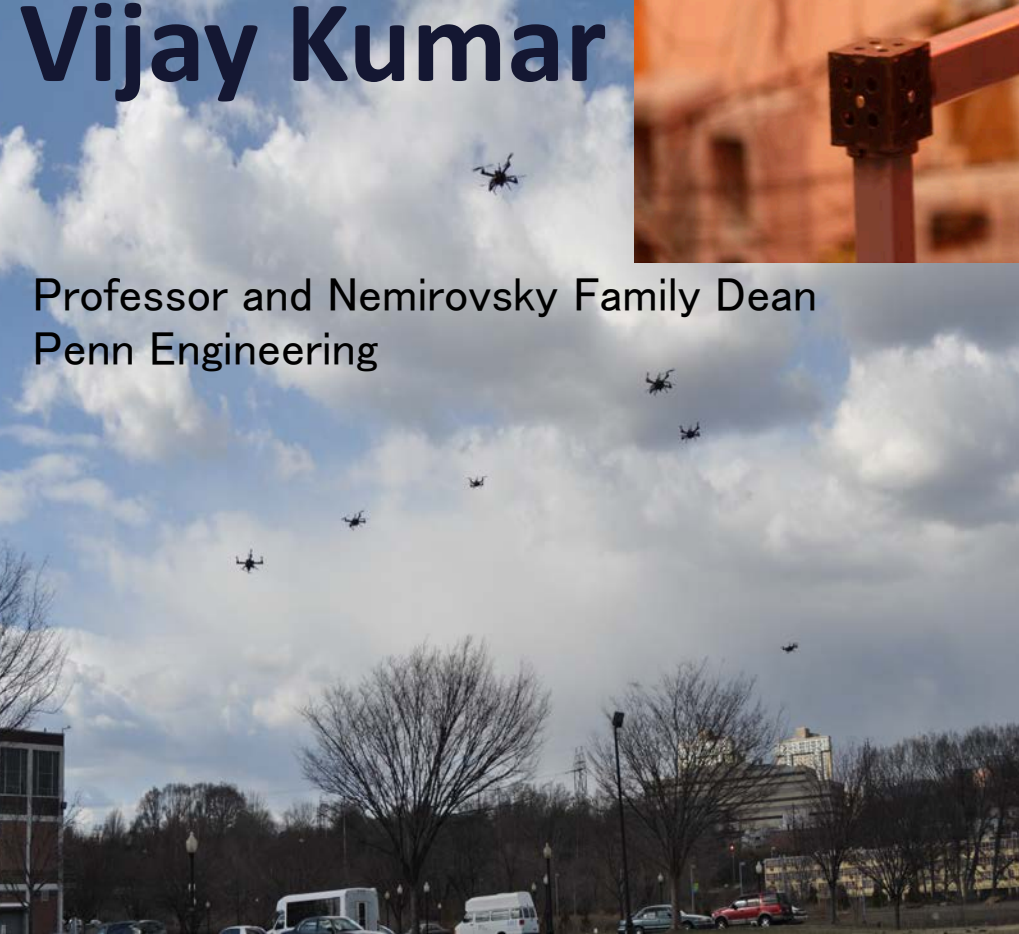
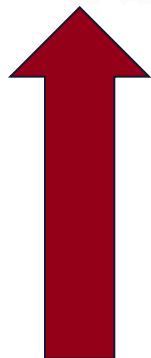
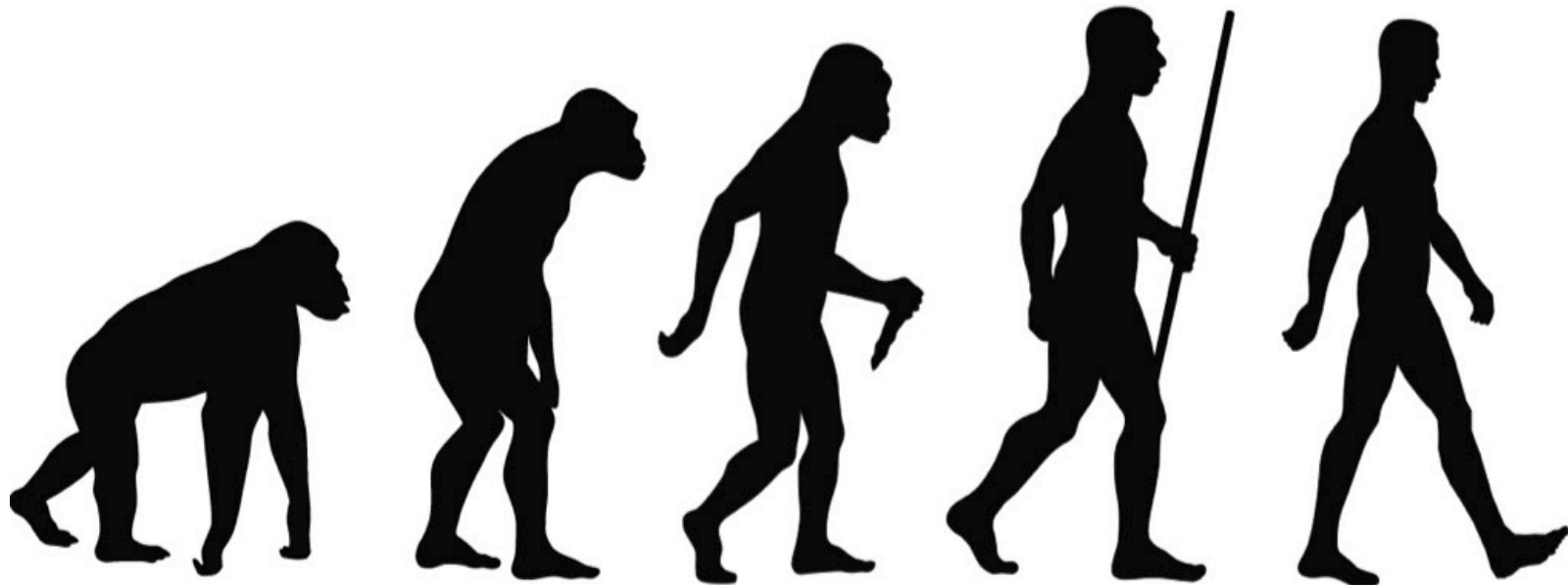


