

National Institute for Occupational Safety and Health



# Occupational Robotics: An Emerging Field

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# Overview

- Human and robot capabilities
- Theory of the robot
- Occupational robotics
  - Types and Uses
  - Benefits and Risks
- Ethics, Economics, and Job Loss
- Occupational Data Analytics



# Human Capabilities

- Humans have three major capabilities:
  - Physical
  - Cognitive
  - Emotional
- Machines that can perform any of these three human capabilities are commonly known as “robots.”
  - Robot derives from Czech word “robota,” meaning forced labor
  - *R.U.R.* (Rossum’s Universal Robots) is a 1920 play by Karel Čapek



# The Theory of the Robot

- Model we use to describe how a robot works is as follows:
  - The robot **senses**, the robot **thinks**, and the robot **acts**...
- How?
  - **Sensing** is done through interpretation of data from environmental sensors.
  - **Thinking** is done through the use of machine learning and deep learning—both forms of artificial intelligence.
  - **Action** is done through *effectors* for robots operating *in physical space*, or through data outputs from intelligent assets *operating in virtual space*.



# Sensing



# Sensor Technology Is Expanding

- **Enabling capabilities increasing exponentially**
  - Improvements in measurement science
    - Powered by high-speed and low-cost electronic circuits, novel signal processing methods, and advanced manufacturing technologies
  - Readily available geographic and spatial information locators
  - Miniaturization of sensing instruments
  - Promising technical solutions increasing the quality, reliability, and economic efficiency of technical products.
- **Types of Sensors**
  - Placeables
    - Air, water environment
    - In-vehicle monitoring
  - Wearables
    - Clothing
    - Hard hats
  - Implantables
    - Ingested and transcutaneous

# Internet of Things (IoT)

- **Sensors are at the heart of the Industrial Internet**
  - Deploying sensors, the entire workplace and everything and everyone in it can become data inputs.
  - Workplace sensors become intelligent assets operating in physical and virtual space.
- **Sensor data can be easily uploaded to the cloud**
  - Sensor connectivity
  - Sensor upgradability
- **Cloud-based sensor data inputs create field of occupational data analytics**
  - Placing sensors, interpreting data inputs and developing sensor-derived controls
    - Occupational data scientist
  - Maintaining sensors
    - Technician



Marty Ellis, of Inman Mills in South Carolina, checks a machine manufacturing fabric developed through AFFOA.



# Wearable Sensors: Functional Fabrics

- **DEFENSE**  
Functional fabrics will lighten soldiers' gear, enhance situational awareness on the battlefield, and decrease fratricide. High value-added products based on advanced woven & nonwoven technologies.
- **TRANSPORTATION**  
Join the wave of intelligent transportation systems with functional fabrics.
- **MANUFACTURING MACHINERY**  
Producing new fibers and textiles will require next-generation equipment and machinery.
- **ARCHITECTURAL & INTERIOR TEXTILES**  
'This old house' can now monitor, act, and re-act all by itself.
- **APPAREL**  
Smart clothes that can cool, change color, adjust size, last longer, mask or transmit odors, take photos, and so much more.
- **SOFTWARE & DATABASES**  
IT combined with functional fabrics enables highly insightful and useful information.
- **MEDICAL TEXTILES & SCANNERS**  
Clothing that can detect impending medical events and save lives.
- **RAW MATERIALS**  
Manufacturers of advanced functional materials for fibers and fabrics.
- **CONSUMER ELECTRONICS**  
Enabling the "internet of wearables" transforming apparel into consumer electronics.

# Thinking



# ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



# MACHINE LEARNING

Machine learning begins to flourish.



# DEEP LEARNING

Deep learning breakthroughs drive AI boom.



# Intelligence

Type	Simulation Potential	Human Tools	Description
<b>Visual-Spatial</b>	Moderate	Charts, graphs, 3-D modeling, video	Mobile robots require this capacity, but is proving difficult to simulate
<b>Kinesthetic</b>	Moderate	Specialized equipment—da Vinci surgical device	Differentiate between human augmentation and truly independent moves
<b>Creative</b>	None	New patterns of thought, inventions, innovations	For AI to create, it would have to possess self-awareness
<b>Interpersonal</b>	Low	Any form of communication	Computers can answer questions because of key word inputs
<b>Intrapersonal</b>	None	Privacy, time, diaries, books	Human kind of intelligence only
<b>Linguistic</b>	Low	Spoken words, books, games, voice recorders	Computers don't separate written and spoken linguistic like the human brain
<b>Logical/Mathematical</b>	High	Logic games, mysteries, and brain teasers	When computer beats human at a game—only form of intelligence computer has

# *Artificial* Intelligence

- **Central idea**

- You can represent reality by using a mathematical function that an algorithm (stepwise procedure) does not know in advance, but which it can guess after seeing some data, recursively accuracy of the probability guess.

- **Origin**

- At a 1956 Dartmouth College workshop computer scientists predicted that machines that could reason as well as humans would require, at most, a generation to come about. We think of this as “General AI.”
- They were wrong and several AI winters followed.
- And then in 2010s, AI exploded because of the wide availability of (1) **GPUs** that make parallel processing ever faster, cheaper, and more powerful; (2) practically infinite **storage capacity**; and (3) a flood of data (*big data*).
- **How does artificial intelligence come about?**



# Machine Learning:

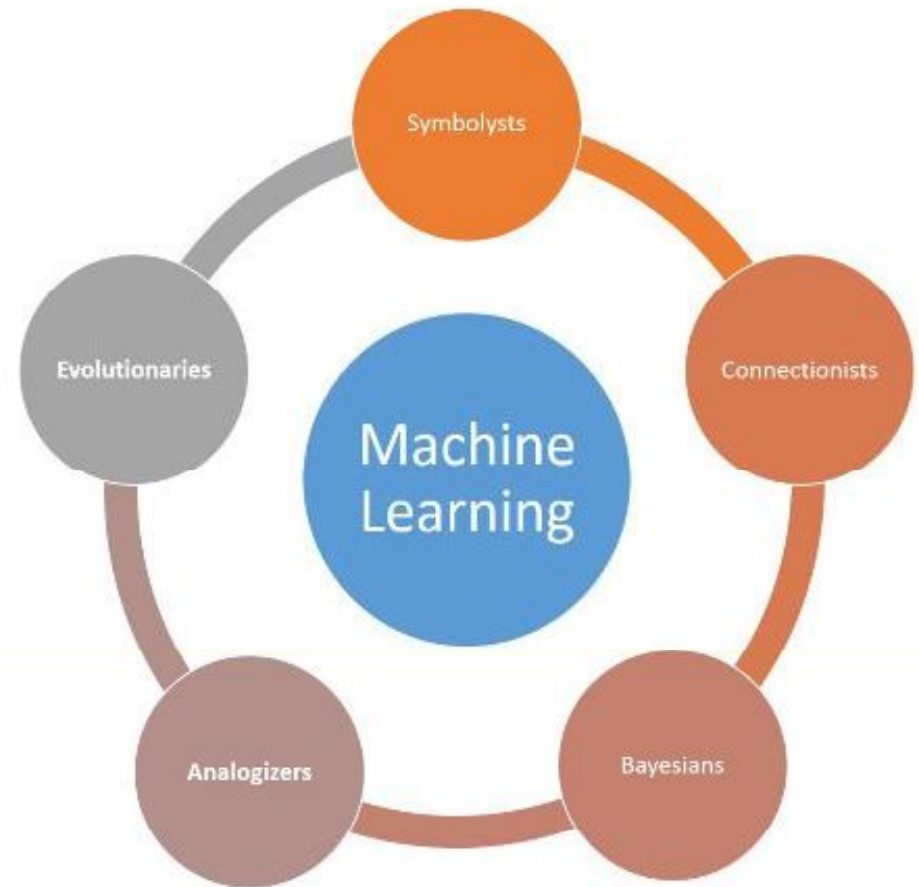
## Approach to Achieve Artificial Intelligence

- Machine learning at its most basic is the practice of using algorithms to parse data, learn from it, and then make a determination or prediction about something in the world.
- Machine is “trained” using large amounts of data and algorithms that give it ability to learn how to perform the task more and more accurately.
- Machine learning came from original AI thinkers and includes 5 major “schools of algorithmic approaches.”



# Machine Learning

- **Symbolists\***
  - Rules from data, e.g., decision trees
- **Connectionists\***
  - Reproduce brain's functions using silicon instead of neurons using backpropagation of errors.
- **Evolutionists**
  - Uses recursion to generate algorithms that evolve.
- **Bayesians\***
  - Learning occurs as continuous updating of previous beliefs.
- **Analogizers**
  - Uses similarity to determine best solution to a problem.



# Recent Milestones: Narrow AI

## ■ 2011

- AI researchers around the world discovered NVIDIA GPUs. The Google Brain project had learned to recognize cats and people by watching movies on YouTube. But it required 2,000 CPUs in servers powered and cooled in one of Google's giant data centers.

## ■ 2012

- Alex Krizhevsky of the University of Toronto won the *ImageNet* computer image recognition competition. He beat — by a huge margin — handcrafted software written by computer vision experts. Krizhevsky wrote no computer vision code. Rather, their computer learned to recognize images by itself. They designed a network and trained it with a million example images that required trillions of math operations on NVIDIA GPUs.

## ■ 2015

- Using deep learning, *Google* and *Microsoft* both beat the best human score in the ImageNet challenge. Shortly thereafter, *Microsoft* announced a Deep Neural Network that achieved IQ test scores at the college post-graduate level. Then *Baidu* announced that a deep learning system called Deep Speech 2 had learned both English and Mandarin with a single algorithm.





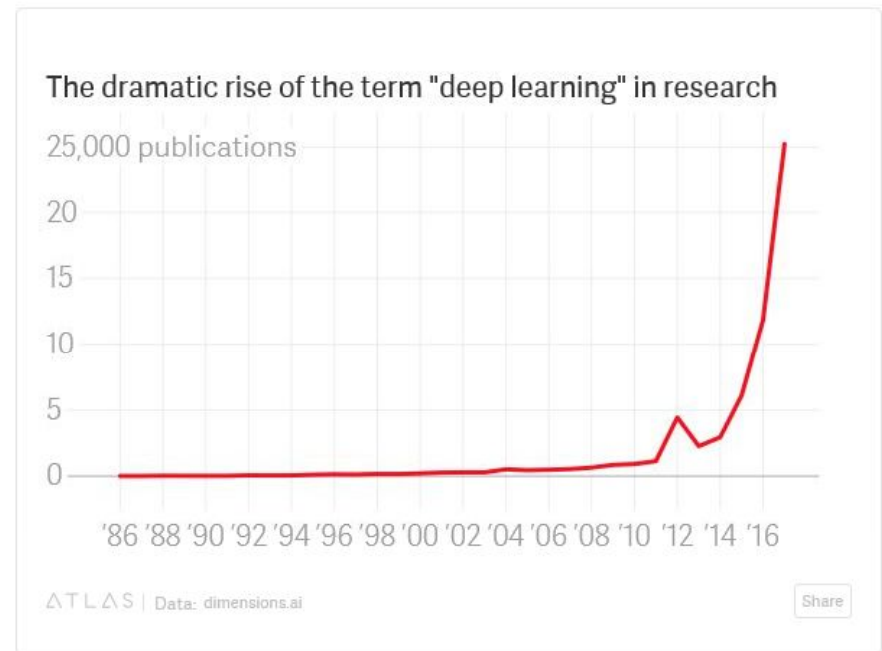
# Machine Learning: Achievements

- Machine-learning technology powers many aspects of modern society: from web searches to content filtering on social networks to recommendations on e-commerce websites, and it is increasingly present in consumer products such as cameras and smartphones.
- Machine-learning systems are used to identify objects in images, transcribe speech into text, match news items, posts or products with users' interests, and select relevant results of search.
- Increasingly, these applications make use of a class of ML techniques called **deep learning**.



# Deep Learning--Connectionists

- Technique for building an algorithm that learns from data. It is based very loosely on how we think the human brain works.
  - First, a collection of software “neurons” are created and connected together, allowing them to send messages to each other.
  - Next, the *neural network* is asked to solve a problem, which it attempts to do over and over, each time strengthening the connections that lead to success and diminishing those that lead to failure.



