

# The Need for a National Research Cloud for Human-Centered AI Research

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Stanford  
University



Stanford University  
Human-Centered  
Artificial Intelligence

Part I:

# How AI can Transform Healthcare Delivery



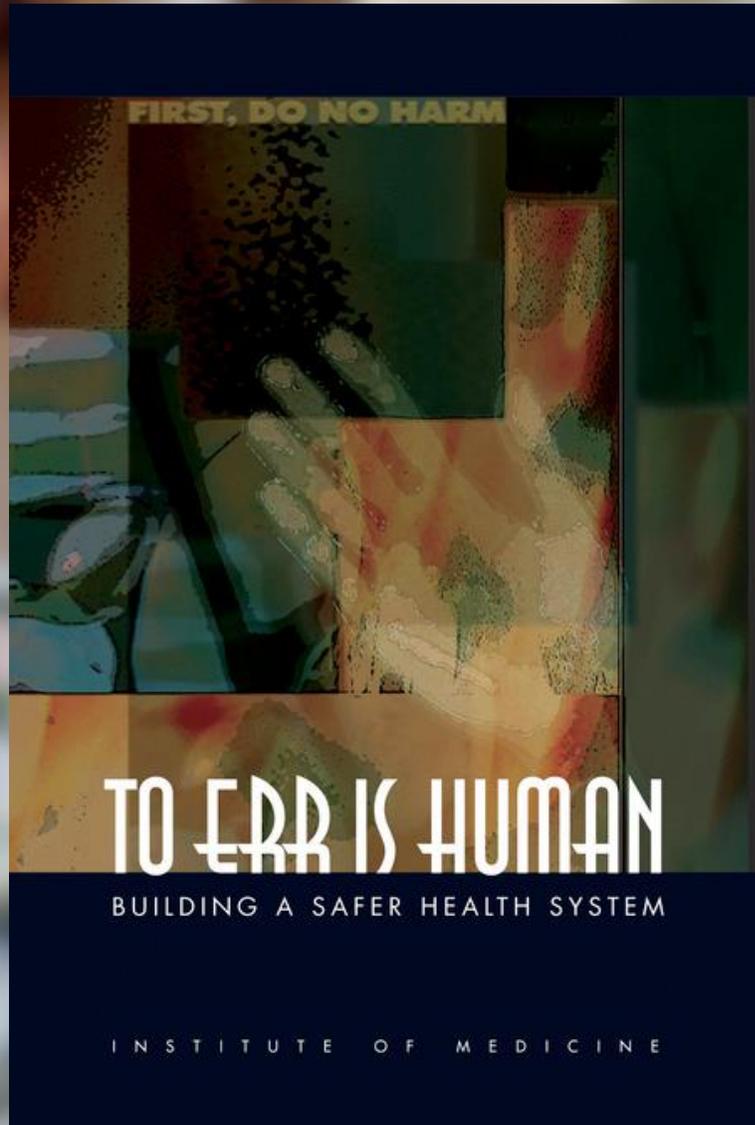
Medical data has exploded in recent decades, but the physical spaces of healthcare remain in the dark.

# Healthcare Delivery is Highly Complex



# “To Err is Human”

## 1999 National Institute of Medicine Report



### ...each year in the United States

Immobility-Induced  
Ulcers

**60,000 deaths<sup>1</sup>**

Patient  
Falls

**11,000 deaths<sup>2</sup>**

Hygiene-related  
infections

**99,000 deaths<sup>3</sup>**

CLABSI  
Infections

**31,000 deaths<sup>3</sup>**

<sup>1</sup>Barnet 2015   <sup>2</sup>Currie 2008   <sup>3</sup>Klevens 2002

# New opportunities for care improvements

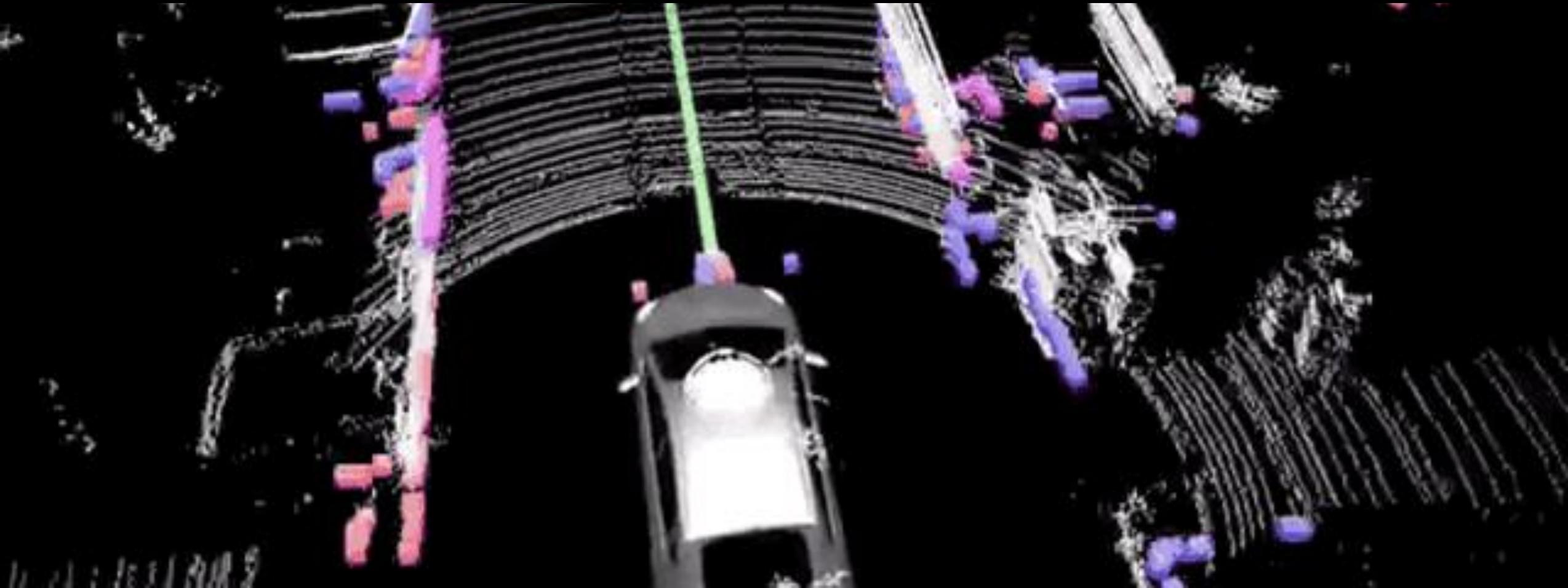
**More time between  
caregiver and  
patient**

**New options for  
seniors living at  
home**

**Consistent chronic  
disease care**

**Enables  
activity-based  
costing**

What if AI could help? Much of the innovation in self-driving cars can apply to understanding any physical space