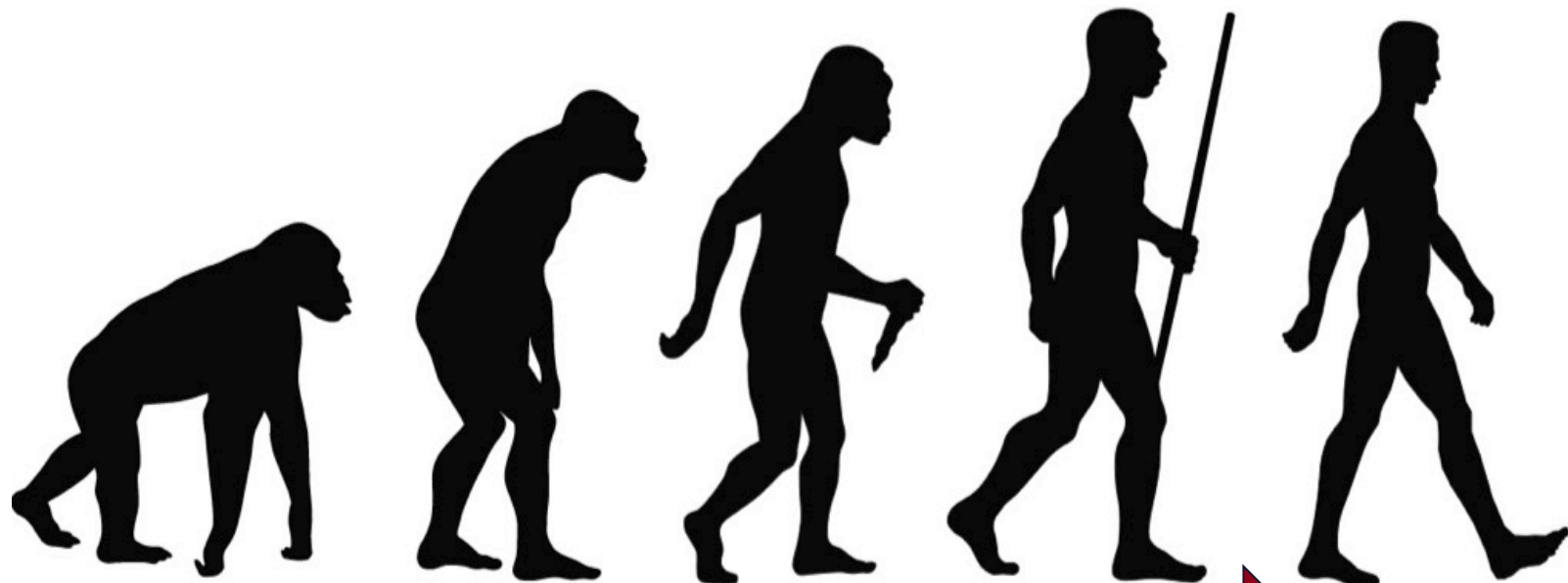
Vijay Kumar

Professor and Nemirovsky Family Dean
Penn Engineering





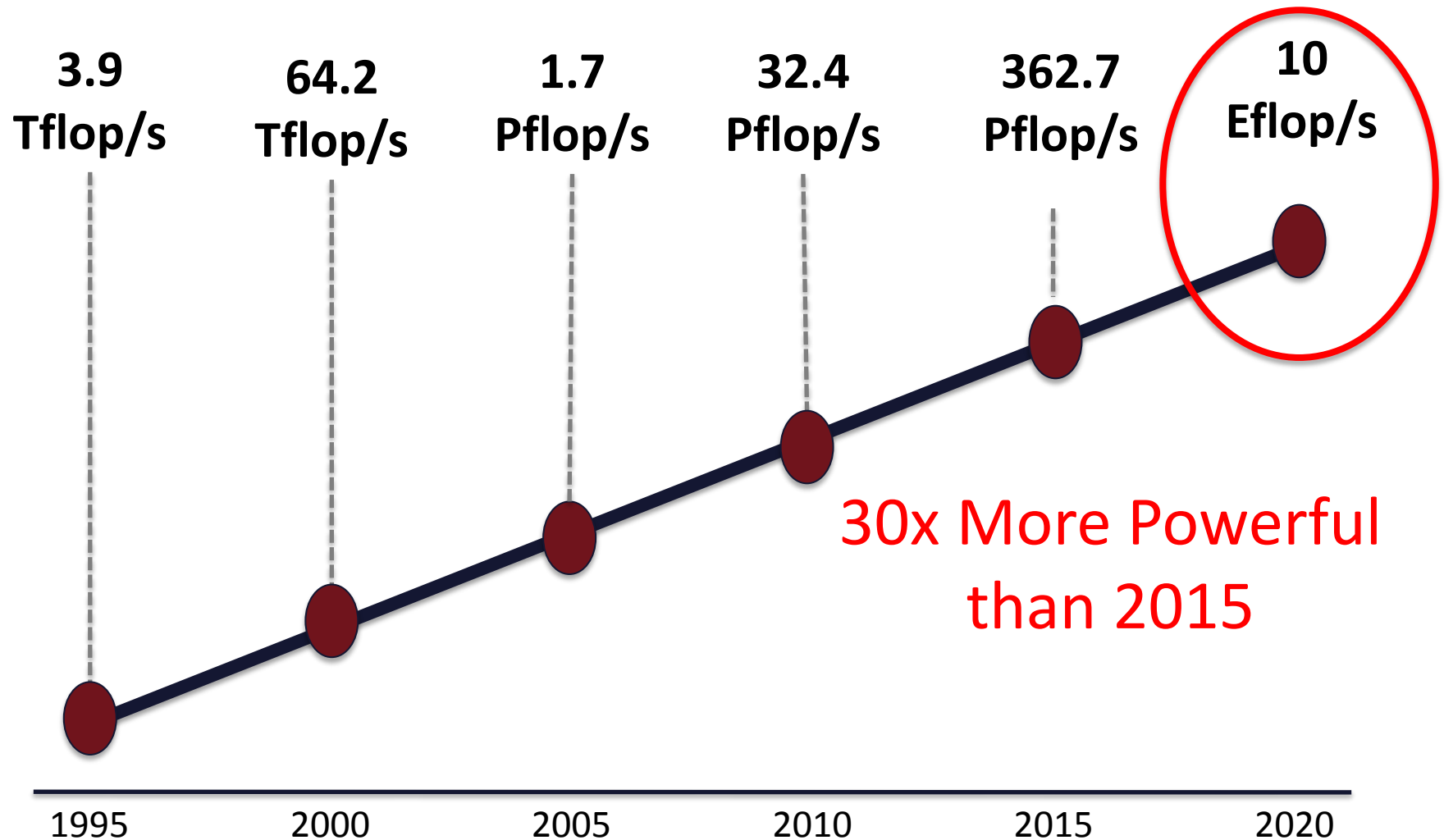
We are here!