- Open source framework at <http://playground.tensorflow.org/>



Epoch  
000,000

Learning rate  
0.03

Activation  
Tanh

Regularization  
None

Regularization rate  
0

Problem type  
Classification

### DATA

Which dataset do you want to use?



Ratio of training to test data: 50%



Noise: 0



Batch size: 10



REGENERATE

### FEATURES

Which properties do you want to feed in?



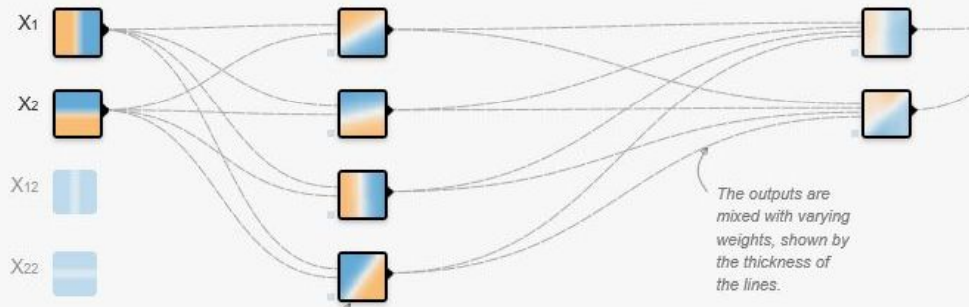
+ - 2 HIDDEN LAYERS

+ -

4 neurons

+ -

2 neurons

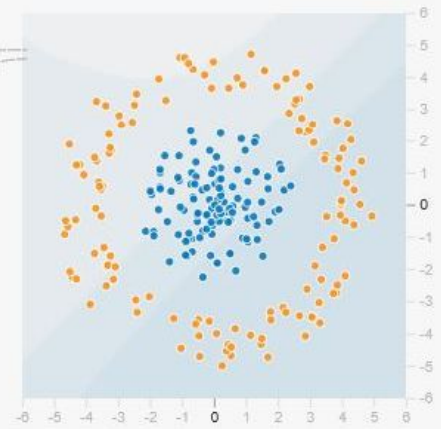


This is the output from one neuron. Hover to see it larger.

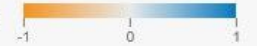
The outputs are mixed with varying weights, shown by the thickness of the lines.

### OUTPUT

Test loss 0.501  
Training loss 0.514

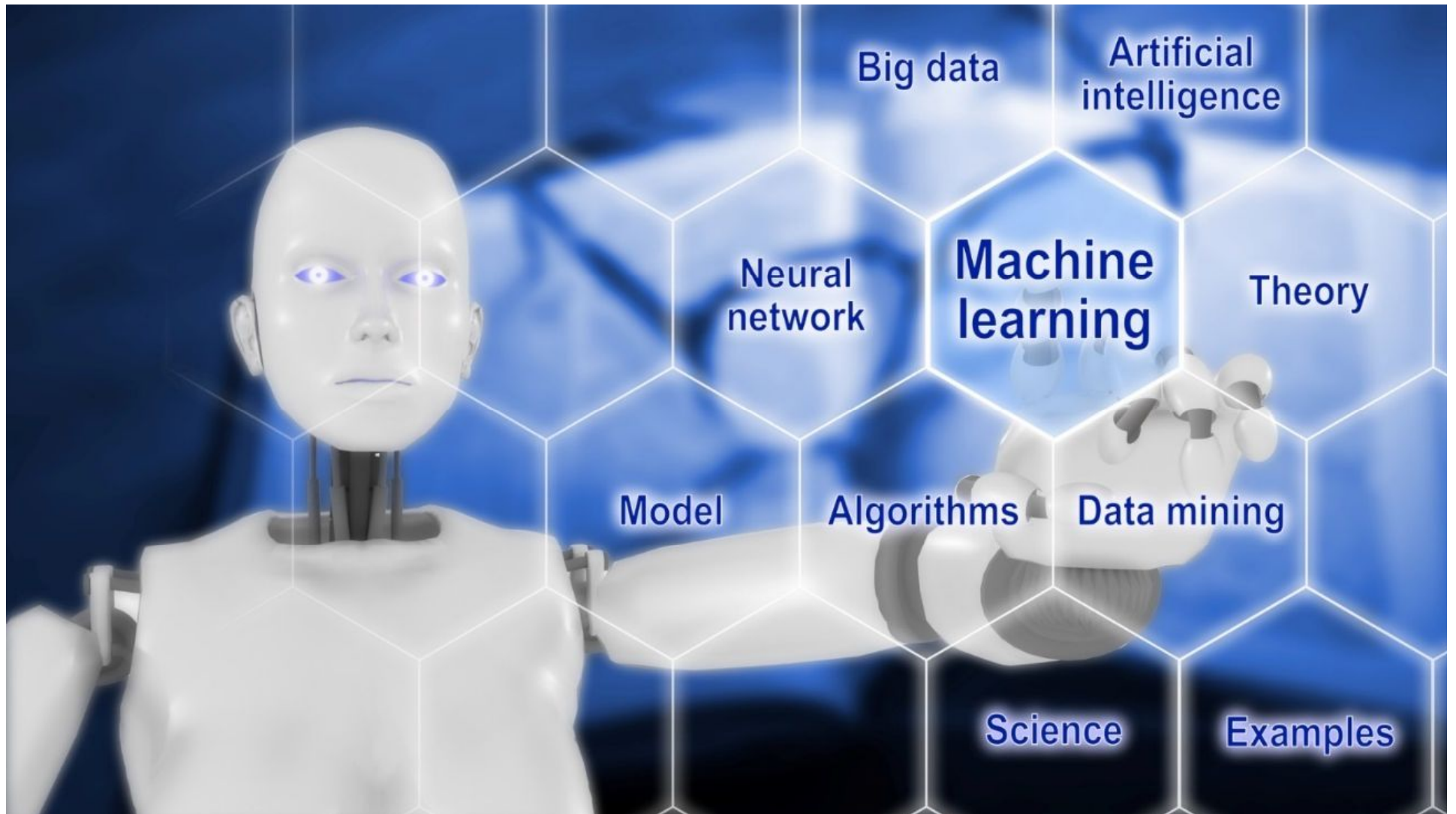


Colors shows data, neuron and weight values.



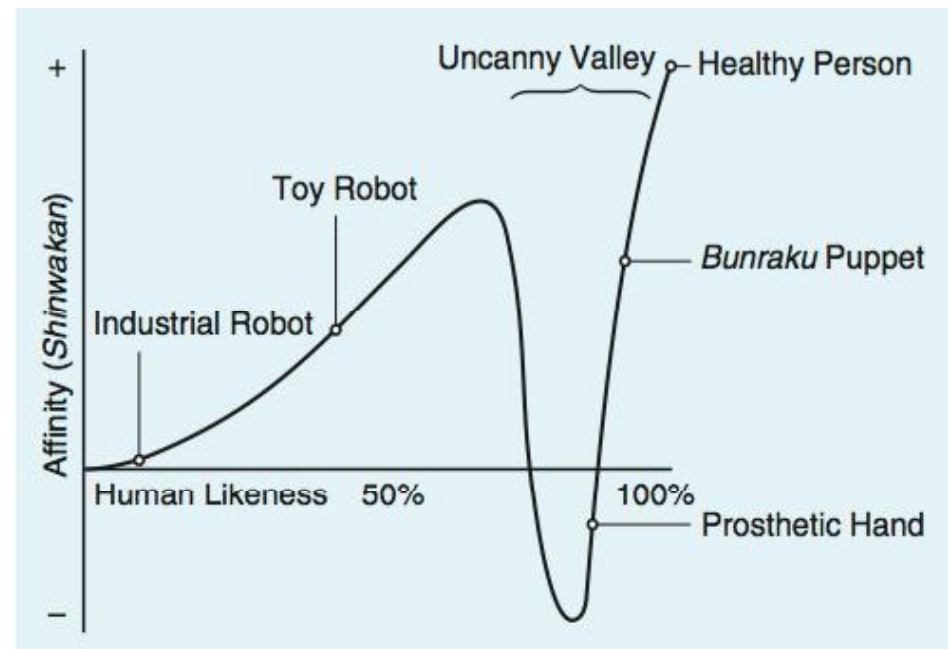
Show test data

Discretize output



# Creating a Humanoid Robot: Uncanny Valley

- If we need humanoid robots because we want them to assist humans, we must also consider their level of realism to allow users to accept help.
- Even robots with little human resemblance generate attachment.
- U.S. soldiers report feeling loss with their small tactical robots for explosives detection and handling are destroyed in action.
- <https://www.technologyreview.com/s/609074/how-we-feel-about-robots-that-feel/>



**Acting**



# Occupational Robotics

- New field of practice for safety and health practitioners
- Robotic capabilities:
  - In physical space
    - Manipulators (robot arms)
    - Mobile
      - Flying robots or drones
      - Robotic-controlled truck platoons
      - Self-driving cars
    - Humanoid
  - In virtual space
    - Intelligent assets
- Risky interactions between human and robot workers?



# Organizational Profile

- **Superior Performance**

- Robot workers are simply better than people at precise and repetitive tasks
- With perfect memories, internet connectivity, and high-powered processors for data analysis, robots can also provide informational support beyond human capabilities.
  - Keep perfect record of project progress
  - Provide real-time scheduling and decision support
  - Have perfect recall
- Can complete dangerous tasks
  - Venturing into dangerous environments
  - Completing hazardous activities

- **Managerial Cognitive Capabilities**

- Remind a team of deadlines, procedures, and progress

- **Operational Cost Reduction**

- Human employees cost money—30 to 40% more than salary in benefits
- Costs barely \$8 an hour to use a robot for spot welding in the auto industry, compared to \$25 for a worker—and the cost savings gap is only going to widen.



# Commercial Types of Robots

- **Traditional Industrial robots**
  - Fixed in location
  - Humans and robots are separated
- **Collaborative robots**
  - Designed to work together with humans
- **Service robots**
  - Autonomous ground vehicles
  - Unmanned aerial vehicles
  - Household service robots
- **Social Robots**
  - Detect and express human emotion
  - Act as companions
- **Wearable Robots**
  - Exoskeletons



# Traditional Industrial Robots

- Decades of safety experience
- Used since the 1970s in auto manufacturing industry
- Safety measures that keep human workers *separated* from robot workers



# Industrial Robots: Safety Record

- Estimated 61 robot-related deaths, 1992-2015, CFOI\*
  - Identified using keywords
- < 1% of more than 190,000 workplace injury deaths during that timeframe\*\*



\*Unpublished analyses by NIOSH. Through a MOU with BLS, NIOSH receives Census of Fatal Occupational Injury (CFOI) research files with restricted access requirements. Views expressed herein to not necessarily reflect the views of BLS.

\*\* Data from publicly available CFOI data.