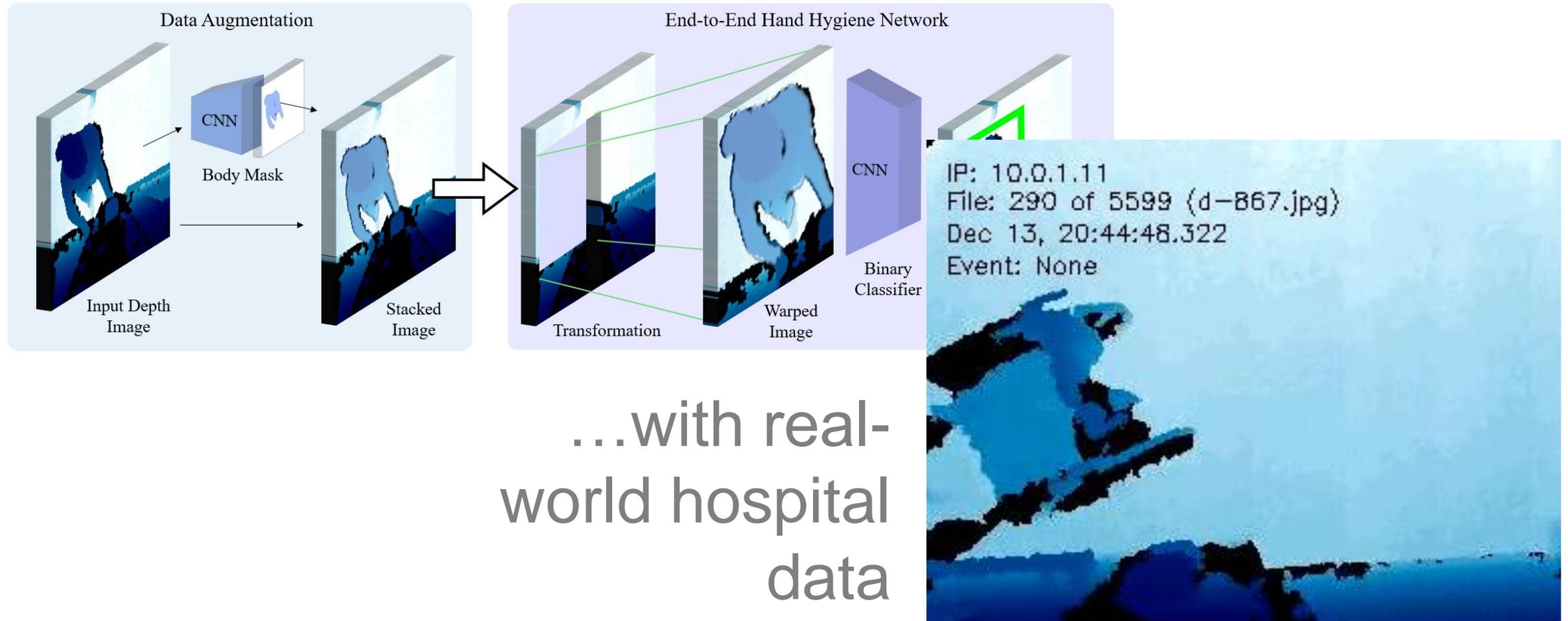
# A holistic understanding of activities in the environment



Yeung, Downing, Fei-Fei, Milstein. *New England Journal of Medicine (NEJM)*, 2018.

Haque, Milstein, Fei-Fei, *Nature* (in press)

# AI can detect human activities accurately...

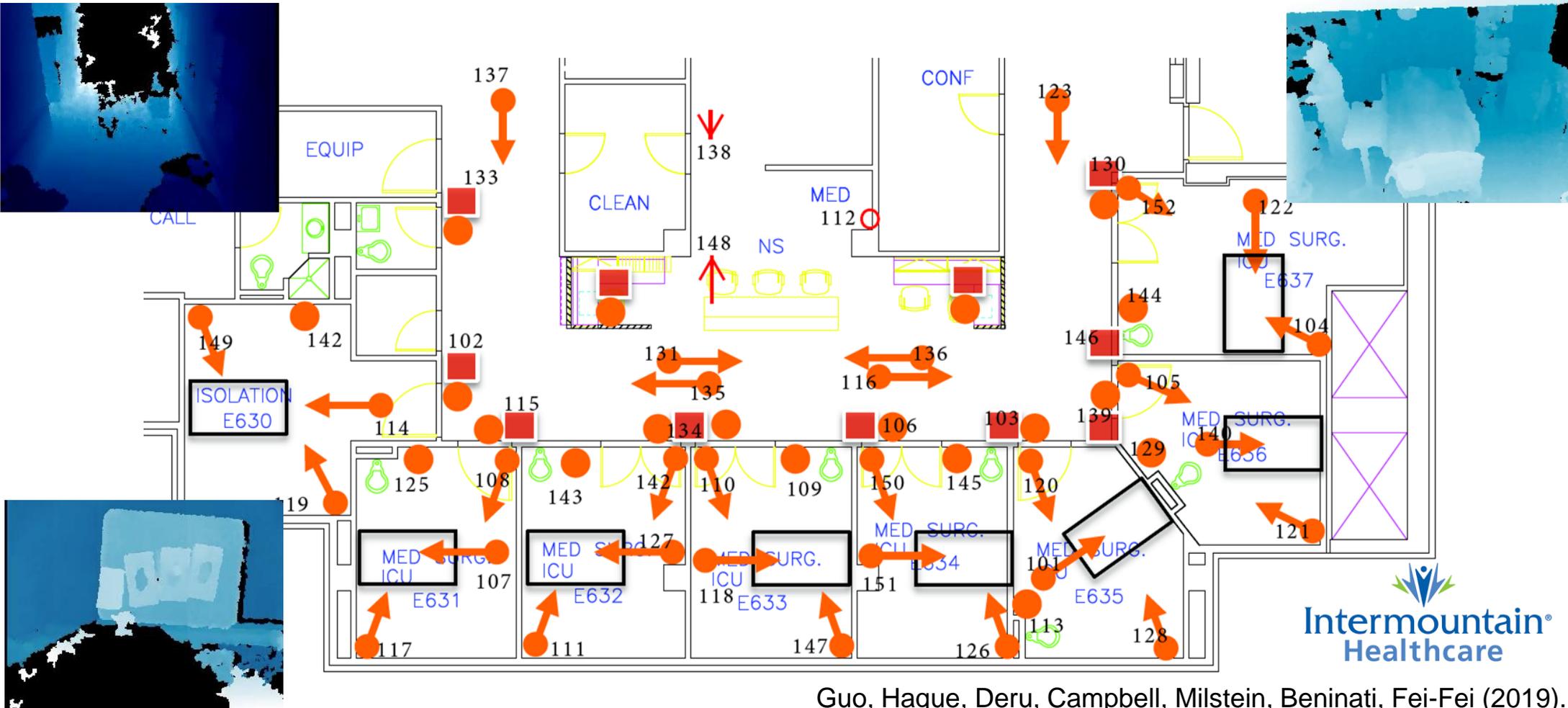


...with real-world hospital data

Singh\*, Haque\*, Alahi, Yeung, Guo, Glassman, Beninati, Platchek, Fei-Fei, Milstein (2020)

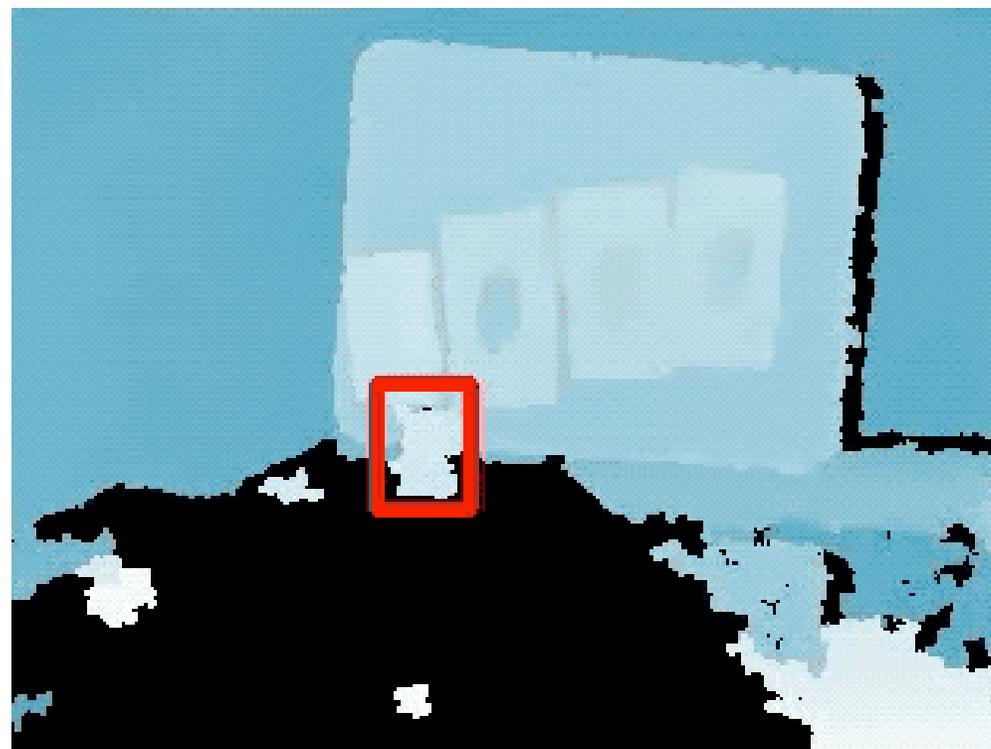
Haque, Guo, Alahi, Yeung, Luo, Rege, Jopling, Downing, Beninati, Singh, Platchek, Milstein, Fei-Fei (2017)

...and can be placed throughout the hospital.