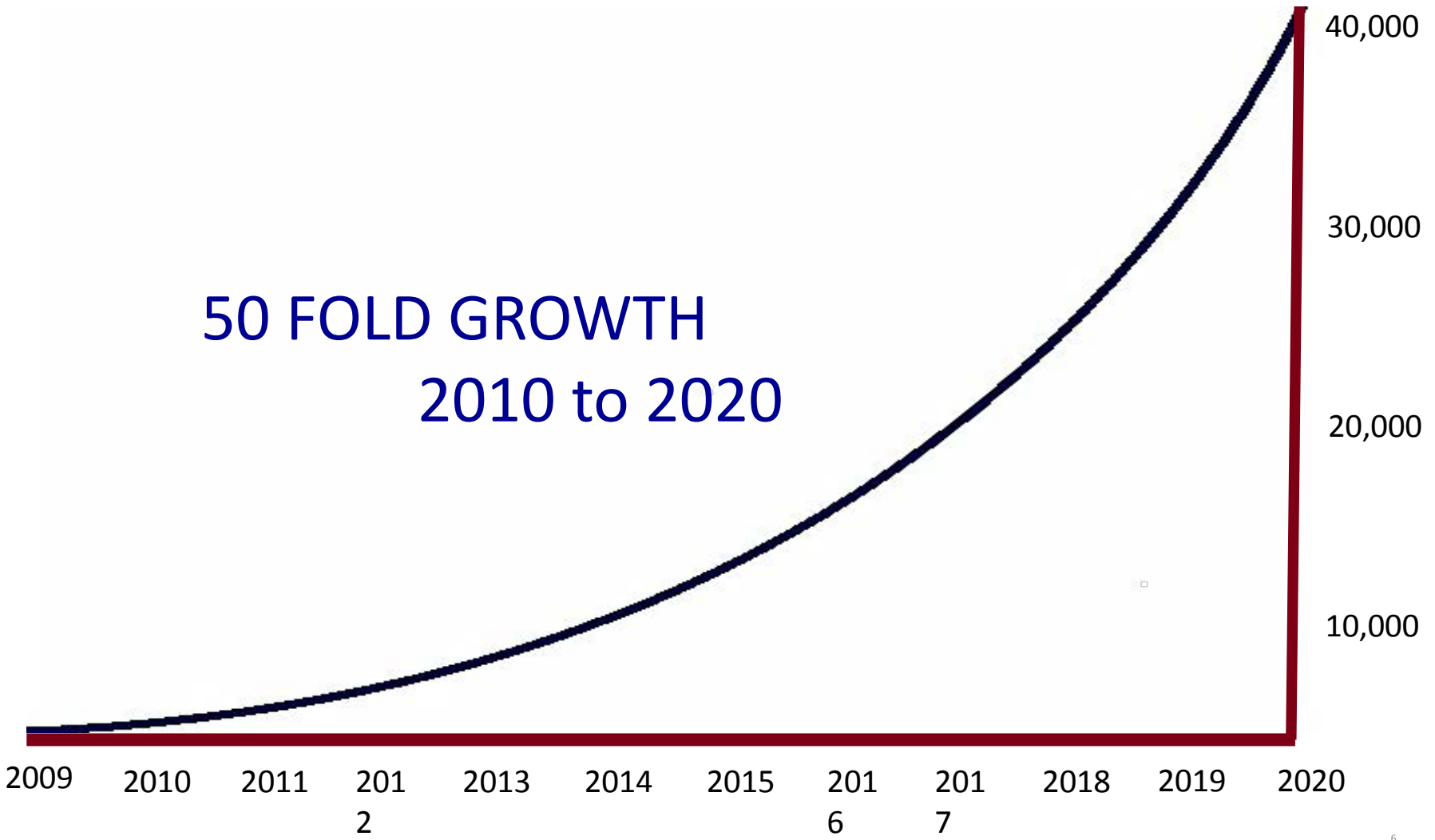
*I knew who I was
this morning, but
I've changed a
few times since
then.*

