en Chine, estime que les journalistes de l'AFP qui ont été expulsés de la province tibétaine du Qinghai "n'étaient pas dans l'ilégalité".

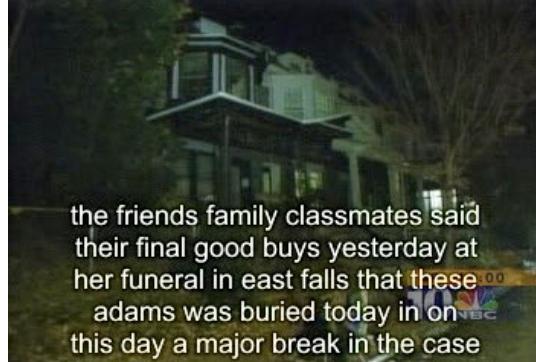
**Les faits** Le dalaï-lama dénonce l'"enfer" imposé au Tibet depuis sa fuite, en 1959  
**Vidéo** Anniversaire de la rébellion



**"It is impossible for journalists to enter Tibetan areas"**

Philip Bruno, correspondent for "World" in China, said that journalists of the AFP who have been deported from the Tibetan province of Qinghai "were not illegal."

**Facts** The Dalai Lama denounces the "hell" imposed since he fled Tibet in 1959  
**Video** Anniversary of the Tibetan rebellion: China on guard



**\$77,147**

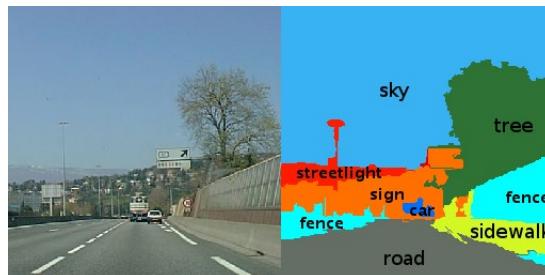
- Web search
- Text classification, spam filtering, etc...

# Vision (Perception)

## Face detection and recognition

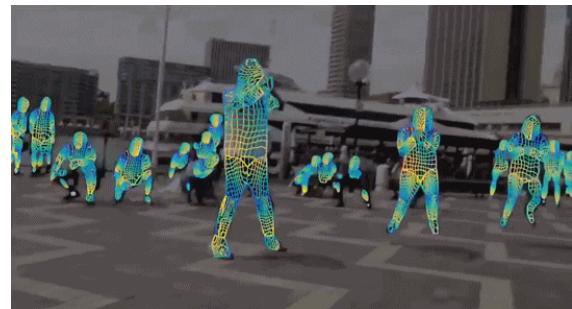


## Semantic Scene Segmentation



[Caesar et al, ECCV 2017]

## 3-D Understanding



[DensePose]

# Robotics

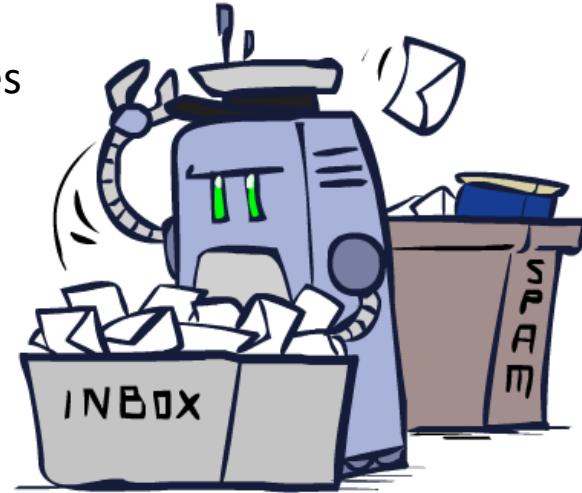
- Robotics
  - Part mech. eng.
  - Part AI
  - Reality much harder than simulations!
- In this class:
  - We ignore mechanics
  - Methods for planning
  - Methods for control



Images from UC Berkeley, Boston Dynamics, RoboCup, Google

# AI everywhere...

- Search engines
  - Route planning, e.g. maps, traffic
  - Logistics, e.g. packages, inventory, airlines
  - Medical diagnosis, machine diagnosis
  - Automated help desks
  - Spam / fraud detection
  - Smarter devices, e.g. cameras
  - Product recommendations
  - Assistants, smart homes
- ... Lots more!



# Future

---

- We are doing AI...
  - To create intelligent systems
    - The more intelligent, the better
  - To gain a better understanding of human intelligence
  - To magnify those benefits that flow from it
    - E.g., net present value of human-level AI  $\geq \$13,500T$
    - Might help us avoid war and ecological catastrophes, achieve immortality and expand throughout the universe
- What if we succeed?