Guo, Haque, Deru, Campbell, Milstein, Beninati, Fei-Fei (2019). *In preparation.*

# Seeing the difference between good hand hygiene and bad, as it happens





laparotomy\_sponge: 99%

laparotomy\_sponge: 99%

laparotomy\_sponge: 99%

laparotomy\_sponge: 99%

Or helping prevent surgical mistakes as an operation unfolds

**A case study in now AI is helping** extend the reach of senior care



**7% Increase**

in US residents aged 65+ by 2030

**42% Decrease**

in ratio of caregivers to seniors by  
2030

(4:1 vs 7:1)

**18.4 Billion**

hours of assistance from unpaid  
caregivers

# AI can track senior activities accurately and non-invasively

Get patient  
out of bed



Sit patient  
in chair



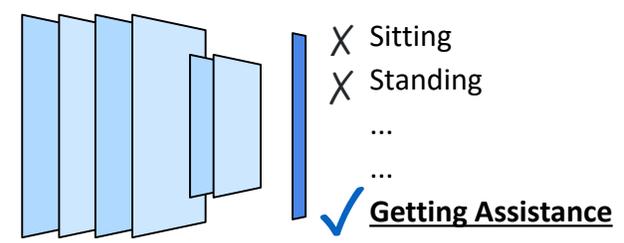
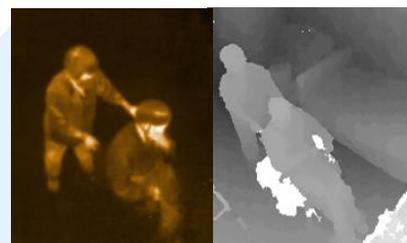
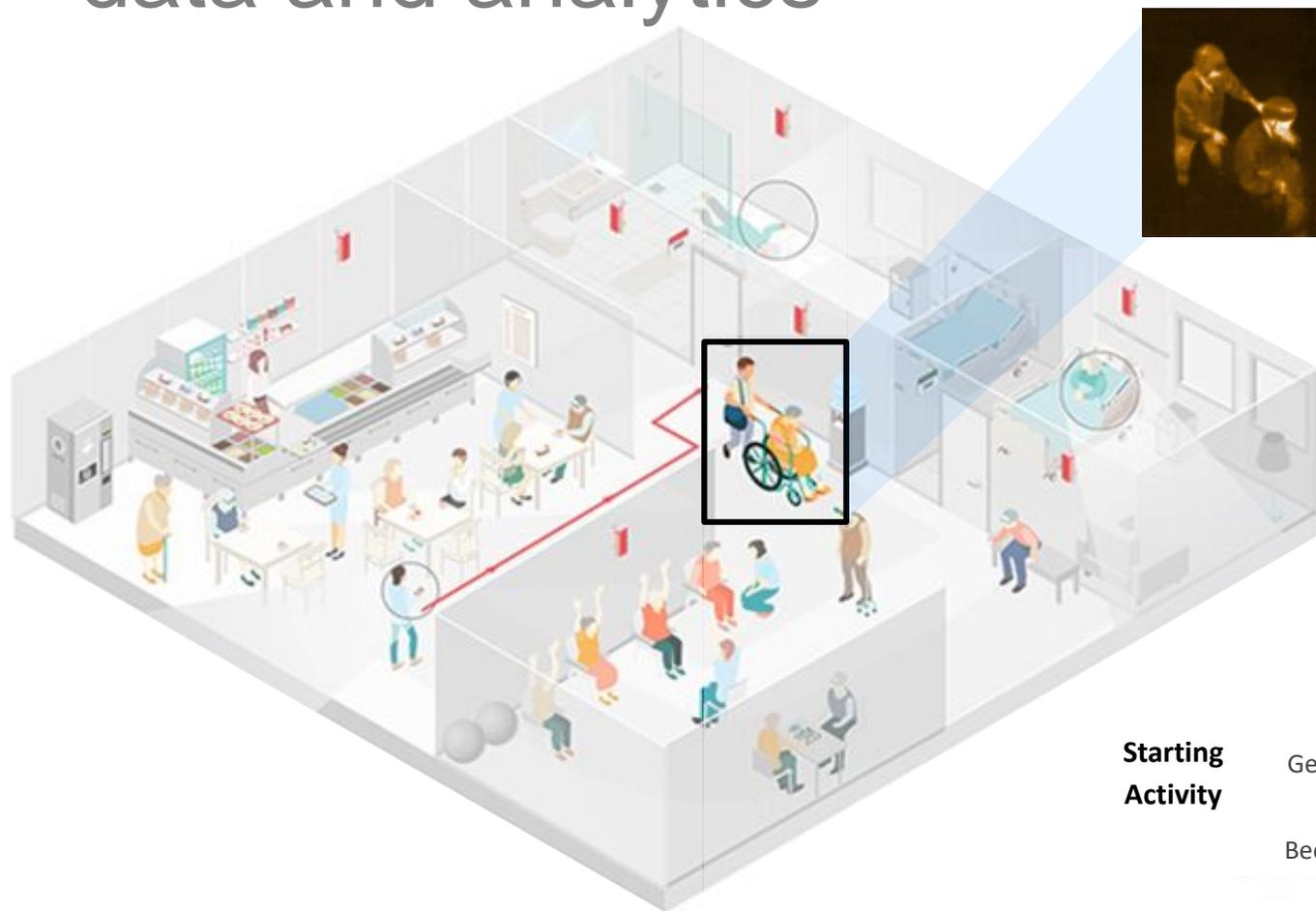
Get patient  
back in bed