Alice in Wonderland,
Lewis Carroll

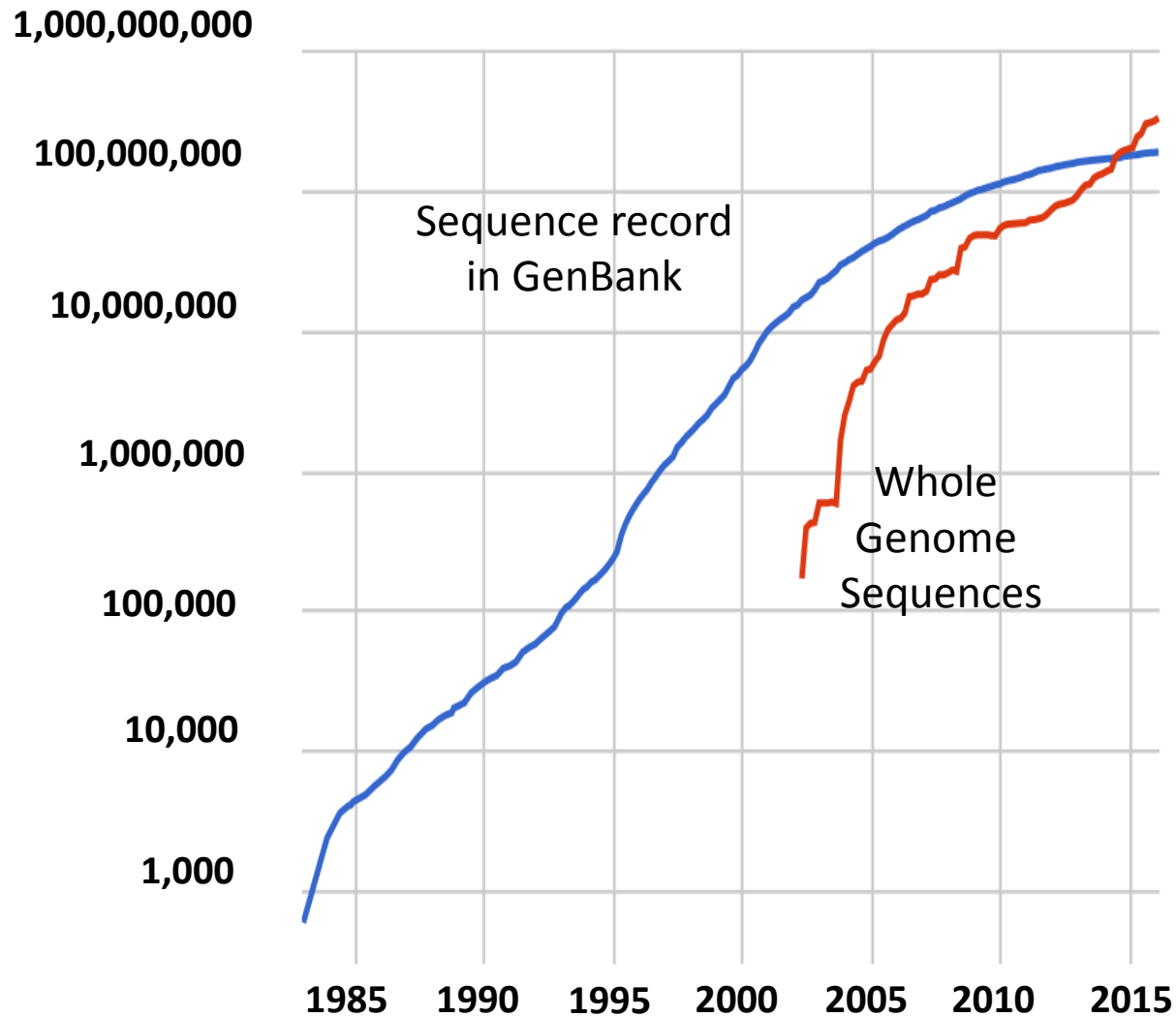


Exabytes

50 FOLD GROWTH
2010 to 2020



DNA Sequencing



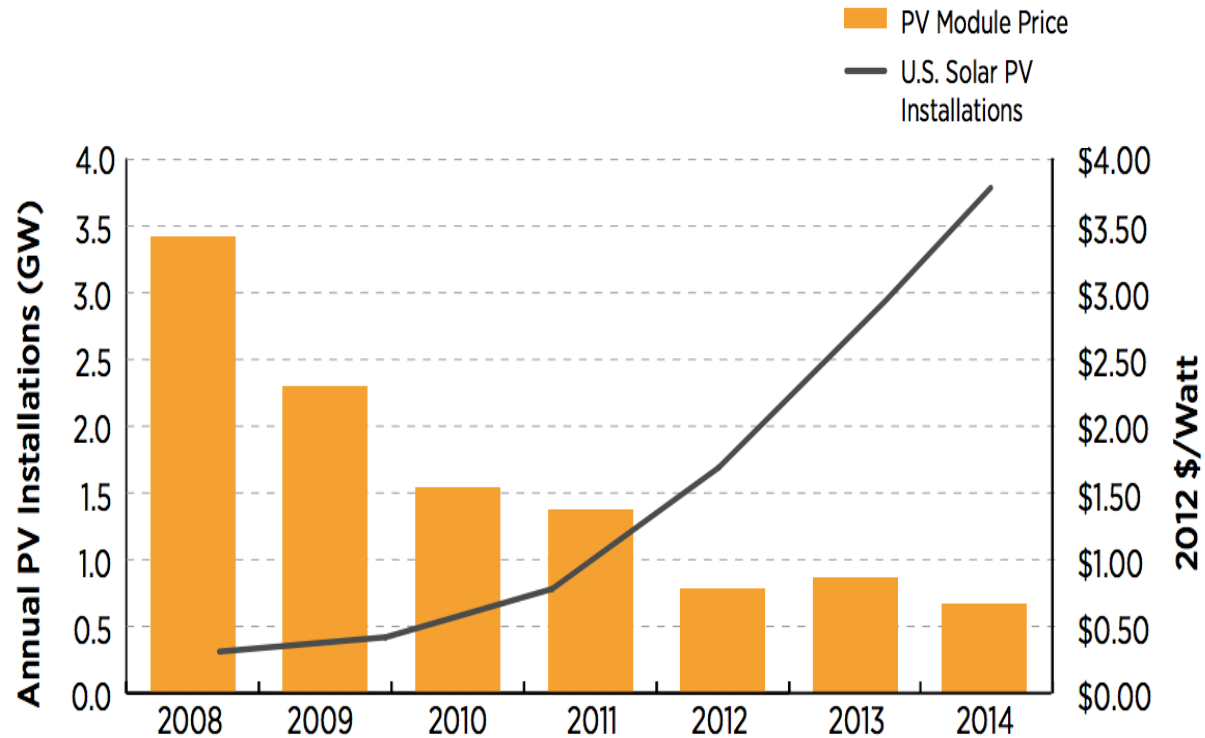
Cost of **X** is Decreasing

$X = \{\text{computation, communication, sensing, energy, manufacturing, ...}\}$

- Computing: \$/M transistors - 33%/year
- Storage: \$/GB – 38%/year
- Bandwidth: \$/Gb/s – 27%/year