# Collaborative Robots or Cobots

ROBOTICS

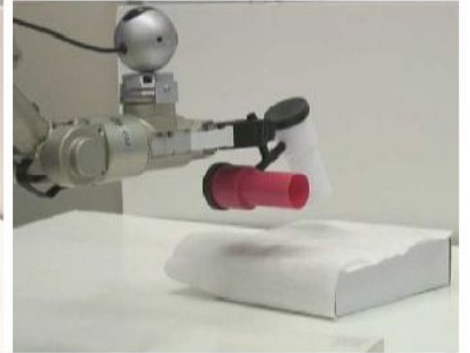
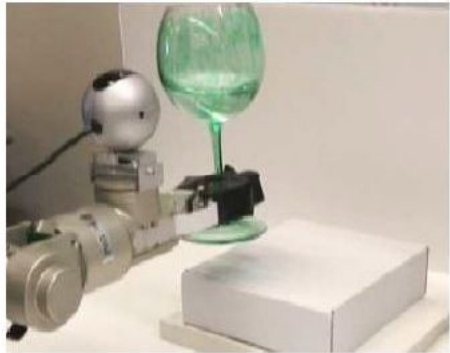
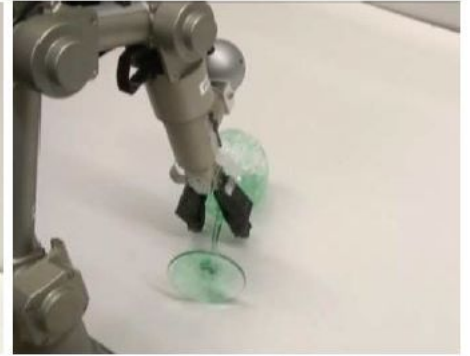
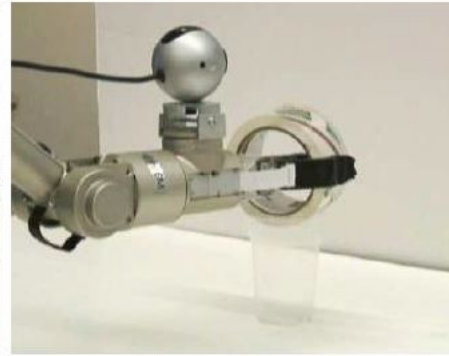
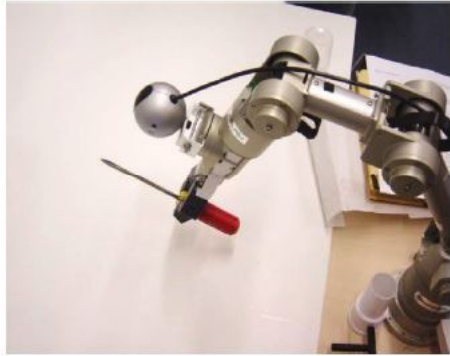


# Collaborative Robots: Risk and Challenge

- Designed to work alongside human workers.
- Controlled by human workers, by an algorithm, or by both.
- Equipped with sensors designed to stop robot when contact with human worker occurs.
- Grasping a previously unknown object, one for which a 3-D model is not available, is a challenging problem.
  - <https://berkeleyautomation.github.io/dex-net/>



Filling a bin with objects for the Dex-Net 4.0 robot grasping research. Credit: Adriel Olmos, UC Berkeley



# Service Robots: Large Vehicles

- Service robots used by Rio Tinto in Pilbara, Western Australia
  - No coffee breaks, fatigue and driver changeovers.
  - Stops only once a day for refueling.
- Engineers at Rio's operations center in Perth (2 hours flight away) remotely control trucks.
- Workforce at the mine is already about one-third lower as a result of automation.
- Autonomy enables drilling to run for almost a third longer on average than with manned rigs, and to churn through 10% more meters/hour.



# Service Robots: Truck Platoons

- **Safety**

- With the following trucks braking immediately, with zero reaction time, platooning can improve traffic **safety**.

- **Cost**

- Platooning is also a **cost-saver** as the trucks drive close together at a constant speed. This means lower fuel consumption and less CO2 emissions.

- **Efficiency**

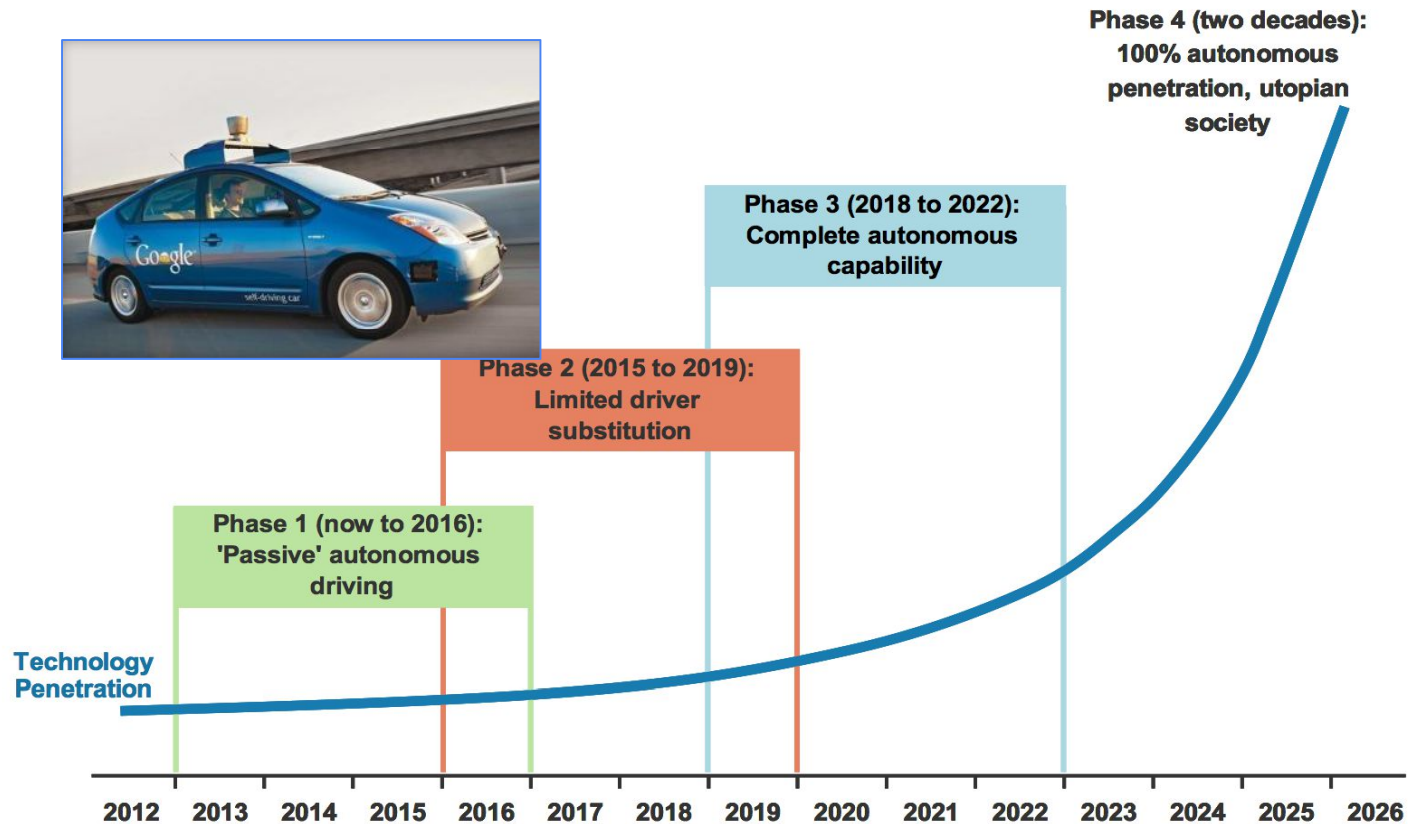
- Platooning **efficiently** boosts traffic flows thereby reducing tail-backs. Meanwhile the short distance between vehicles means less space taken up on the road.





# Service Robots: Self-Driving Cars

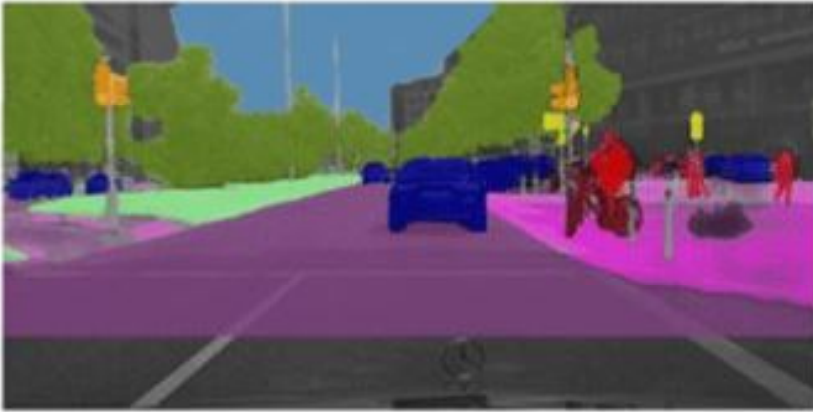
Timeline for Adoption



Source: Company data, Morgan Stanley Research

# Self-Driving Car Challenge: Computer Vision

- You can't write software that anticipates every possible scenario a self-driving car might encounter. That's the value of deep learning; it can learn, adapt, and improve. Science is building an end-to-end deep learning platform called [NVIDIA DRIVE PX](#) for self-driving cars — from the training system to the in-car AI computer.



*Daimler was able to bring "the vehicle's environment perception a significant step closer to human performance and exceed the performance of classic computer vision" with NVIDIA DriveNet.*



*Using a dataset from our partner Audi, NVIDIA engineers rapidly trained NVIDIA DriveNet to detect vehicles in an extremely difficult environment — snow.*

# Service Robots: UAVs



**Military**



**Recreational**



**Public Safety**



**Commercial**

# UAVs Uses in Construction



**Monitoring**



**Inspection**



**Maintenance**



**Hazardous Applications**

# Sources of Risk from UAVs

- **Engineering**
  - Errors in the drone’s mechanics (e.g., loose connections across parts, faulty electronics and sensors).
- **Human**
  - Errors in programming, interfacing peripheral equipment, and connecting input/output sensors resulting in unpredicted movement or action by the drone;
  - Errors in judgment resulting from “over-attributing” to autonomous robots more human-like qualities and capabilities;
  - Errors in remote operating.
- **Environmental**
  - Unstable flying conditions, extreme temperature, poor sensing in difficult weather or lightning conditions leading to incorrect response

# Service Robots: Ground Robots

- Automated Ground Robots
  - Currently operate in less controlled environments
    - May include human workers and manned vehicles
    - Agriculture and mining
    - Public roads and highways?



# Newer Service Robots

- Move alongside, and in shared space, with human workers



# Service Robot: 'Little Sunfish'

- When a tsunami devastated parts of Japan's coastline in 2011, killing more than 18,000 people, it also hit the Fukushima nuclear power plant, triggering the most serious nuclear accident since Chernobyl.
- Parts of the damaged reactors are still highly contaminated with radiation and robotics are playing a crucial part in the clean-up.





# Service Robots—Some Not Ready Yet

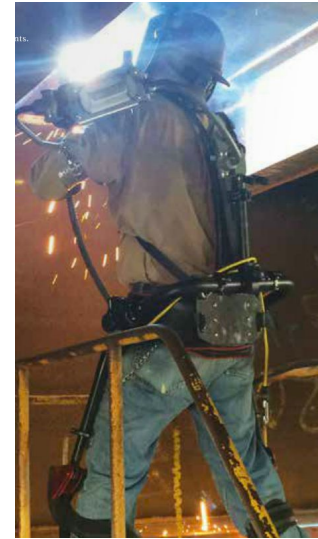
MATT SIMON SCIENCE 12.06.17 05:00 PM

## SAN FRANCISCO JUST PUT THE BRAKES ON DELIVERY ROBOTS



WIRED

# Making Human Beings More Capable



# Exoskeleton Robotics

- Mobile with the human and reduces mechanical stress on wearer
  - Rehabilitation for amputees
  - Robotic-assisted surgery (da Vinci)
  - Amplifies or transforms worker or warfighter movements
    - March or run longer with less fatigue
    - Increase lifting capacity
- Industrial market projected to grow 229% per year between 2016 and 2021
  - Suit X, U.S. Bionics
  - Winter Green Research, Inc. (2015). Wearable Robots, Exoskeletons: Market Shares, Market Strategies, and Market Forecasts, 2015 to 2021.  
<https://www.marketresearchreports.biz/reports/716060/wearable-robots-industrial-exoskeletons-shares-market-research-reports.pdf>



# Exoskeleton Challenges

- Make power source light enough to work at human scale.
- In warehouses, a forklift truck typically weighs 1.6 to 2 times the intended weight to be carried.
  - For a 150 pound human worker intending to carry 200 additional pounds, that ratio would put the human's exoskeleton in the 650-pound range, unloaded, so that a fully loaded package would weigh about 1,000 pounds.
- Lowering the battery weight is the quickest way to shrink the weight of the total assembly—a great deal of battery power would be expended in simply carrying the battery and a frame sufficiently robust to support the battery.
- Finally, training a human to leave part of the task to a machine, and not to overthink the exoskeleton relationship will be a musculoskeletal safety challenge.