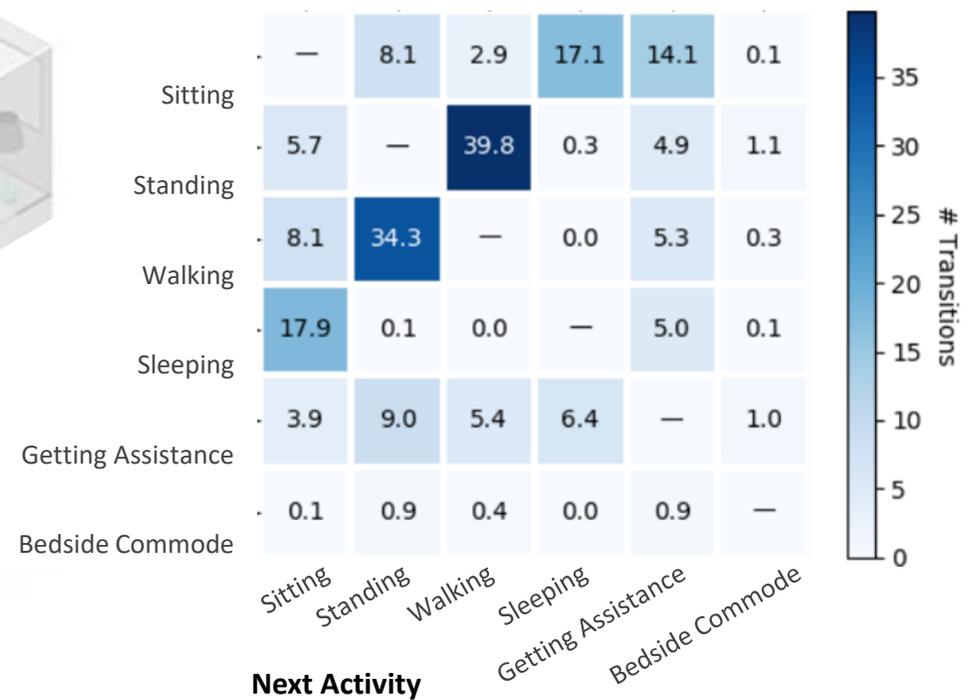
Get patient  
out of chair



# And turn their daily activities into a rich source of data and analytics



Starting Activity

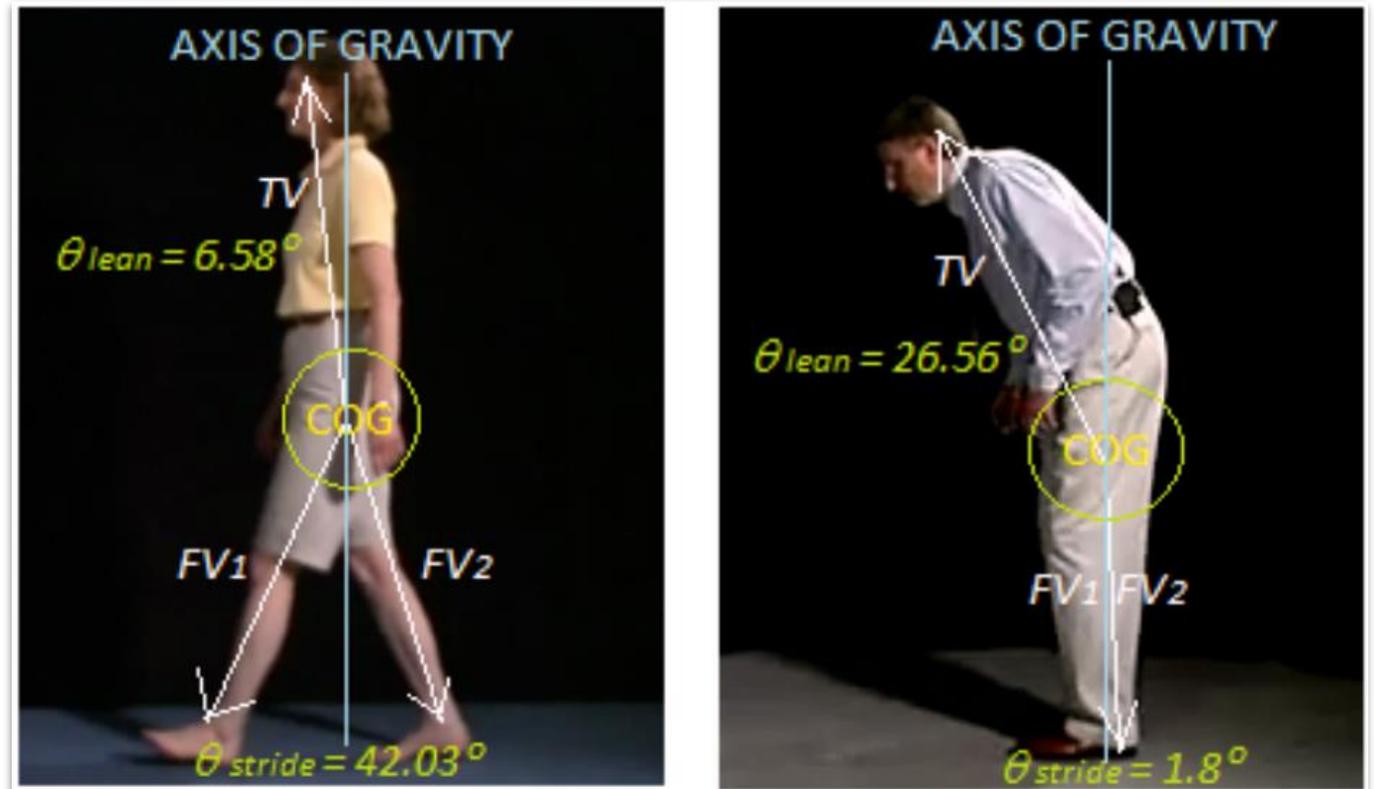


# AI for Fall Detection



Luo, Rege, Pusiol, Milstein, Fei-Fei (2017).

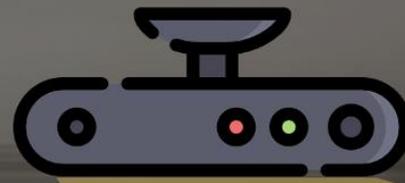
# AI for Parkinsonian Gait Detection



Khan, Westin & Dougherty (2013)