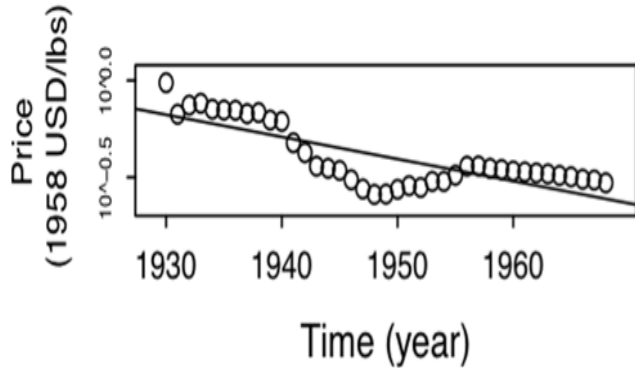
Cost of Solar Power

75% over
last 5 years

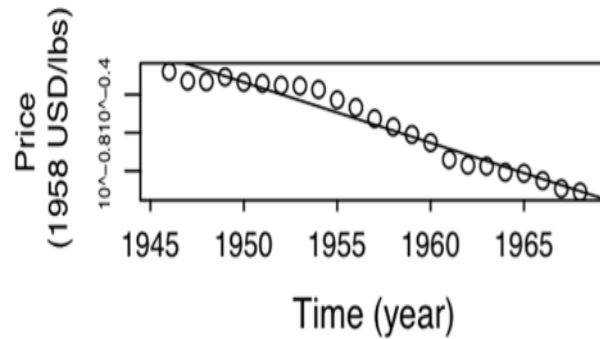


$X = \{\text{materials, components, products}\}$

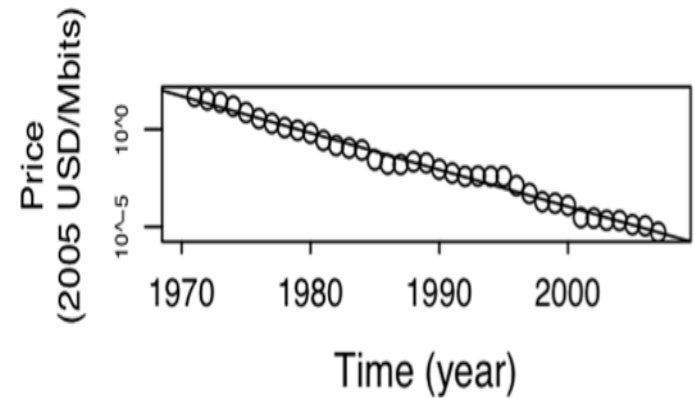
Primary Magnesium



Polyvinylchloride



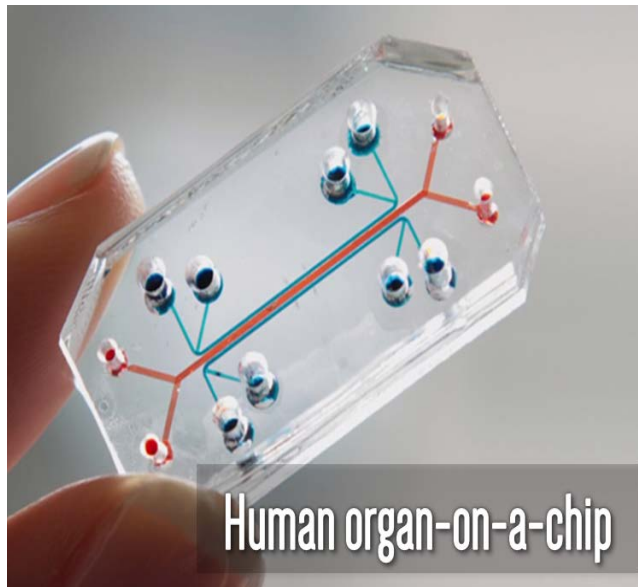
DRAM



Cost/Speed of 3D Printing



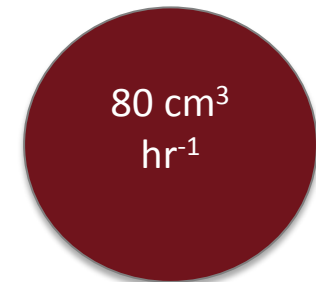
MakerBot



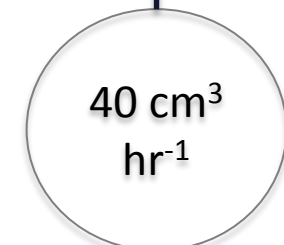
Dan Huh, Bioengineering

Printing Speed

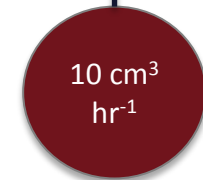
2023



2018



2013



- 1 Cost of creating hardware and software is decreasing
- 2 Time to ideate, create, test and redesign is decreasing

More players...

More shots on goal...

More scores...

Higher scoring game ...



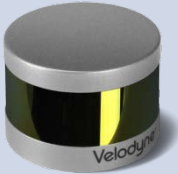

Attract better talent ...