Post-Examiner

# Artificial Intelligence could spell the end of the human race

BY PAUL CROKE · JUNE 9, 2015 · NO COMMENTS



# What's bad about better AI?

---

- AI that is incredibly good at achieving something other than what we really want
- AI, economics, statistics, operations research, control theory all assume utility to be *exogenously specified*

# Value misalignment

- E.g., “Calculate pi”, “Make paper clips”, “Cure cancer”
- Cf. Sorcerer’s Apprentice, King Midas, genie’s three wishes

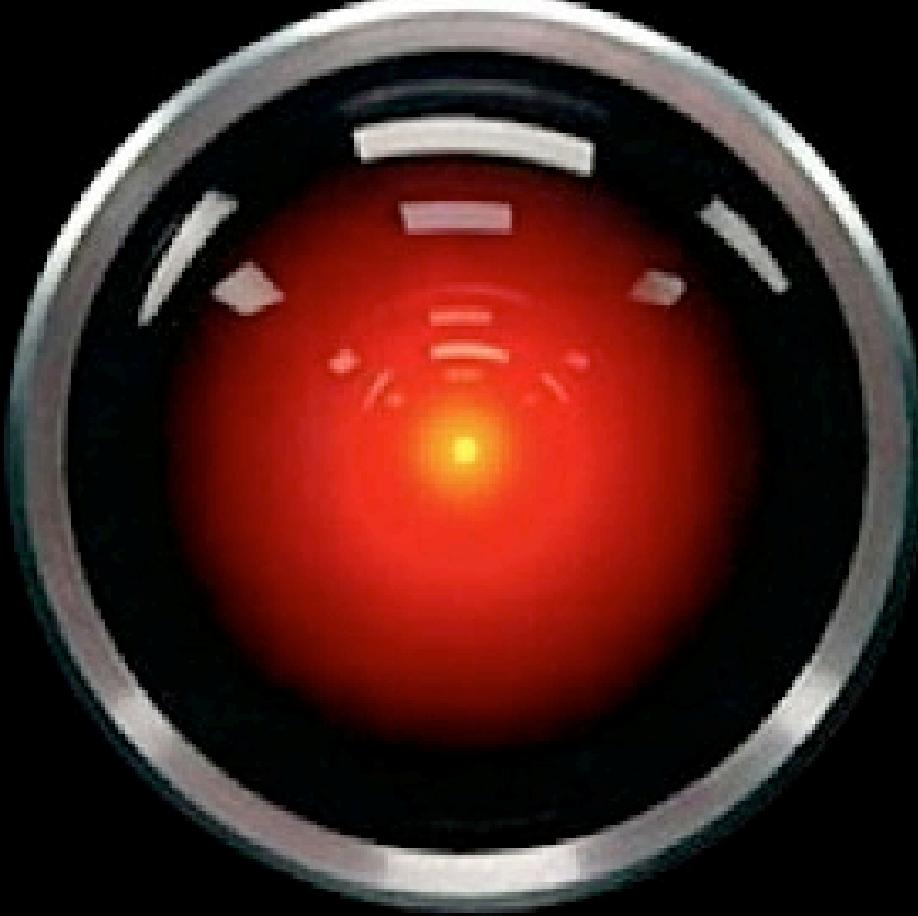
***We had better be quite sure that the purpose put into  
the machine is the purpose which we really desire***

Norbert Wiener, 1960

# Instrumental goals

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- For *any primary goal*, the odds of success are improved by
  - 1) Maintaining one's own existence
  - 2) Acquiring more resources
- With value misalignment, these lead to obvious problems for humanity



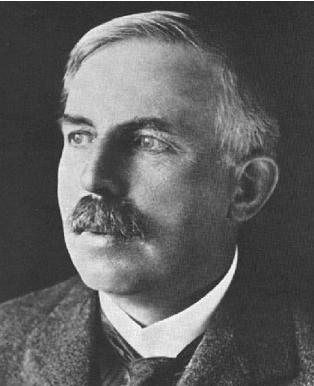
I'm sorry, Dave, I'm afraid I can't do that

# Towards human-level AI

---

- Still missing:
  - Real understanding of language
  - Integration of learning with knowledge
  - Long-range thinking at multiple levels of abstraction
  - Cumulative discovery of concepts and theories
- Date unpredictable

# Unpredictability



Sept 11, 1933: Lord Rutherford addressed BAAS:  
*“Anyone who looks for a source of power in the transformation of the atoms is talking moonshine.”*



Sept 12, 1933: Leo Szilard invented neutron-induced nuclear chain reaction  
*“We switched everything off and went home. That night, there was very little doubt in my mind that the world was headed for grief.”*

# AI as computational rationality

---

- Humans are intelligent to the extent that our actions can be expected to achieve our objectives
- Machines are intelligent to the extent that their actions can be expected to achieve their objectives
  - Control theory: minimize cost function
  - Economics: maximize expected utility
  - Operations research: maximize sum of rewards
  - Statistics: minimize loss function
  - AI: all of the above, plus logically defined goals
- We don't want machines that are intelligent in this sense
- Machines are beneficial to the extent that their actions can be expected to achieve our objectives
- We need machines to be provably beneficial

# Provably beneficial AI

---

1. The machine's only objective is to maximize the realization of human preferences
2. The robot is initially uncertain about what those preferences are
3. Human behavior provides evidence about human preferences

The standard view of AI is a special case, where the human can exactly and correctly program the objective into the machine

# So, if all this matters....

---

- Can we affect the future of AI?
  - Can we reap the benefits of superintelligent machines and avoid the risks?
- ***The essential task of our age.***

Nick Bostrom, Professor of Philosophy, Oxford University.