# COVID-19 Special

## How to take care of seniors while keeping them safe?



Early Symptom Detection of COVID-19



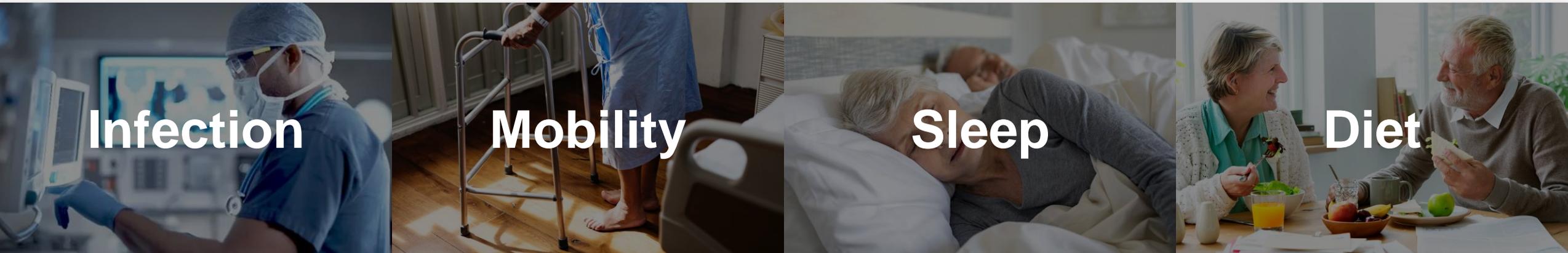
Monitor Patients with Mild Symptoms



Manage Chronic Conditions

# Descriptive analytics of clinical status

Can be further interpreted by clinicians and family members



**Infection**

**Mobility**

**Sleep**

**Diet**

Fever

Urinary frequency

Respiratory rate

Falls

Slowed movements

Unstable transfers

Front door loitering

Immobility

Sleeping

Day/night reversal

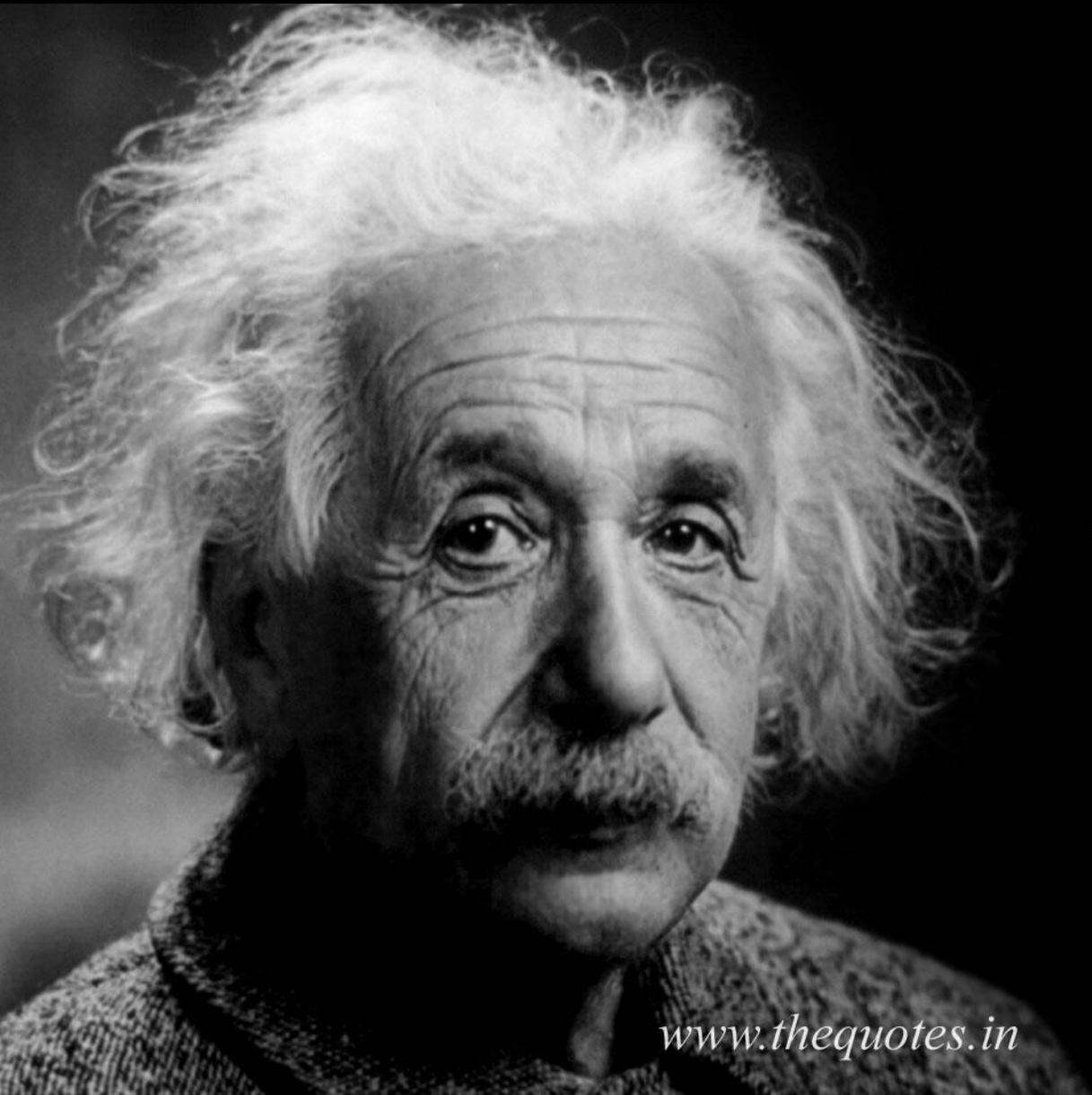
Eating

Fluid intake

Alcohol consumption

Pill consumption

Part II:  
**Ensuring AI is Human-Centered**

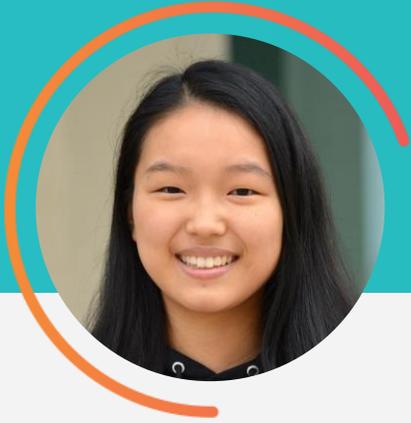


It has become appallingly obvious  
that our technology has exceeded  
our humanity.

*Albert Einstein*

[www.thequotes.in](http://www.thequotes.in)

# The Future of AI



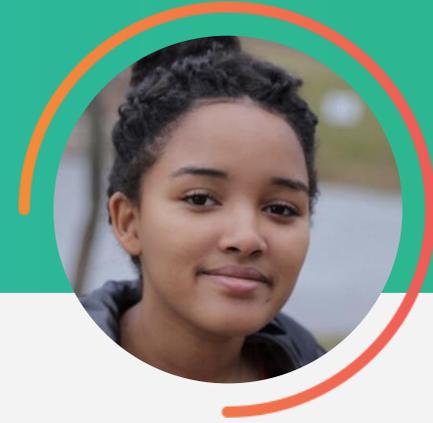
Amy Jin, College Sophomore  
AI4ALL ALUM

- First author on paper about using neural nets to provide surgeons with feedback on surgical technique.
- Won Best Paper at Machine Learning for Health at NeurIPS 2017.



Stephanie Tena-Meza,  
12th Grade  
AI4ALL ALUM

- Researching AI-assisted methods for tracking the flow of contaminated water in her hometown of Salinas, CA.
- Started AI club at local middle school, which has been running for 3 years.



Bekah Agwunobi, College Freshman  
AI4ALL ALUM

- Research intern at MIT
- 2018 winner of National Center for Women & Information Technology National Award (NCWIT)



AI4ALL (2015- present)

SFU

**SEATTLEU** SIMON FRASER UNIVERSITY  
ENGAGING THE WORLD

**W** PAUL G. ALLEN SCHOOL OF COMPUTER SCIENCE & ENGINEERING

**BOSTON UNIVERSITY**



**Carnegie Mellon University**

**Penn Engineering**  
GRASP LABORATORY  
General Robotics, Automation, Sensing & Perception Lab



**PRINCETON UNIVERSITY**

**UCSF**  
University of California San Francisco

**Berkeley**  
UNIVERSITY OF CALIFORNIA



**Stanford University**

**ASU**  
Arizona State University



**Georgia Tech** Center for Education Integrating Science, Mathematics & Computing





**Stanford University**  
Human-Centered  
Artificial Intelligence

To advance AI research, education, policy and practice  
to improve the human condition.



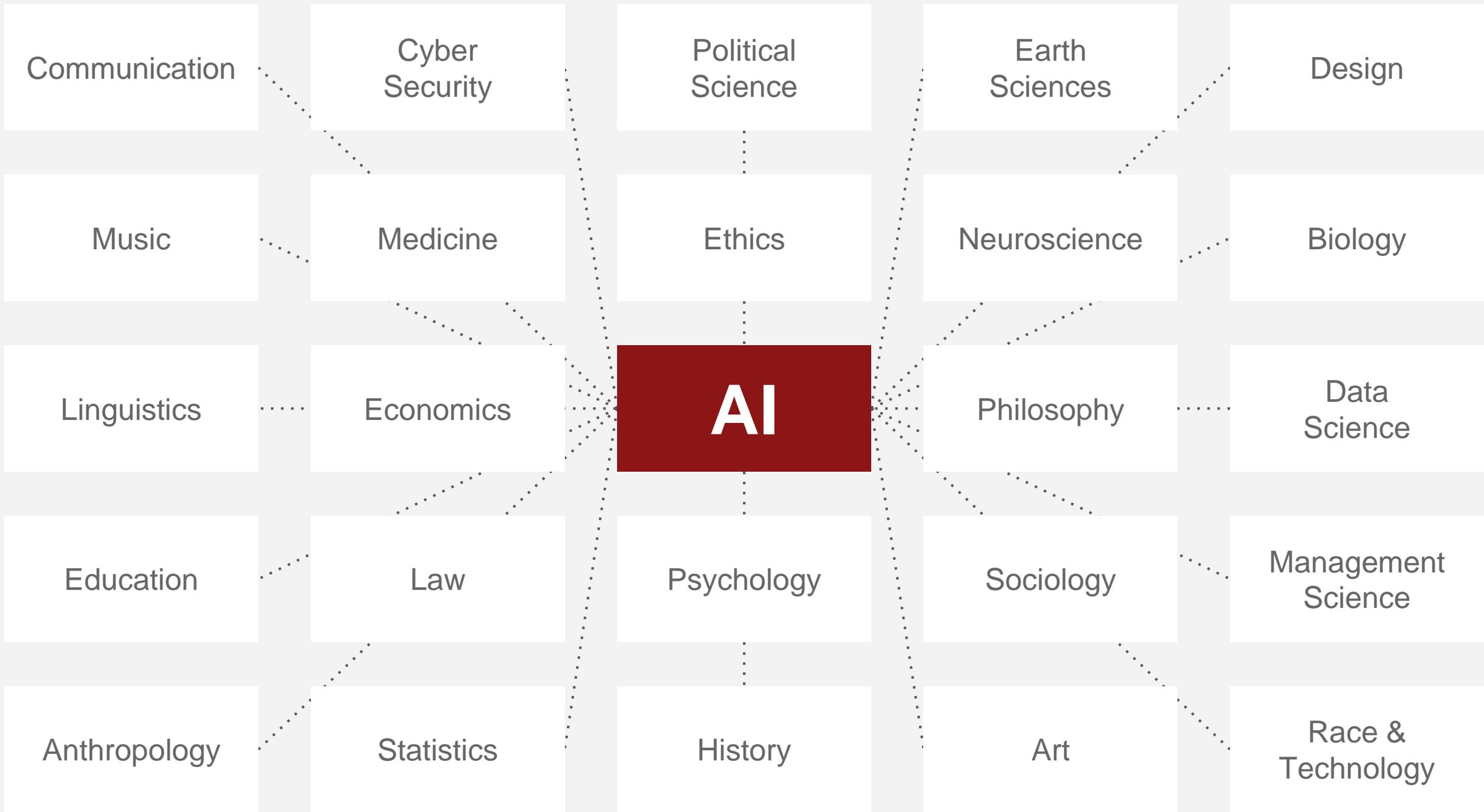
The development of  
AI must be guided  
by a concern for its  
**human impact.**