*The rate of
technology
innovation is
accelerating!*

3rd Industrial Revolution



Light weight sensing

Model	Range	Resolution	Weight*	Power	Cost
 <p>HDL-64E</p>	120 m. 26.8° vertical FOV	< 2 cm. 0.08° (azimuth) 0.4° (elevation)	13.2 kg.	60 W	\$75K
 <p>HDL-32E</p>	100 m. 41° vertical FOV	±2 cm. 0.1° - 0.4° (azimuth) 1.33° (elevation)	1 kg.	12W	\$30K
 <p>VLP-16 (Puck)</p>	100 m. 30° vertical FOV	±3 cm. 0.1° - 0.4° (azimuth) 2° (elevation)	830 g.	8 W	\$7999
 <p>VLP-16 Lite</p>	100 m. 30° vertical FOV	±3 cm. 0.1° - 0.4° (azimuth) 2° (elevation)	590 g.	8 W	\$9399

Light weight computing

Computer	Intel NUC (i3-5010U)	Intel NUC (i5-5250U)	Intel NUC (i7-5557U)	Odroid XU3 (Exynos 5422)	Qualcomm Eagle (Snapdragon 801)
Cores	2	2	2	4	4
Clock Speed (GHz)	1.7	2.1	3.1	2	2.5
MFLOPS (Single-Core)	1900	2730	3440	1030	1200
MFLOPS (Multi-Core)	4250	5400	7480	4270	4350
Mass (g)	210	210	210	38	27
MFlops / g (Single-Core)	9.05	13	16.38	27.11	44.44
MFlops / g Multi-Core)	20.24	25.71	35.62	112.37	161.11

Robots for Everyone



“Your smart phone is your robot!”