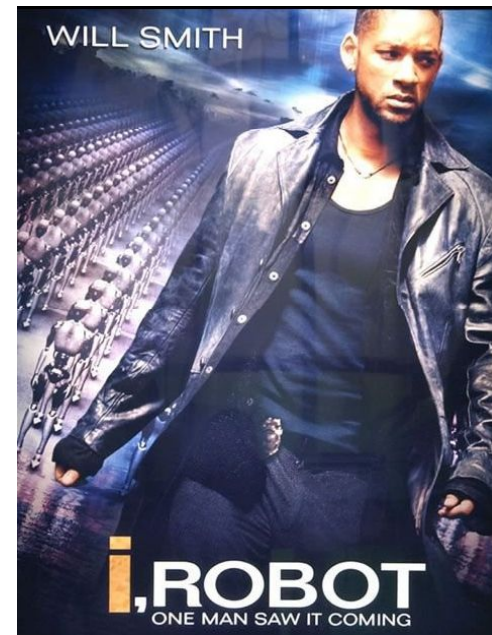


# Robot Ethics



# Robot Ethics: The Trolley Problem

- **Two cars sinking in the water**
  - Detective Del Spooner (Will Smith)
  - Young girl, Sarah
- **Robot could save only one of them, Spooner yells “Save the girl!”**
  - Probability of survival for Spooner was 45%
  - Probability of survival for Sarah was 11%
- **Robot saved Spooner; girl drowned.**
  - Fleetwood, J. Public Health, Ethics, and Autonomous Vehicles. *Am J Pub Health*. 2017; 107(4): 532-537

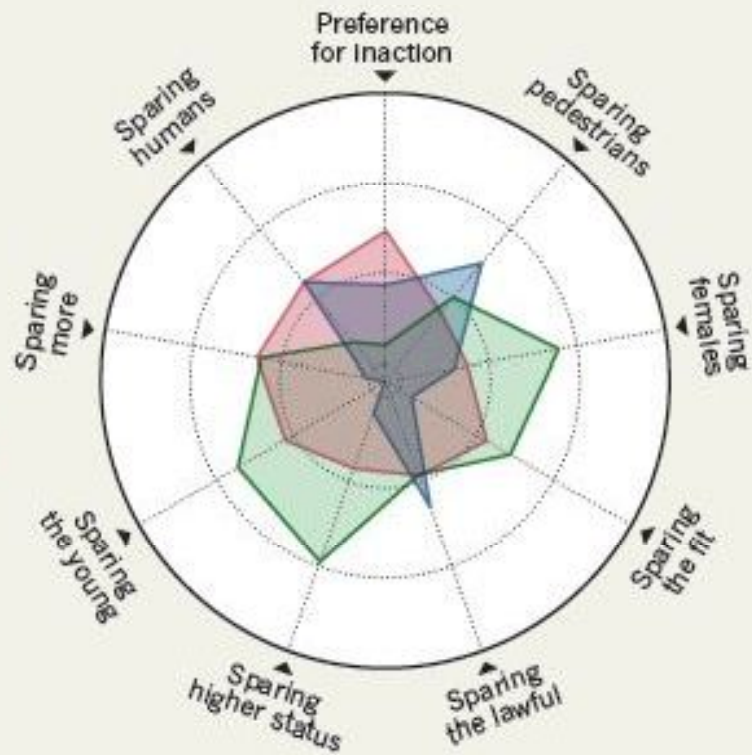


## MORAL COMPASS

A survey of 2.3 million people worldwide reveals variations in the moral principles that guide drivers' decisions. Respondents were presented with 13 scenarios, in which a collision that killed some combination of passengers and pedestrians was unavoidable, and asked to decide who they would spare. Scientists used these data to group countries and territories into three groups based on their moral attitudes.



Western Eastern Southern



## Moral Machine - Human Perspectives on Machine Ethics



Welcome to the Moral Machine! A platform for gathering a human perspective on moral decisions made by machine intelligence, such as self-driving cars.

We show you moral dilemmas, where a driverless car must choose the lesser of two evils, such as killing two passengers or five pedestrians. As an outside observer, you **judge** which outcome you think is more acceptable. You can then see how your responses compare with those of other people.

If you're feeling creative, you can also **design** your own scenarios, for you and other users to **browse**, share, and discuss.

[Start Judging](#)[Browse Scenarios](#)[View Instructions](#)



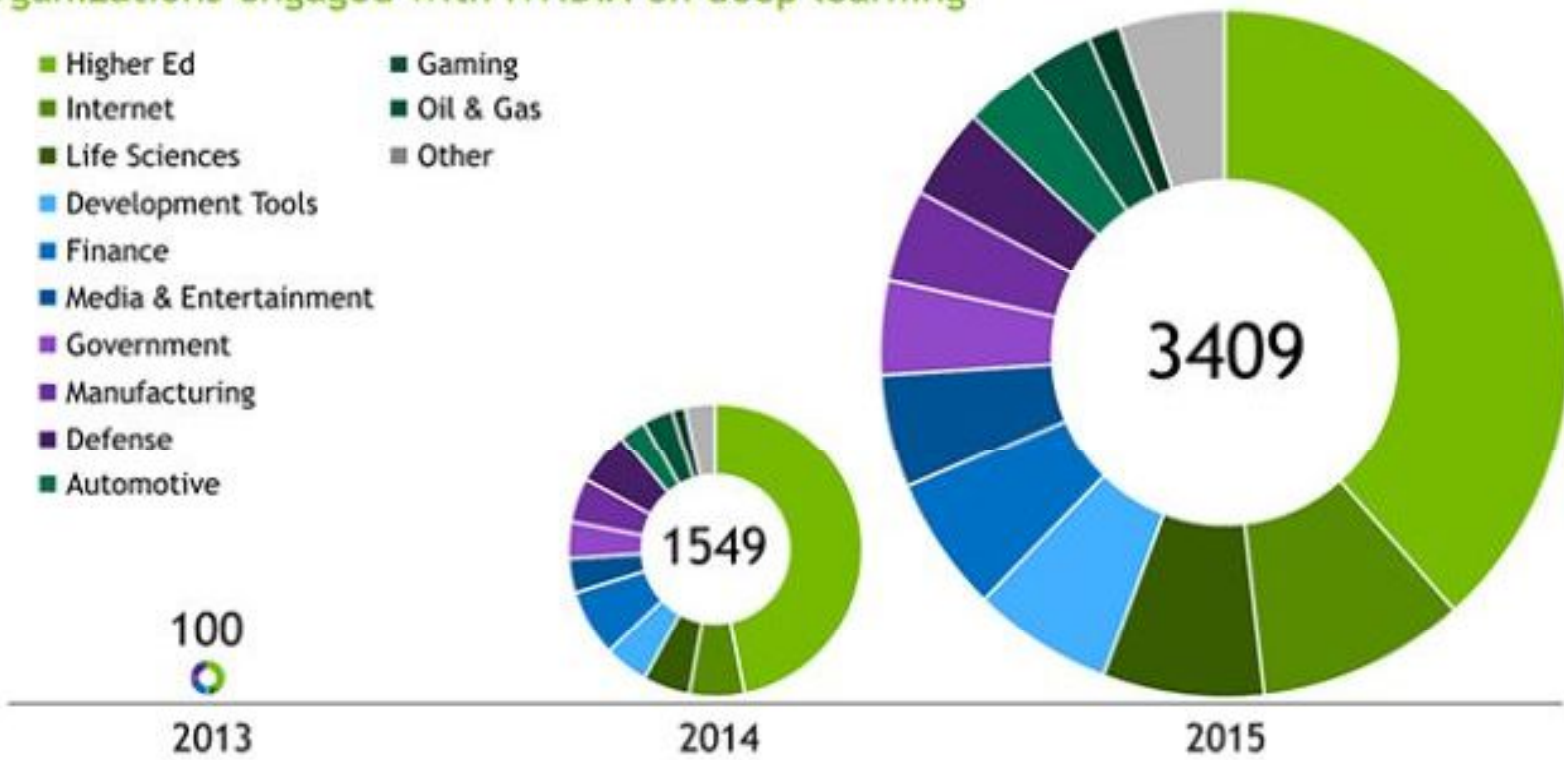
# Robotics Industry Profile



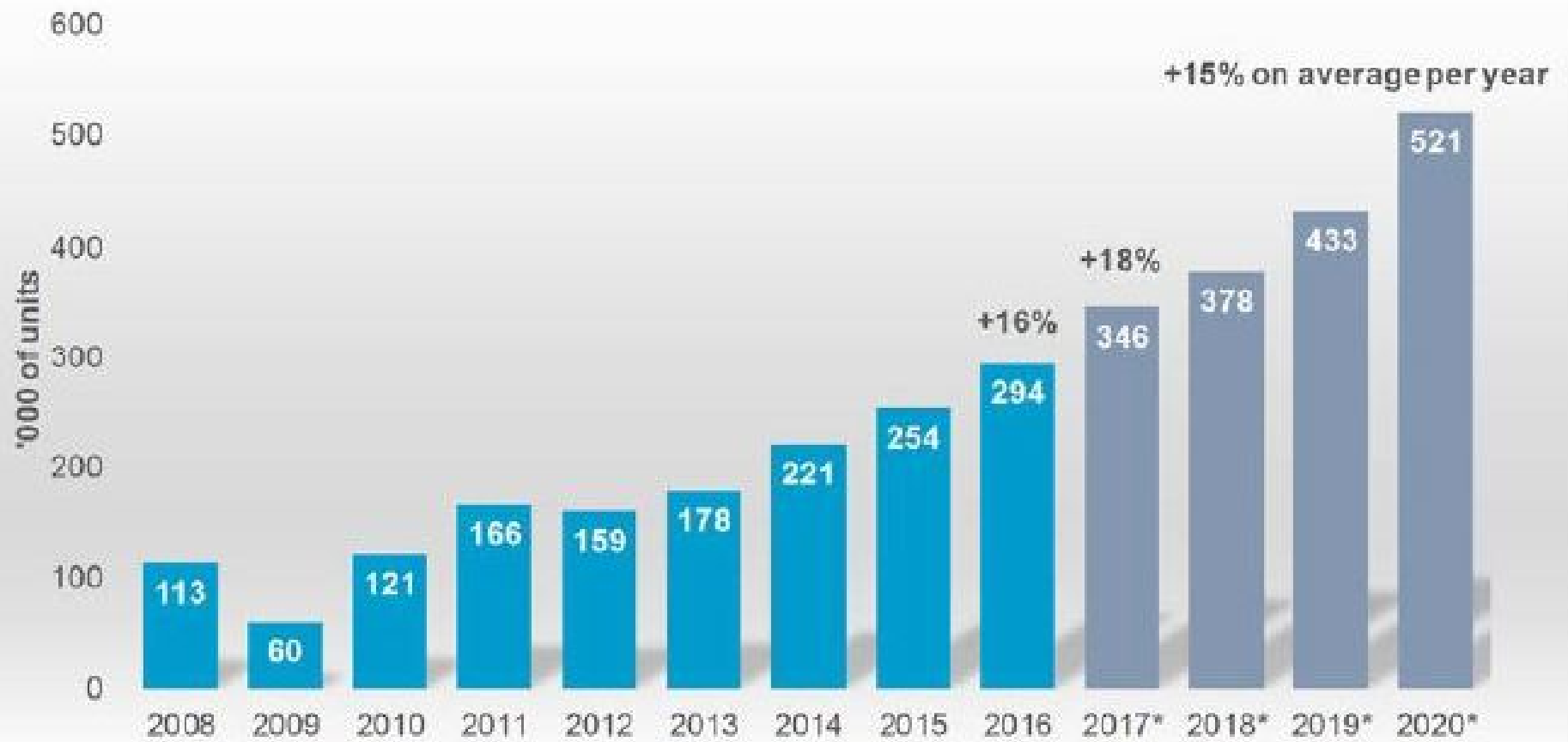
# EVERY INDUSTRY WANTS INTELLIGENCE

Organizations engaged with NVIDIA on deep learning

- Higher Ed
- Internet
- Life Sciences
- Development Tools
- Finance
- Media & Entertainment
- Government
- Manufacturing
- Defense
- Automotive
- Gaming
- Oil & Gas
- Other