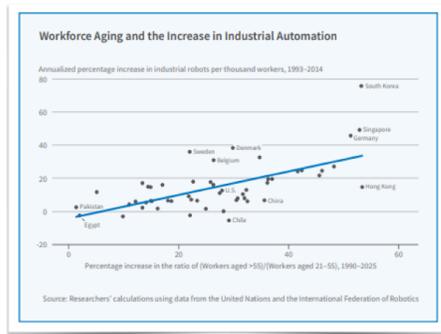


AI should strive to  
**augment** and  
enhance us, not  
replace us.

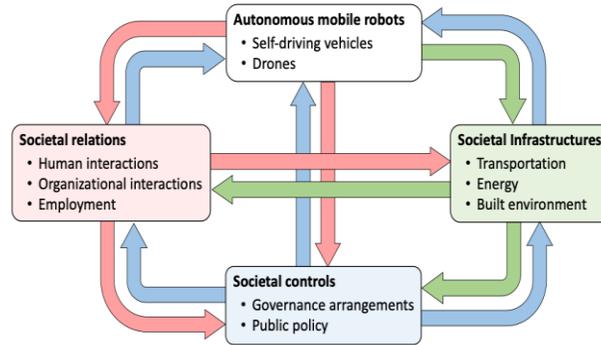


AI must be more  
inspired by human  
**intelligence.**

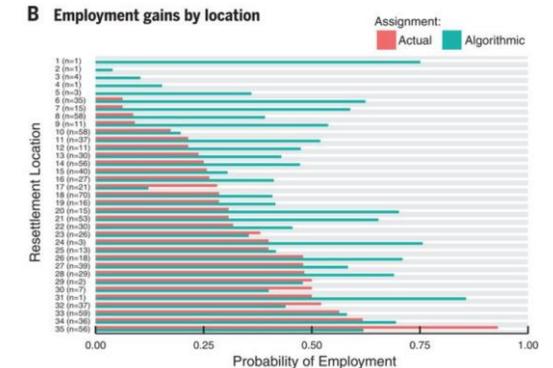




Prof. Susan Athey (Economics)  
**AI + Future of Work**



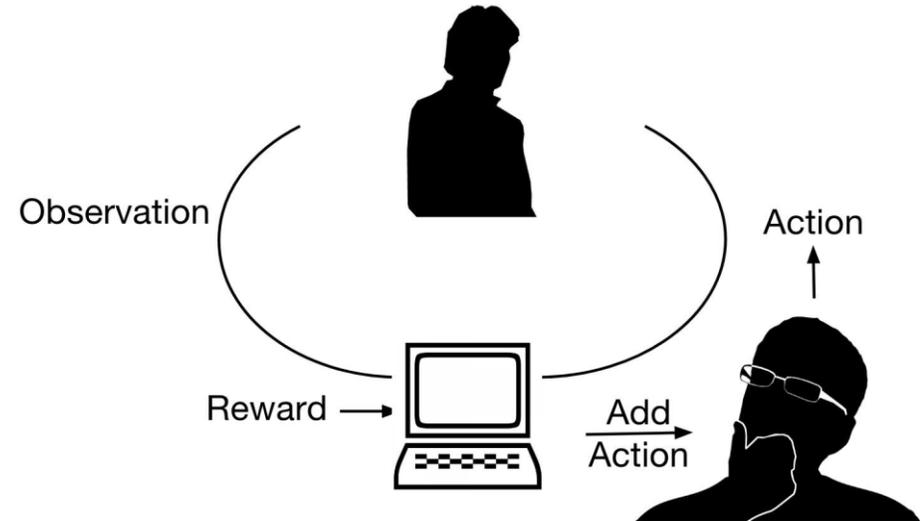
Profs. Marco Pavone (AA), David Grusky (Soc), Mark Duggan (Econ)  
**Societal Impact on Autonomous Robots**



Prof. Jens Heinmueller (Pol. Sci.)  
**AI + Refugee Policy**



## Human in the Loop Reinforcement Learning



*Goal: Choose actions to maximize expected rewards*

## Reinforcement Learning in Education

Prof. Emma Brunskill & collaborators, Stanford University



# From ML Bias To ML Fairness



Prof. Rob Reich  
(Political Science)



**Computers, Ethics, and Public Policy**  
**Winter 2019 M/W/F 1:30-2:50 PM**  
**Cubberley Auditorium**

Course Website: [cs181.stanford.edu](https://cs181.stanford.edu)

Professor Rob Reich  
[reich@stanford.edu](mailto:reich@stanford.edu)

Professor Mehran Sahami  
[sahami@cs.stanford.edu](mailto:sahami@cs.stanford.edu)

Professor Jeremy Weinstein  
[jweinst@stanford.edu](mailto:jweinst@stanford.edu)