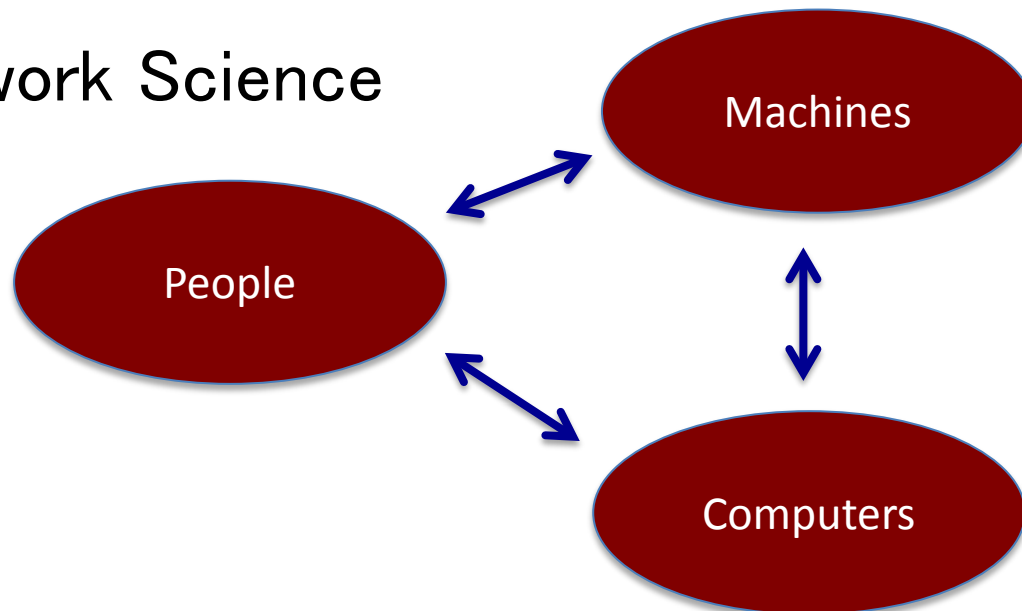
Matt Grob, CTO Qualcomm

Two big enablers for AI

Data Science



Network Science



- Most challenging domain: cyber physical systems

Six myths about AI and autonomy

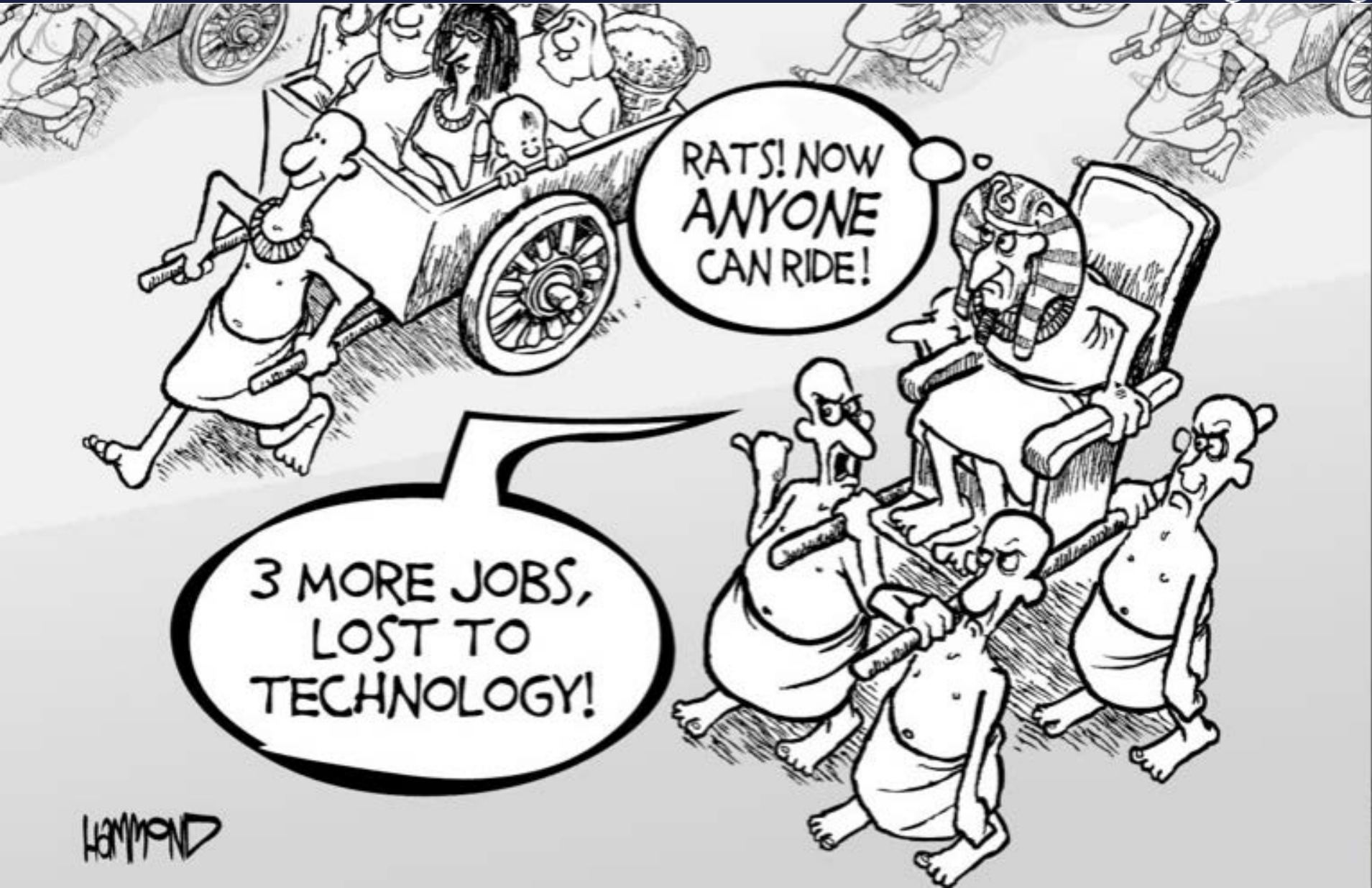


- The ability to crunch through large amounts of data (which we mistakenly call learning) does not translate to knowledge
- The ability to make complex calculations rapidly does not translate to autonomy
- 99.99% correct is exponentially harder to achieve than 90% correct
- Perception + action is exponentially harder than just perception
- Tasks with physical contact is exponentially harder than tasks like driving or flying
- Human machine collaboration is impossible unless they share representations. We only know how to do this at some very simple levels

Data, Information, Networks and Society

Democratization of S&T (opportunity and threat)

Democratization of Technology



Democratization of S&T (opportunity and threat)

Jobs

Asymmetric threats (easy to write “bad” programs)

Safety

Cyber security

Privacy

2016

Type of Job	Qualification	Wages