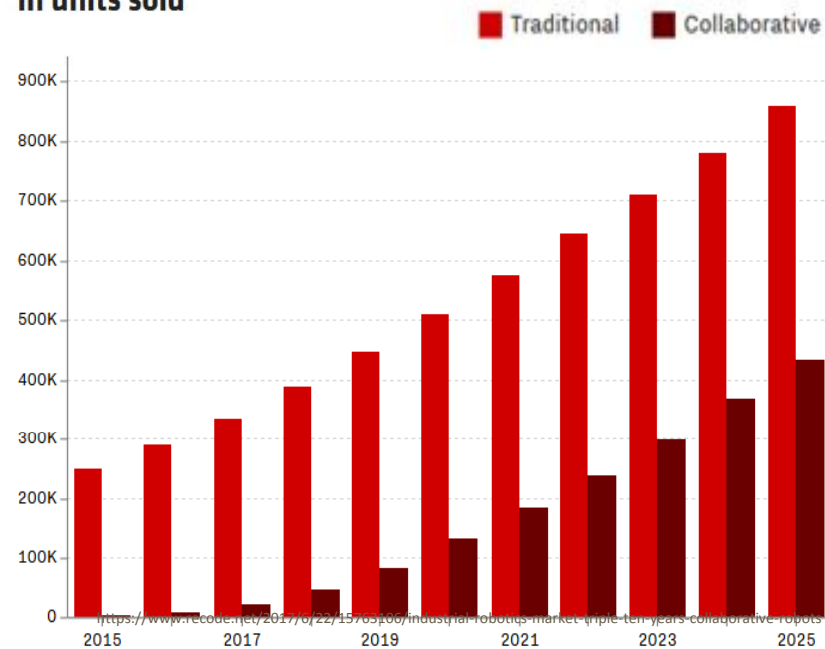


### Estimated annual worldwide supply of industrial robots 2008-2016 and 2017\*-2020\*



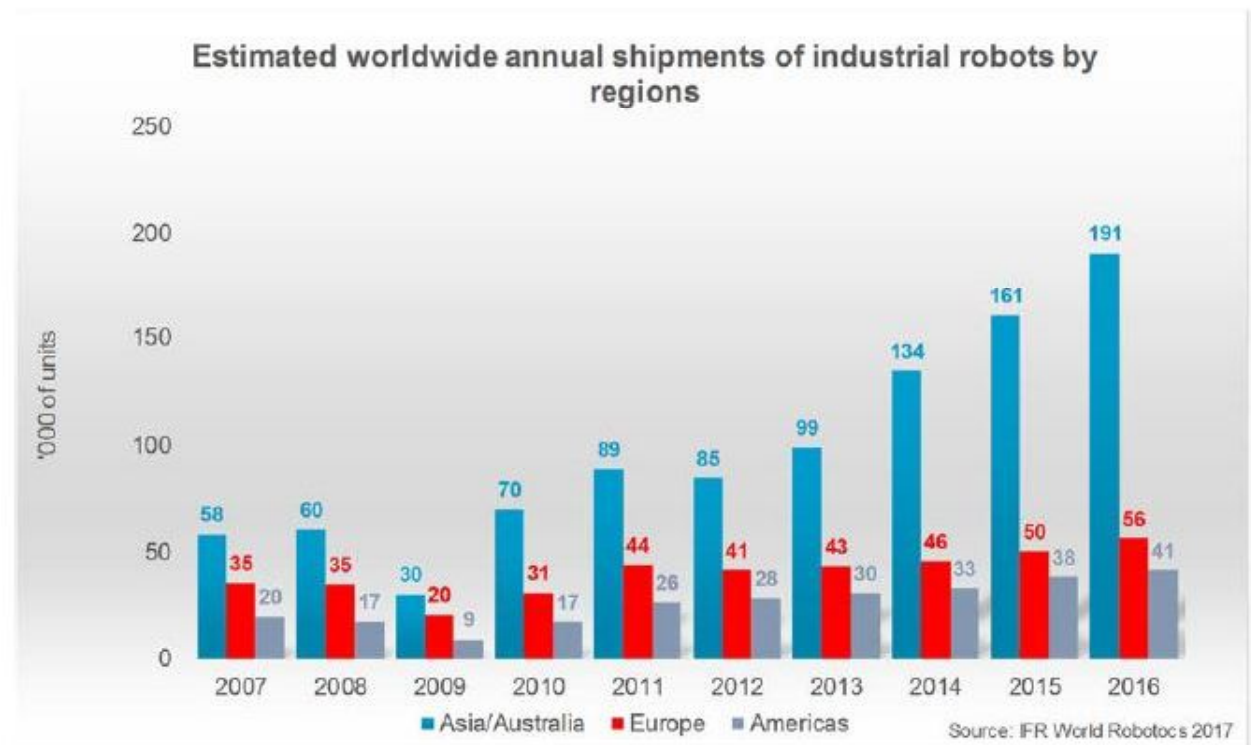
# Robot Sales Are Increasing, Including Cobots

Traditional versus collaborative industrial robots  
in units sold



# Regional Distribution

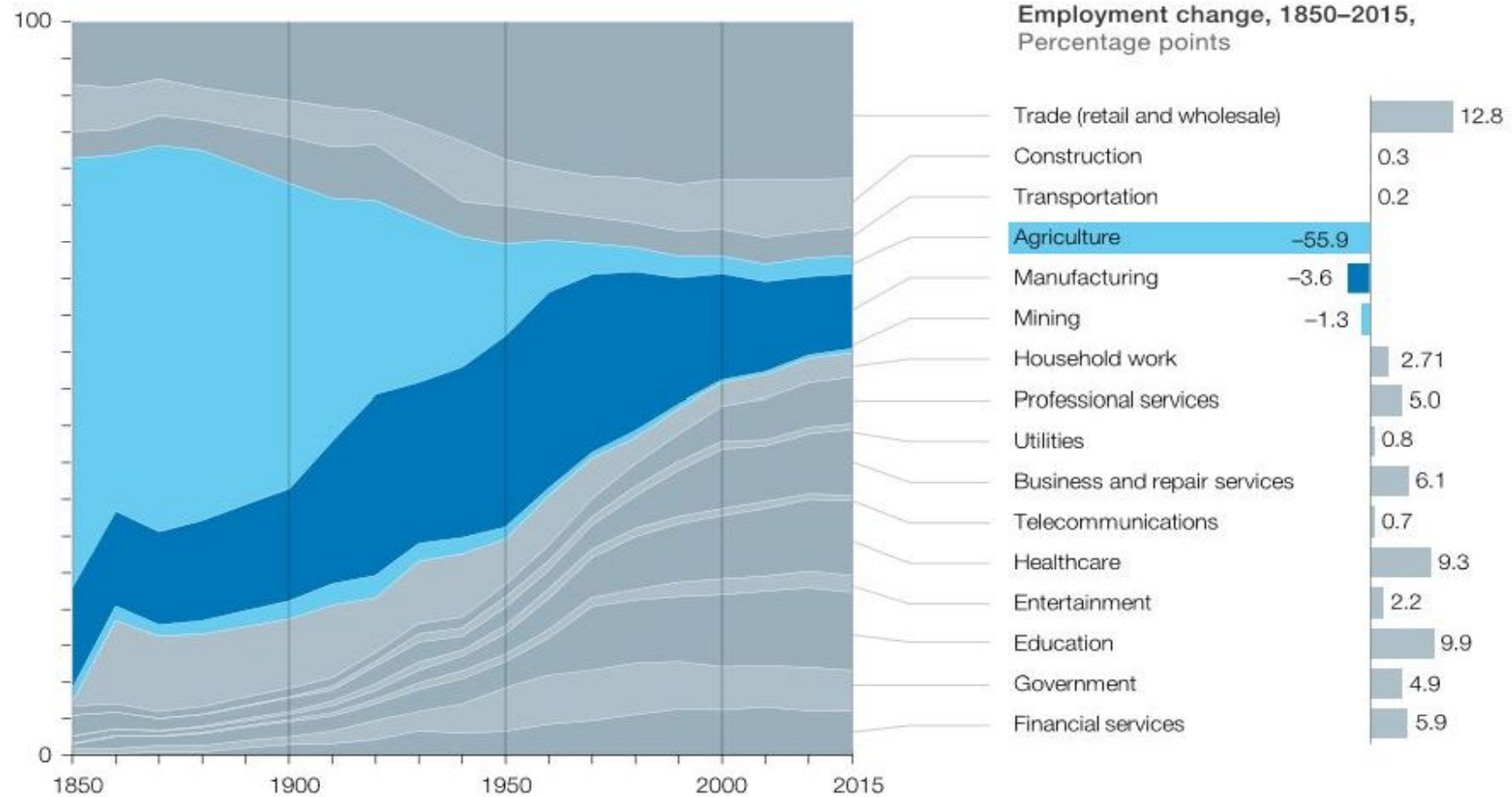
- There are five major markets representing 74% of the total sales volume in 2016: **China, the Republic of Korea, Japan, the United States, and Germany.**
- Since 2013 China has been the biggest robot market in the world with a continued dynamic growth.



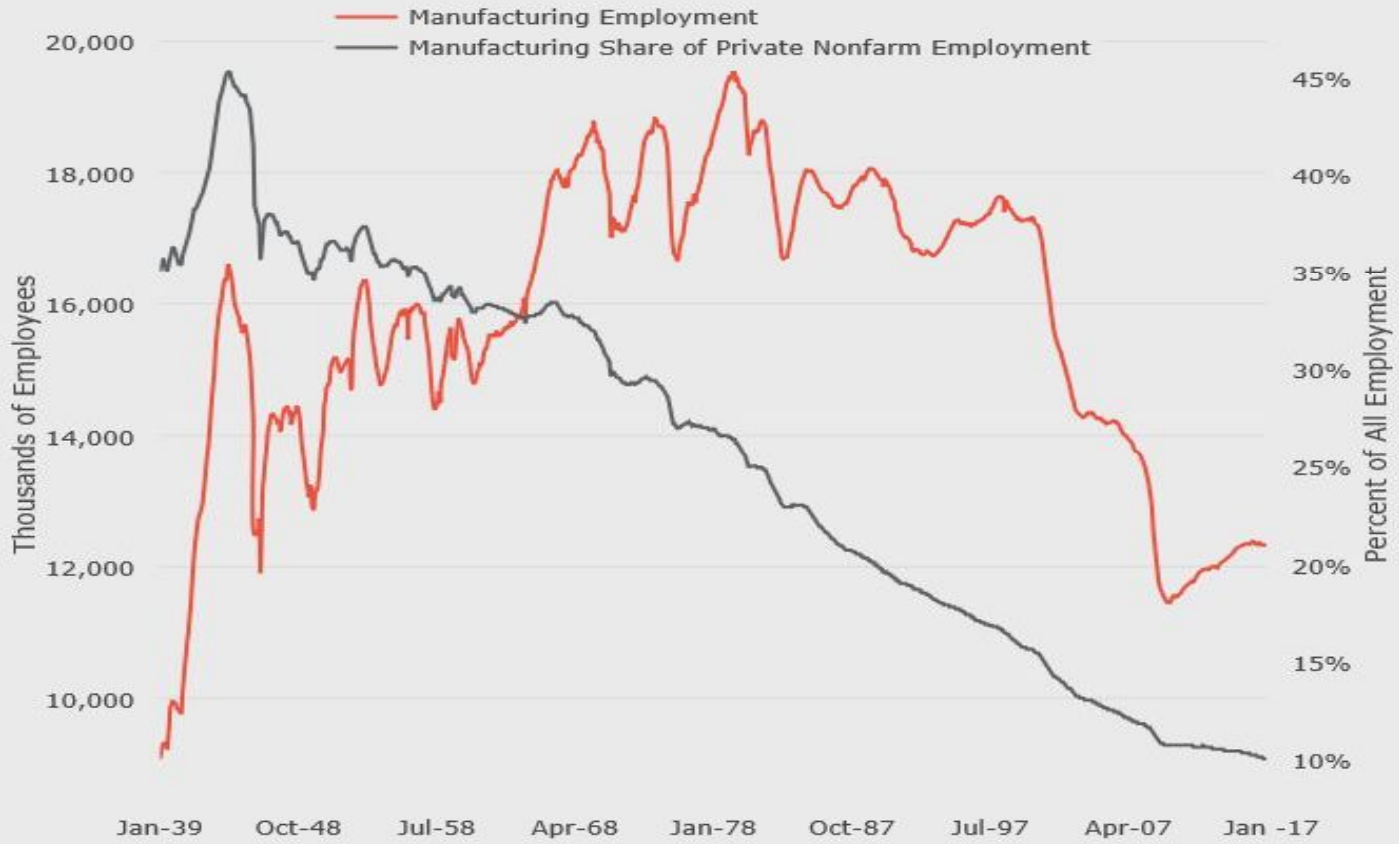
# **Robotic Automation and Job Loss: The Case of Manufacturing**