CASE STUDY

**ALGORITHMIC DECISION-  
MAKING AND ACCOUNTABILITY**

CASE STUDY

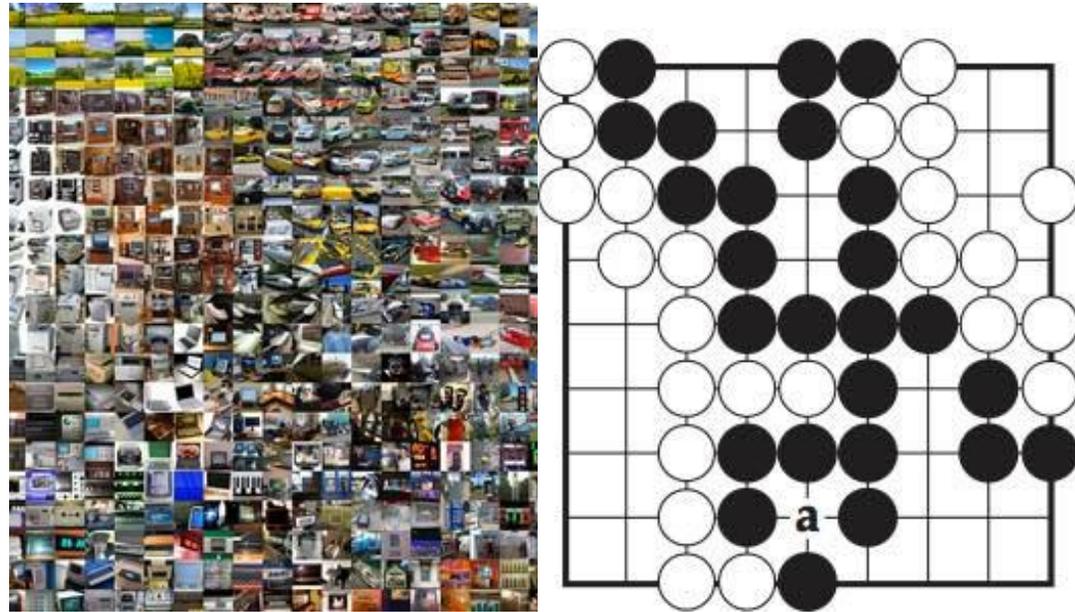
**PRIVATE PLATFORMS**

CASE STUDY

**AUTONOMOUS VEHICLES**

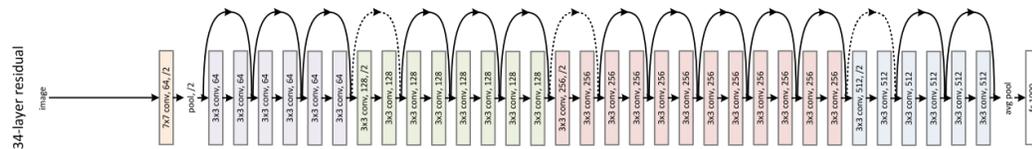
# Today's AI

Static, Simple goals,  
Disembodied

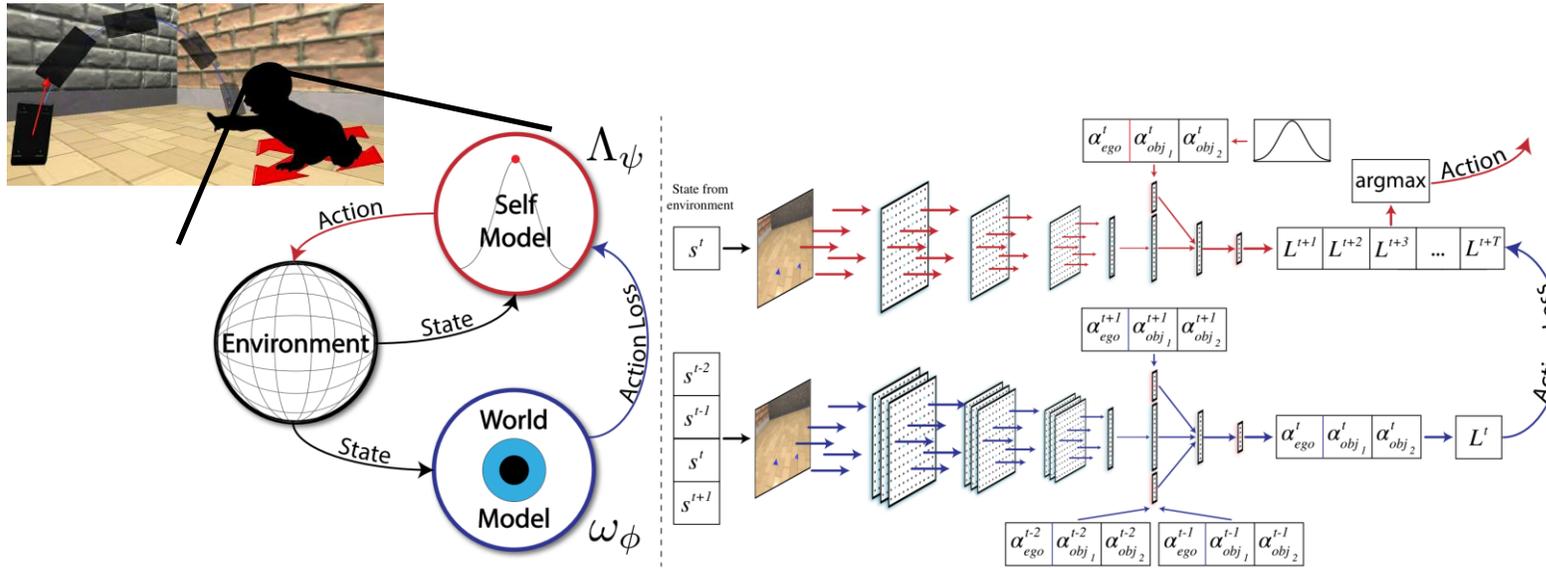


# Human

Dynamic, Multi-sensory, Complex,  
Uncertain, Interactive



# Curiosity-driven Learning for AI Agents (Profs. Dan Yamins, Nick Haber, Li Fei-Fei)



**World Model** network:  
to predict consequences  
of actions

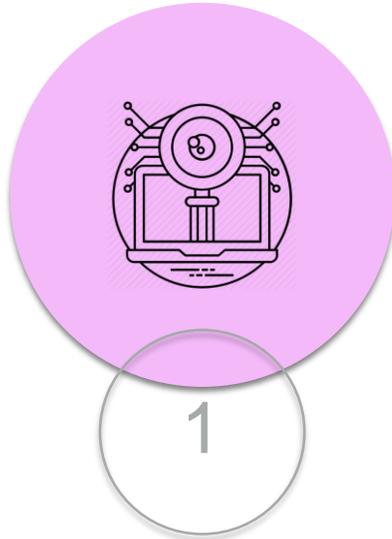
**Self Model** network:  
to predict errors of  
world-model  
("self-aware")

Action choice:  
self-model is **adversarial**  
to world-model ("curious  
intrinsic motivation")



Artist in Residence (2019): Stephanie Dinkins

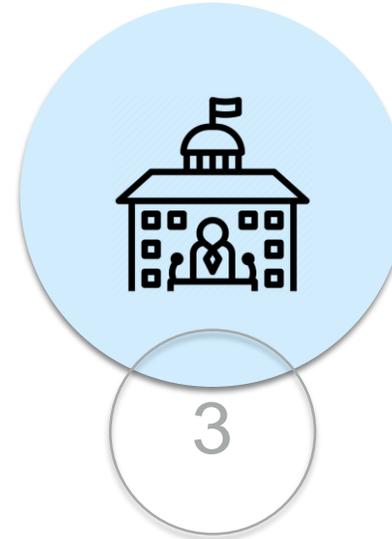
# Our Goals



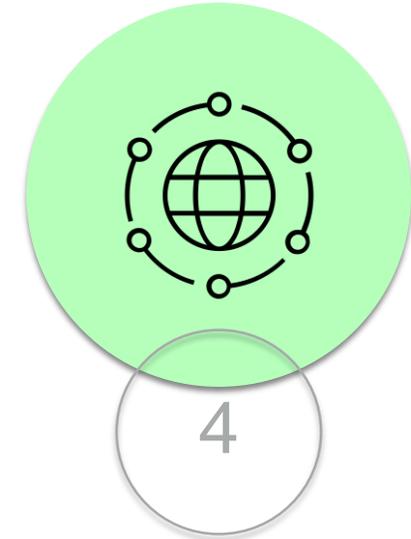
Conduct breakthrough **interdisciplinary research** at the forefront of AI technology, impact and application



Create **educational programs** for a wide range of external constituencies



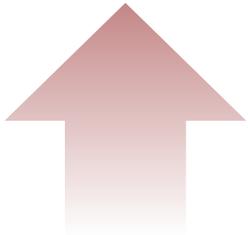
Become a global leader **shaping policies** and practices to guide AI technology



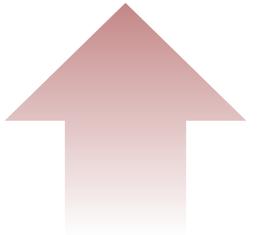
**Act as a hub** for an international community of like-minded organizations

Part III:  
**The National Research Cloud**

Our nation's talent reflects the rapid growth of AI.

**4%** 

Average growth rate in AI  
PhDs from **2010-2017**

**22%** 

Average growth rate in AI  
PhDs in **2018**

**A growing problem:** The resources necessary to innovate in AI are virtually **inaccessible** outside the world's biggest corporations and a handful of elite universities.