Highly skilled, analytical, making decisions	Advanced degree, tech skills balanced with emotional judgment	\$\$\$\$
Analytical, drawing inferences	College degree	\$\$\$
Modest skills, some labor	High school education	\$\$
Unskilled labor	reading/writing	\$

Social Disruption

2020

Type of Job	Qualification	Wages
Highly skilled, analytical, making decisions	Advanced degree, tech skills balanced with emotional judgment	\$\$\$\$
Analytical, drawing inferences	College degree	\$\$\$
Modest skills, some labor	High school education	\$\$
Unskilled labor	reading/writing	\$



Democratization of S&T (opportunity and threat)

Jobs

Asymmetric threats (easy to write “bad” programs)

Safety

Cyber security

Privacy

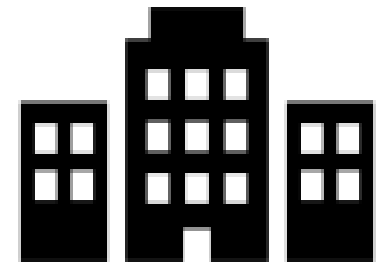
Water

Food

Health

Energy

Infrastructure



Technology is central to addressing all these challenges!

Innovation is global

Autonomy in Cyber Physical systems will be difficult to achieve

Time scale of technology change (years) is much shorter than time scale of a human (decades)

Social challenges: safety, security, privacy, and jobs