Share of total employment by sector in the United States, 1850–2015, % of jobs



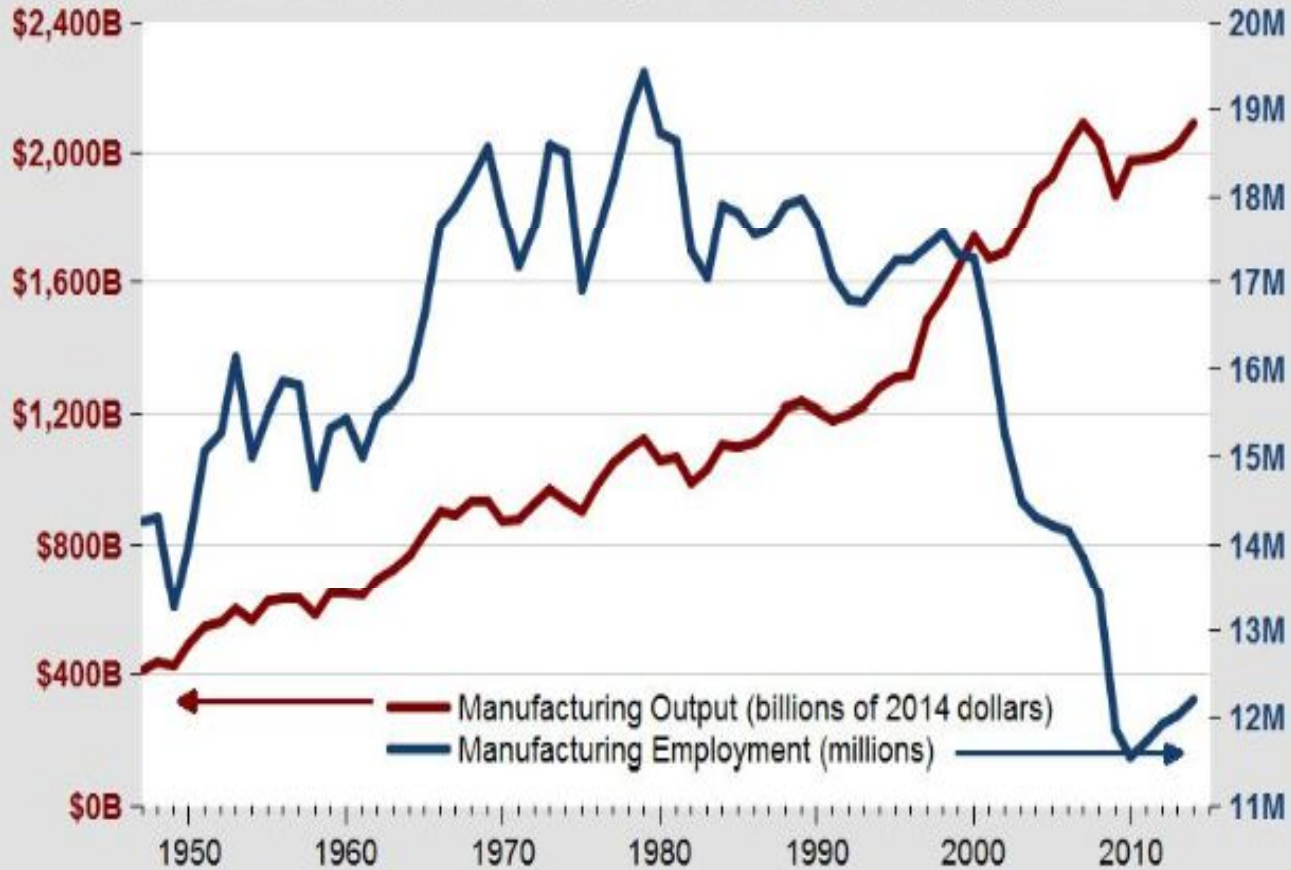
### Manufacturing Employment Trends, 1939-2016



Source: Current Employment Statistics.



*US Real Manufacturing Output vs. Employment, 1947 to 2014*



# Technology & Job Density

- In manufacturing, as in other industries, job density—the number of jobs per process—is declining.
- The reason—automation—and robotics—and advanced manufacturing techniques.
- More generally, the “job intensity” of America’s manufacturing industries—and especially its best-paying advanced ones—is only going to decline.
- In 1980 it took 25 jobs to generate \$1 million in manufacturing output in the U.S..
- Today it takes five jobs.

# Job Loss: Is it Technology or Trade?

- **It's Technology (Robots)**
  - Erik Brynjolfsson, MIT Sloan School of Management
    - *Race Against the Machine*
    - *Second Machine Age*
- **It's Trade (China)**
  - David Autor, MIT Department of Economics
    - *The China Syndrome: Local Labor Market Effects of Import Competition in the United States. American Economic Review 2013, 103(6): 2121–2168*



**KIVA**

*A Kiva Systems robot can scurry about the floor of a large warehouse to find ordered products. It then fetches the correct rack or pallet and brings it to a worker who packages the goods.*

# Technological Unemployment

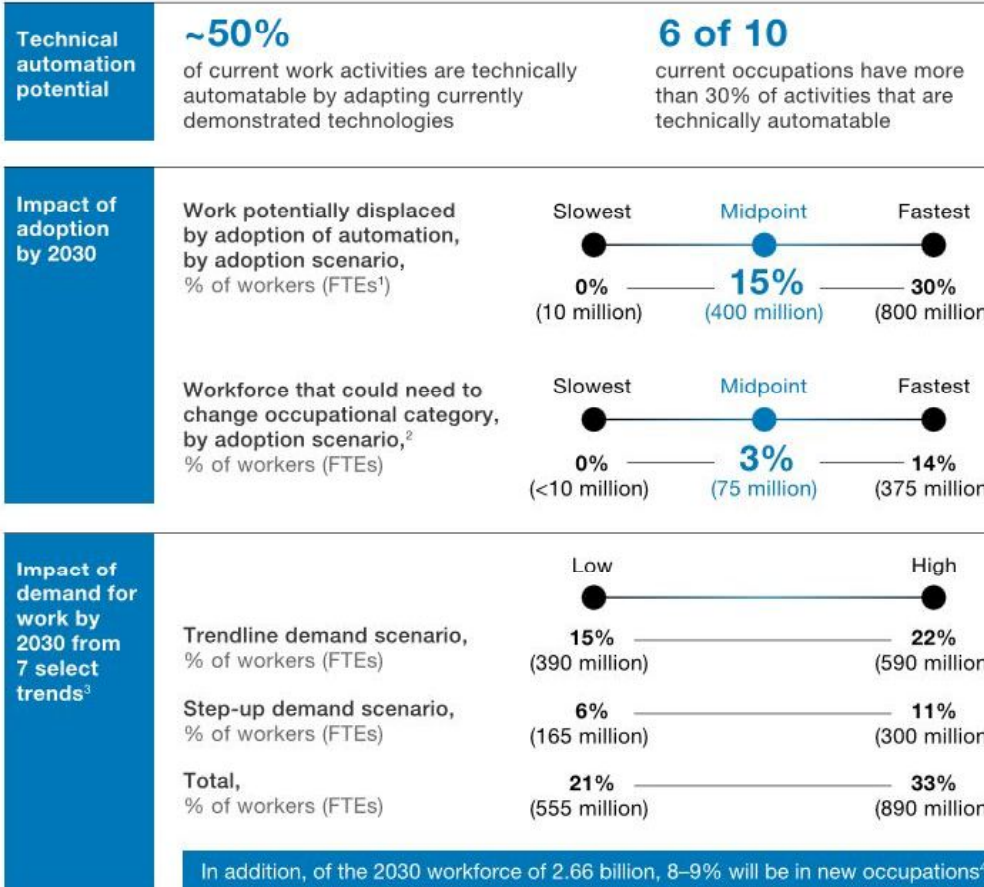
- Competition from China only explains about a fourth of decline in manufacturing during the 2000s.
- Skills mismatch, as manufacturing sector shifts from low-skilled to high-skilled work—has also contributed to the decline.
- Occupational polarization:
  - Workers involved in tasks that are fully *codifiable* are most vulnerable to replacement by automations--*substitute*
  - Workers, parts of whose jobs are *codifiable*, will experience dislocations--*complement*
- Technology is reshaping the skills need for work—enhancing cognitive skills over physical skills.

# Substitute or Complement?

- In the workplace, robots can perform:
  - A job that a human worker once did
    - The robot acts as a *substitute* for a human worker.
  - The robot can assist a human worker to perform a job
    - The robot acts as a *complement* to a human worker.

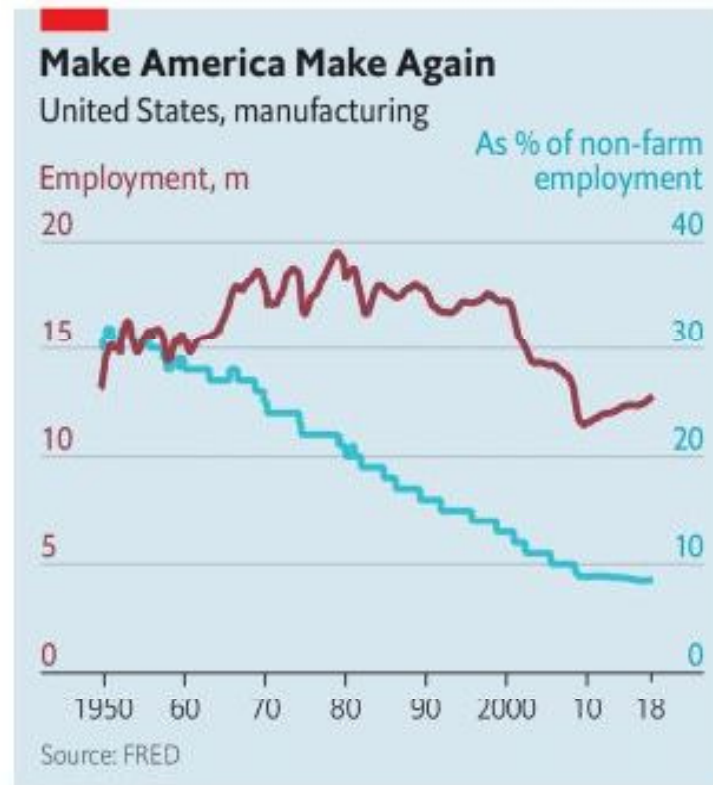


# Impact on the Global Workforce



## Recent Manufacturing Employment

- Employment composition has shifted toward managerial and professional jobs, and away from jobs that can be done with less schooling.



The Economist

# **Safety and Health Data Analytics: Role of AI**





# Worker Protection Informatics

- The *science and practice* of determining *which sensor information is relevant* to protecting worker safety, health, well-being, and productivity, and then developing and implementing effective ways:
  - To collect, validate, store, share, analyze, model, and apply the information,
  - To confirm achievement of the intended outcome from use of that information,
  - To convey experience to the broader community, contributing to generalized knowledge, and updating standards and training.