**High-Performance  
Compute**

# \$1.5 Million

To train Google's next-  
generation Chatbot

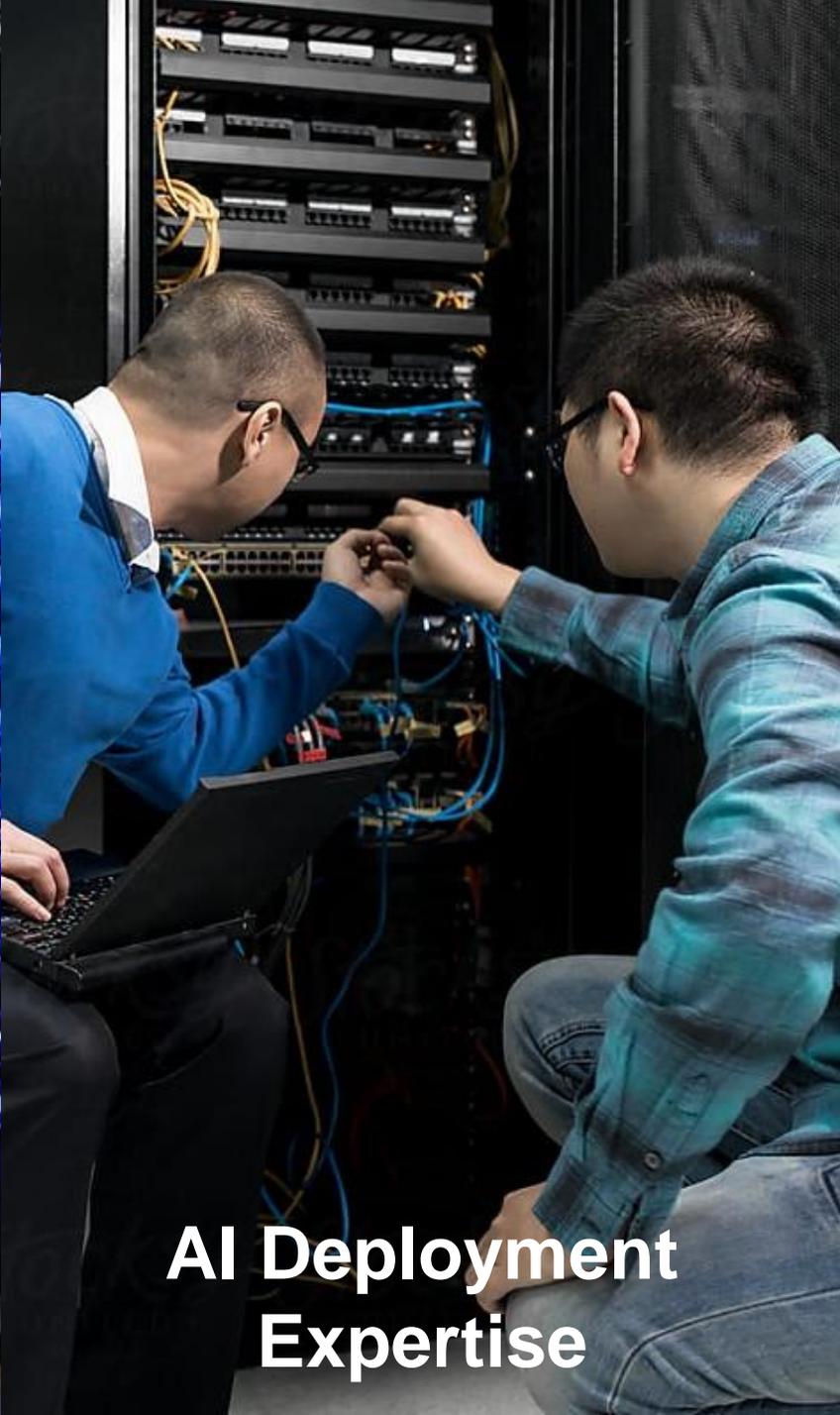
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# 300,000x+

Increase in compute overhead  
needed for AI leadership in the  
past 6 years



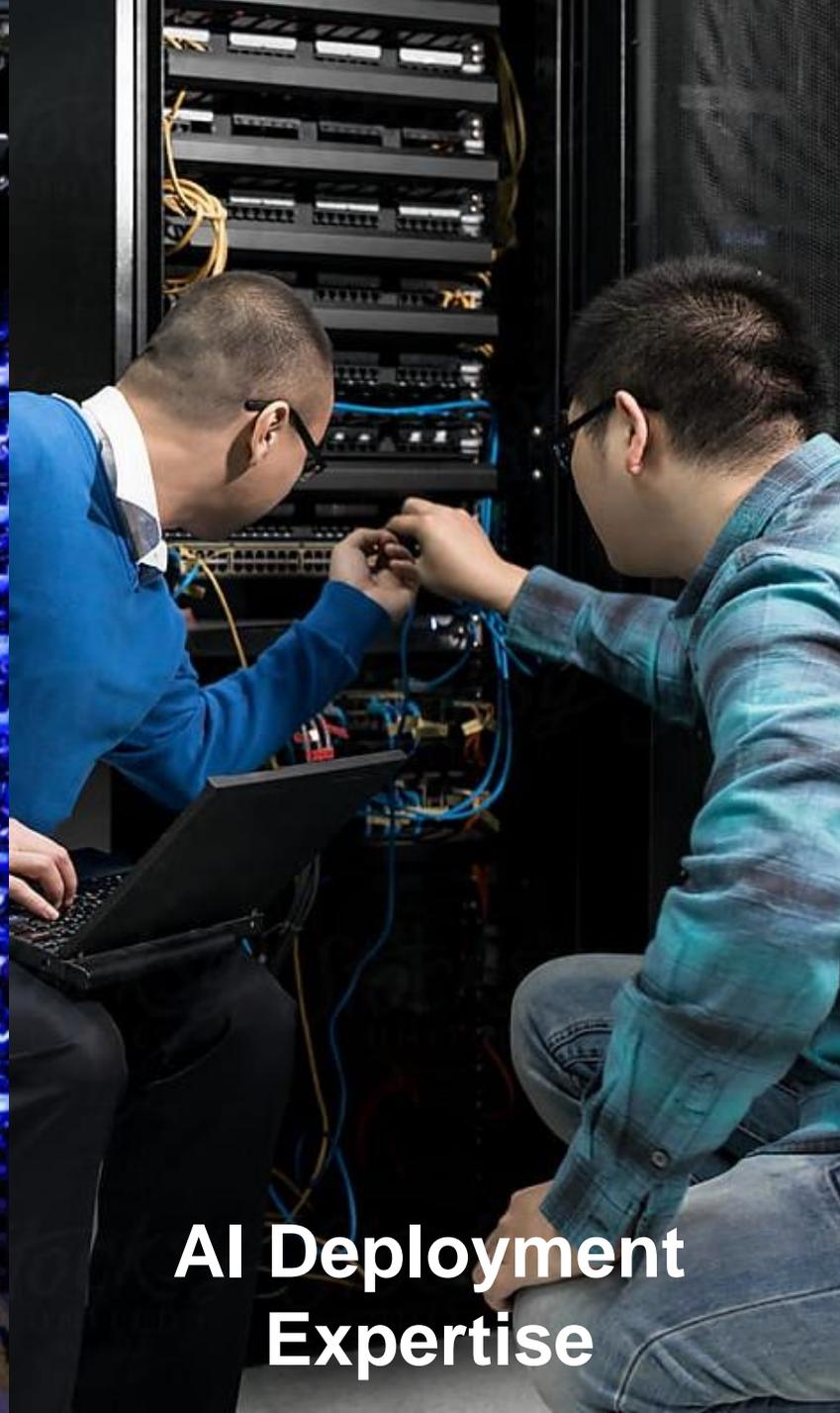
**High-Performance  
Compute**



**AI Deployment  
Expertise**



**High-Performance  
Compute**



**AI Deployment  
Expertise**



**Large-Scale  
Datasets**

We propose convening a task force to explore the creation of a **National Research Cloud**, to democratize the resources required to innovate in AI.

# The National Research Cloud



## **Democratizing Compute**

Substantially-discounted  
access to state-of-the-art AI  
hardware at scale.

## **Democratizing Expertise**

The personnel necessary to  
deploy these technologies  
across the country.

## **Democratizing Data**

Safe, secure access to high-  
quality, large-scale data that  
preserves privacy.

An expert-led task force can ask the right questions and present a robust strategy:



How can we keep research secure?

How can we keep data private at a national scale?

Who can we partner with for optimal results?

Support for the NRC is strong in academia...



...as well as the NSCAI.



**America is a country of incredible talent. It's time to build the infrastructure to harness it—and ensure it continues into the next generation.**

**Thank you.**



**Stanford**  
University



**Stanford University**  
Human-Centered  
Artificial Intelligence