Adapted from <http://www.internano.org/nanoinformatics/> and Hoover et al. 2015

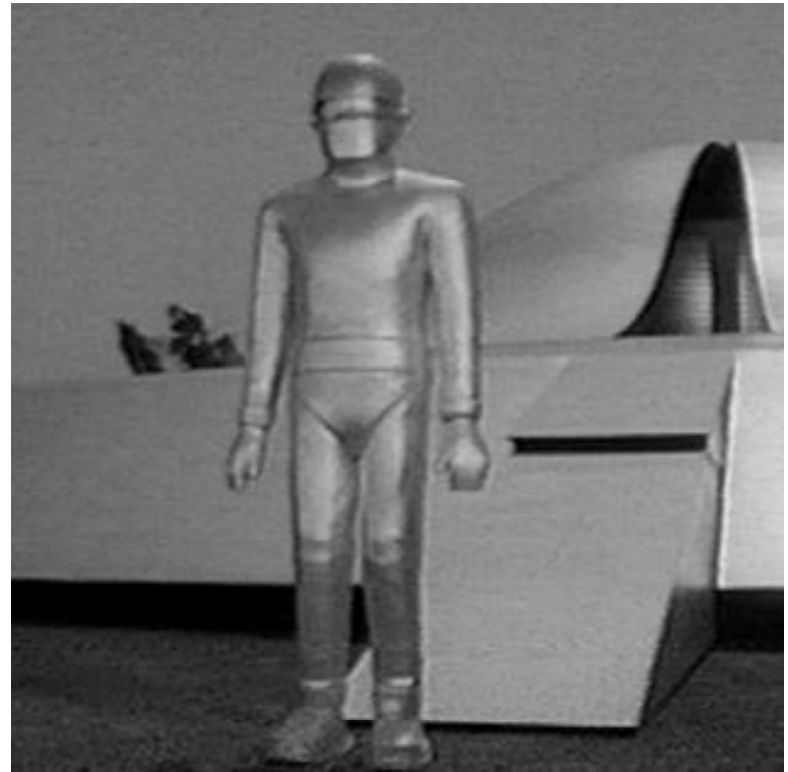
# Sensor Data Analytics: The Questions

- Do existing and proposed sensor methods **accurately measure** what they are supposed to be measuring?
- How can they be **adequately calibrated and validated**?
- When are they limited to use for screening and **when can they provide accurate characterizations** of specific hazards?
- Given the large to vast amounts of sensor data that may be collected, **how can those data be feasibly analyzed and interpreted by an occupational data scientist**?

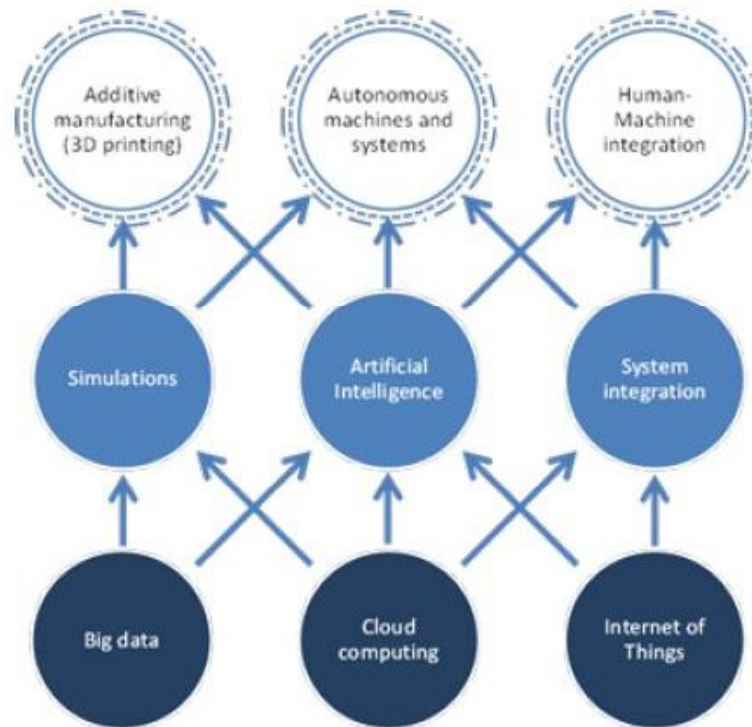


# AI Safety Management

- Can AI recognize a near-miss?
- Can AI assess data to present a risk assessment probability?
- Can AI offer risk mitigation recommendations based on real-time sensor data and historical situations?
- Can AI take control to prevent human actions that may create safety hazard?



# Confluence of Key Technologies Enabling Industrial Digital Transformation (Industry 4.0)



Source: OECD (2017a)

# OCCUPATIONAL SAFETY AND HEALTH

## Pros

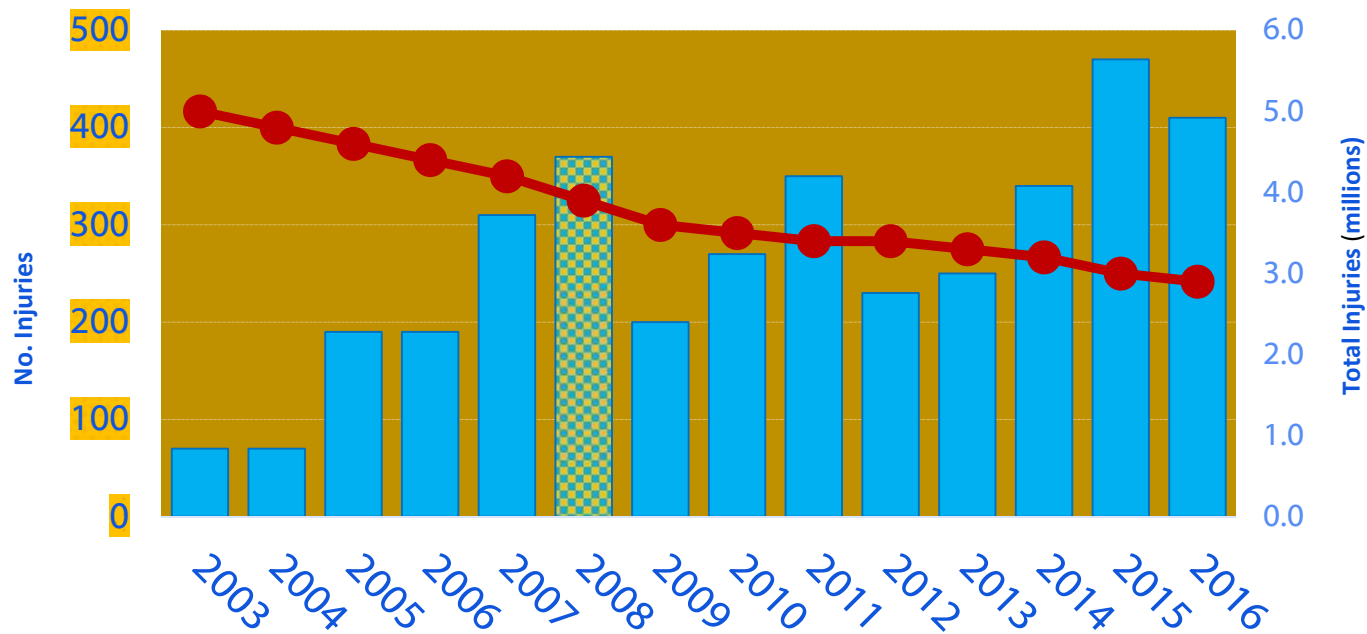
- Expand dangerous work done by robots
- Robotic systems augment workers' abilities

## Cons

- Likely increase in injuries from manipulators, mobile robots
- New types of robots will require refined and new protection strategies
- Rapid advances in technology may outpace standards setting
- Stress associated with changing workplace and potential for displacement



# Estimated 3,730 Robot Injuries in U.S., SOII 2003-2016



# NIOSH Center for Occupational Robotics Research

- NIOSH has been aware of an increase in the use of robotics in the workplace for a number of years.
- We decided to focus research attention on understanding the aspects of robotics that may affect human workers and the 21<sup>st</sup> century workplace.
- Established a Center for Occupational Robotics Research in September 2017



# The National Institute for Occupational Safety and Health (NIOSH)

Workplace Safety & Health Topics

Robotics

About the Center

News & Events

Research

Partnerships & Resources

Publications

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Promoting productive workplaces through safety and health research



[NIOSH](#) > [Workplace Safety & Health Topics](#) > [Robotics](#)

## ROBOTICS



### About the Center



Center for Occupational Robotics Research

NIOSH conducted extensive robotics safety research when robots began appearing in the workplace in the mid 1980s. This research was limited to robots designed to work in isolation from workers, such as robots in cages or cells. With the increase in robots and advances in their capabilities, the Center was established in September 2017 to address the safety of today's workers who use, wear, or work near robots.

### The Problem

Current injury surveillance systems are not able to easily identify robot-related injuries due to a lack of standard classification codes. However, NIOSH

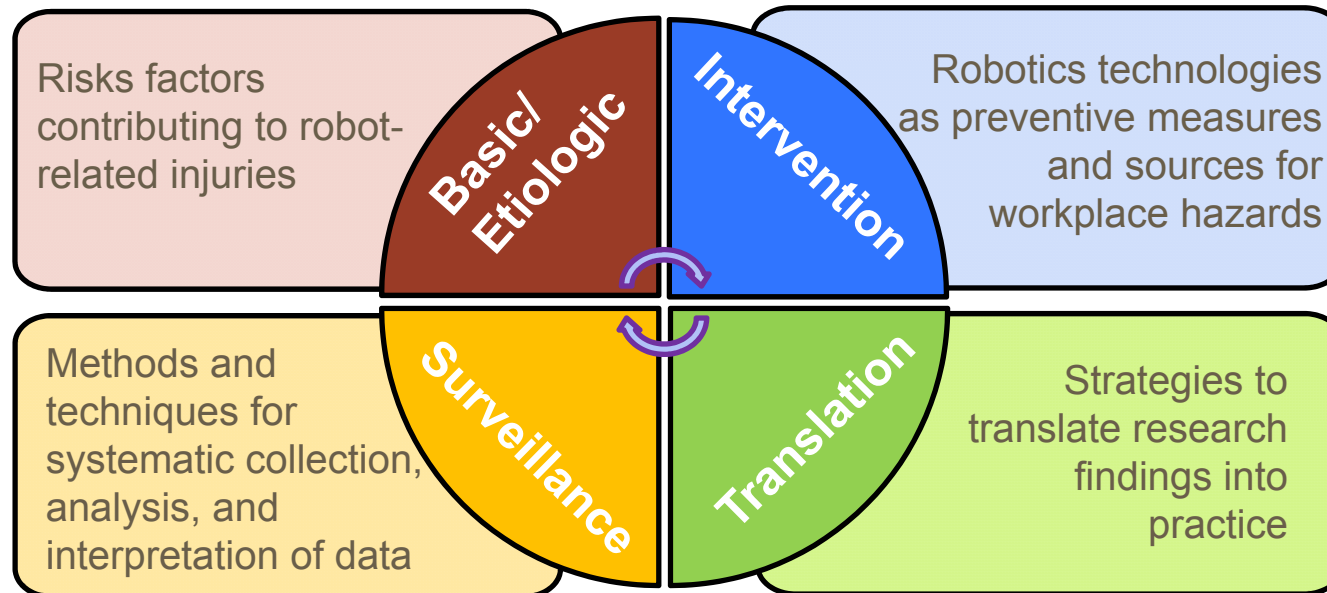


# Occupational Leadership Needed

RESEARCH BY PRIVATE SECTOR	NIOSH
<ul style="list-style-type: none"><li>• Advancing technology</li><li>• Productivity and economic growth</li><li>• <b>Minimal attention to worker safety and health</b></li></ul>	<ul style="list-style-type: none"><li>• Enhances the worker safety and health mission</li><li>• Broaden breath of disciplines</li><li>• Engaging in human subject research</li><li>• Increasing laboratory capacity</li><li>• Refining approaches to prevention</li><li>• Promoting partnerships</li></ul>



# RESEARCH NEEDS



# Strategy and Priorities

- **Strategies**

- Bring attention to worker safety and health
- Leverage expertise and resources with partners
- Focus on work not likely to be accomplished by others

- **Priorities**

- Increase understanding of human and robot interactions
- Improve the ability to identify and track injuries
- Provide guidance for working safely with robotics technologies



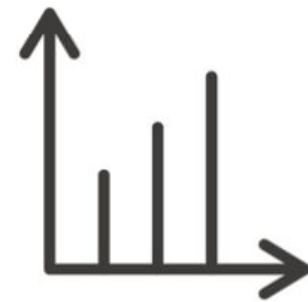
# Approaches to Expanding Capacity in OSH

- Raising awareness of issue
- Establishing infrastructure for research
- Developing partnerships to leverage expertise and resources
- Actively participating on key standards setting committees



# Ability to Identify and Track Injuries

- Refining keyword searches and methods
- Exploring ability to identify cases in different databases
- Made recommendations to Bureau of Labor Statistics for potential changes to Occupational Injury and Illnesses Classification System



# Recommendations to BLS

- BLS currently lacks a direct way to identify robotic systems in machinery, motor vehicles, or industrial vehicles
- Solutions:
  - Add a 5<sup>th</sup> digit to the source codes to denote robotic systems (or)
  - Create a standalone variable for robotic systems



# Infrastructure: NIOSH Laboratory Capacity

- **Robotics Safety Lab under development**
  - Collaborative robot arms and mobile warehouse robots
- **Virtual Reality Lab Upgrade**
  - Simulation of Human-Robot Interaction



# Contributing to Consensus Standards

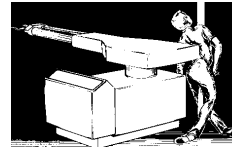
- ANSI/RIA R15.06 – Industrial **Robots and Robot Systems Safety** (*Update*)
- ANSI/RIA R15.08 – Industrial **Mobile Robot Safety** (*New*)
- ASTM F48 – **Exoskeletons and Exosuits** (*New*)
- ANSI/ASSP/NSC Z15.3- Safety Management of **Partially and Fully Automated Vehicles** (*Technical report*)
- ANSI **Unmanned Aircraft Systems** Standardization Collaborative Roadmap (*Groundwork for consideration of a new standard*)





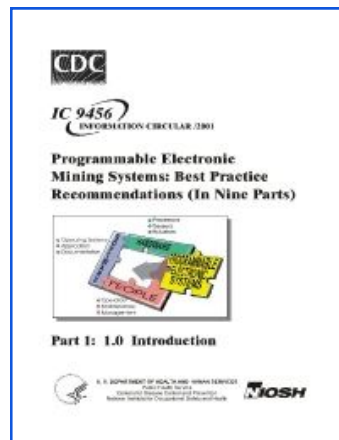
# Existing Guidance on Working Safely with Robots

Preventing the Injury of  
Workers by Robots,  
NIOSH Pub. No. 85-103

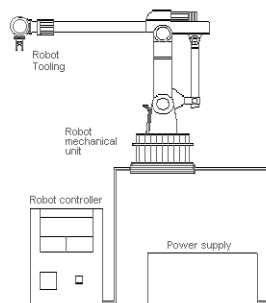


1740. Robots and  
Robotic Equipment

Safe Maintenance Guidelines for Robotic  
Workstations, NIOSH Pub. No. 88-108



OSHA Instructional Manual,  
Chapter 4: Industrial Robots  
and Robot System Safety



# ANSI/RIA Robotic Safety Standards

- **ANSI/RIA R15.06-2012**

- American National Standard for Industrial Robots and Robot Systems- Safety Requirements

- Approved March 28, 2013
- Revision of ANSI R15.06-1999

- Provides guidelines for the manufacture and integration of industrial robots and robot systems

- Emphasis on their safe use, the importance of risk assessment and establishing personnel safety.
- Key feature in the standard is “collaborative operation,”
  - Introduction of a worker to the loop of active interaction during automatic robot operation.



# Robotics and Economies

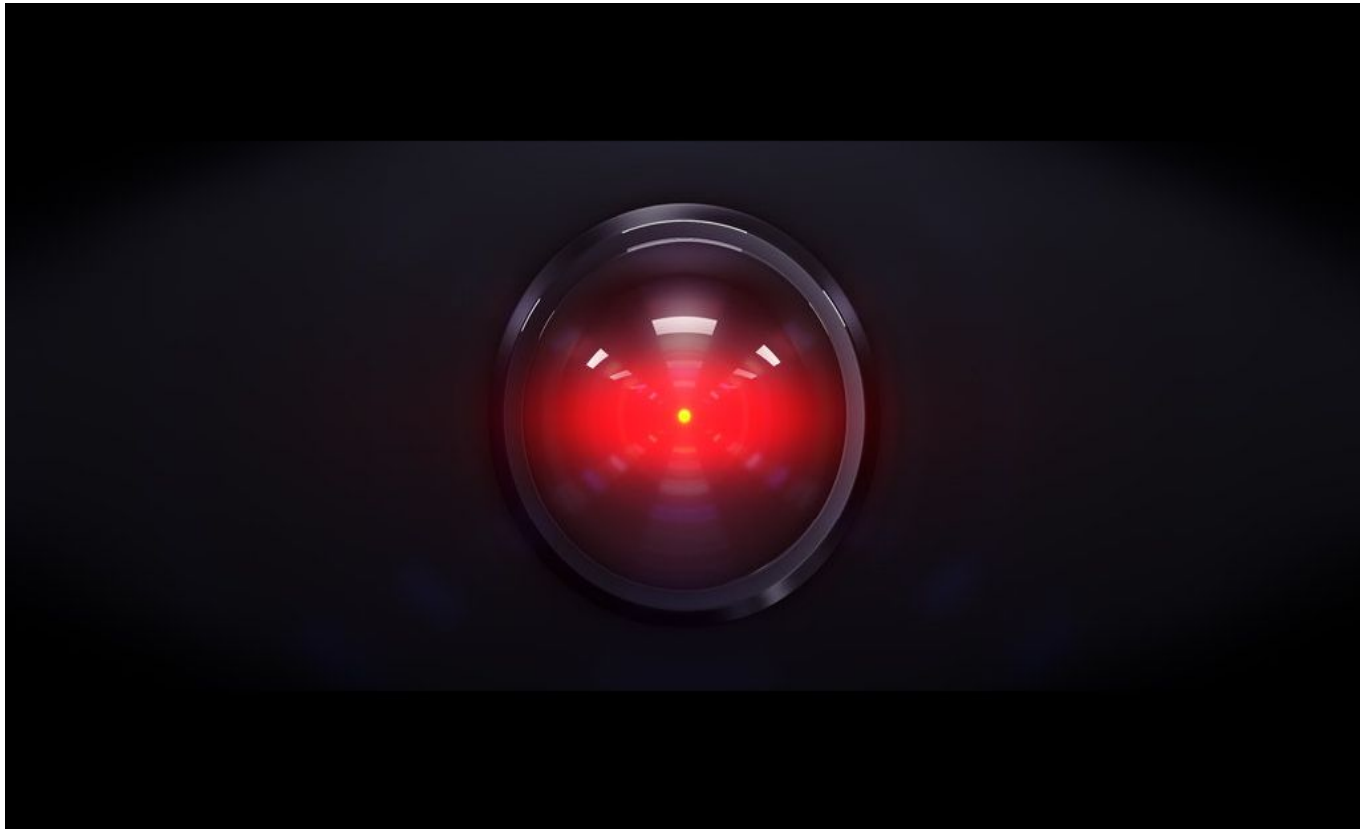
- **Effect on employment**
  - Technological unemployment
    - Probably overstated in near term, probable in longer term
    - Job destruction and job creation do not proceed in parallel creating sociopolitical issues
- **Effect on productivity**
  - Enhancement
- **Effect on national security**
  - Threat?
- **Effects on production technologies**
  - **Substitute** for low-skill labor and **complement** for high-skill labor
  - Decrease importance of labor costs in total production costs
    - Making relocation of productive activities attractive—reshoring
  - Enhance the flexibility of productive process—enabling greater customization of goods—autonomous machine will allow for producing smaller batches of a wider variety at a lower cost

# U.S. Government is on AI Lockdown

- On 19 November, the U.S. Department of Commerce proposed new restrictions on the export of AI technologies, including neural networks and deep learning, natural language processing, computer vision, and expert systems. See <https://www.gpo.gov/fdsys/pkg/FR-2018-11-19/pdf/2018-25221.pdf>
- ***Representative Technology Categories***
  - Artificial intelligence (AI) and machine learning technology, such as:
    - Neural networks and deep learning
    - Computer vision (*e.g.*, object recognition, image understanding);
    - Expert systems (*e.g.*, decision support systems, teaching systems);
    - Speech and audio processing (*e.g.*, speech recognition and production); and
    - Natural language processing (*e.g.*, machine translation).
  - AI cloud technologies; and
  - Quantum information and sensing technology (among others).



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



## References

- Acemoglu D et al. *The race between machine and man: implications of technology for growth, factor shares and employment*. National Bureau of Economic Research, Working Paper 22252, June 2017.
- Alpaydin E. *Machine learning*. Cambridge, MA: MIT Press, 2016.
- Awad E et al. The moral machine experiment. *Nature* 2018;563:59-64.
- Bekey G. *Autonomous robots: from biological inspirations to implementation and control*. Cambridge, MA: MIT Press, 2005.
- Benzell SG et al. Robots are Us: Some economics of human replacement. National Bureau of Economic Research, Working Paper 20941, October 2018.
- Brynjolfsson E et al. What can machine learning do? Workforce implications. *Science* 2017;358(6370):1530-1534.



## References

- Gardner H. “Multiple Intelligences: Prelude, Theory, and Aftermath.” In Sternberg, R.J., S.T. Fiske, and D.J. Foss, *Scientists Making a Difference: One Hundred Eminent Behavioral and Brain Scientists Talk about Their Most Important Contributions*. New York: Cambridge University Press, 2016
- Gershman SJ et al. Computational rationality: a converging paradigm for intelligence in brains, minds, and machine. *Science*. 2015;349(6245):273-278.
- Harari YN. *21 lessons for the 21<sup>st</sup> century*. London, UK: Penguin Books, 2018.
- Hirschberg J & Manning CD. Advances in natural language processing. *Science*. 2018;349(6245):261-266.
- Howard J et al. Unmanned aerial vehicles in construction and worker safety. *Am J Ind Med*. 2018;61:3-10.



## References

- Jordan J. *Robots*. Cambridge, MA: MIT Press, 2016
- Jordan MI et al. Machine learning: trends, perspectives, and prospects. *Science*. 2015;349(6245):255-260.
- Krizhevsky A et al. ImageNet classification with deep convolutional neural networks. *Advances in neural information processing systems*. 2012;25(2):1-9. DOI:10.1145/3065386.
- LeCun Y et al. Deep learning. *Nature* 2015;521:436-444.  
<https://www.nature.com/articles/nature14539.pdf>
- McAfee A & Brynjolfsson E. *Machine platform crowd: harnessing out digital future*. New York: Norton, 2017.
- Mori M. The uncanny valley (translated). *IEEE Robotics and Automation*. June, 2012.  
<https://spectrum.ieee.org/automaton/robotics/humanoids/the-uncanny-valley>





## References

- Murashov V et al. Working safely with robots: recommendations for the new workplace. *JOEH*. 2016;13(3):D61-D71.
- National Academy of Sciences. *Information technology and the U.S. Workforce: where we are and where do we go from here*. 2017. <https://www.nap.edu/catalog/24649/information-technology-and-the-us-workforce-where-are-we-and>
- Parkes DC & Wellman MP. Economic reasoning and artificial intelligence. *Science*. 2018;349(6245):267-272.
- Russell S & Norvig P. *Artificial intelligence: a modern approach*. 3<sup>rd</sup> Edition, Upper Saddle River, NJ: Prentice Hall.
- West DM. *The future of work: robots, AI and automation*. Washington, DC: Brookings Institution Press, 2018.

