



The Future Begins Here

intel® labs

Labs Day 2020 | December 3

The
Future
Begins
Here

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In Pursuit of 1000X:

Disruptive Research for the Next
Decade of Computing

Rich Uhlig

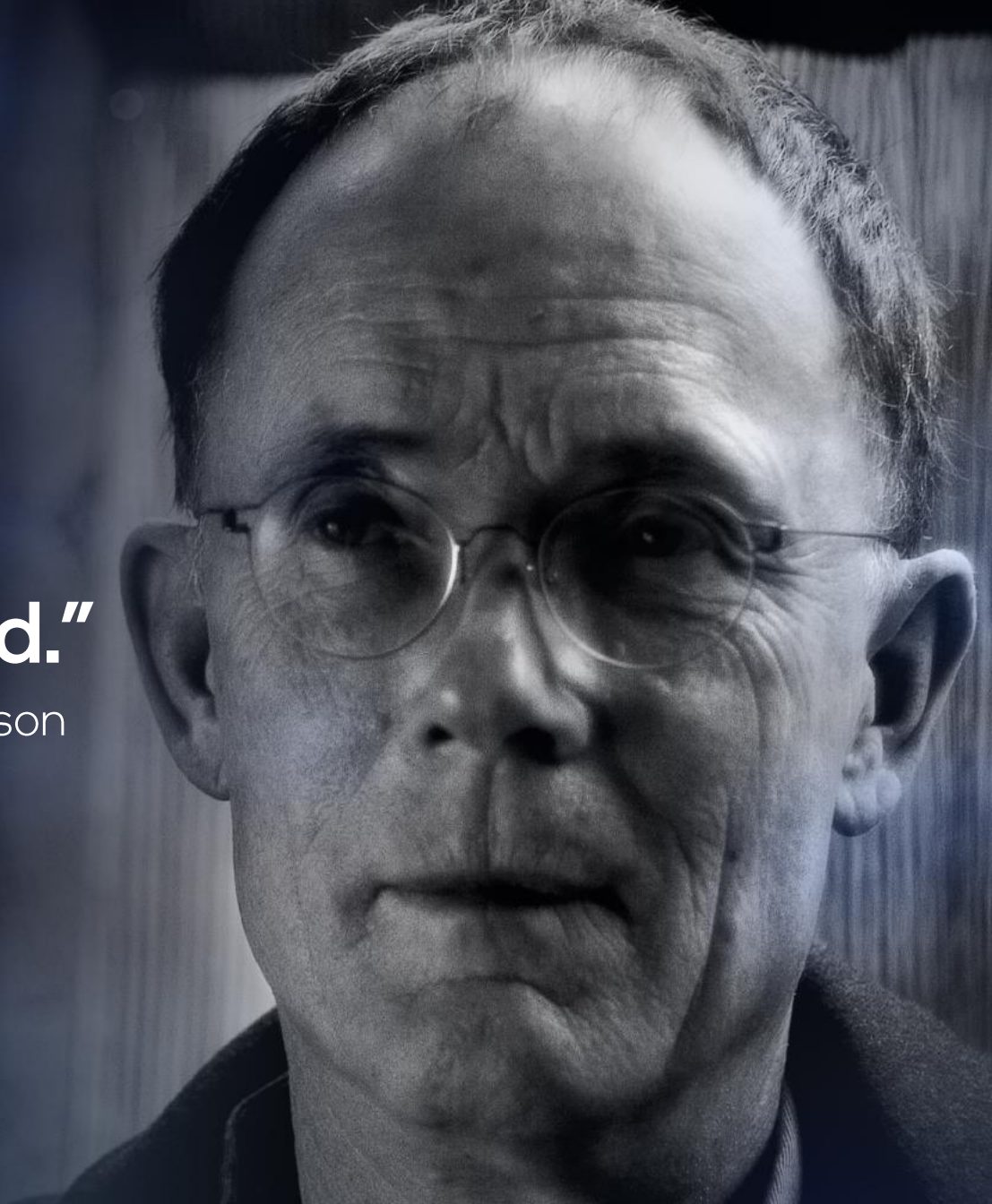
Intel Sr. Fellow, VP, & Director of Intel Labs

Labs Day 2020



**“The future is already here.
It’s just not evenly distributed.”**

William Gibson

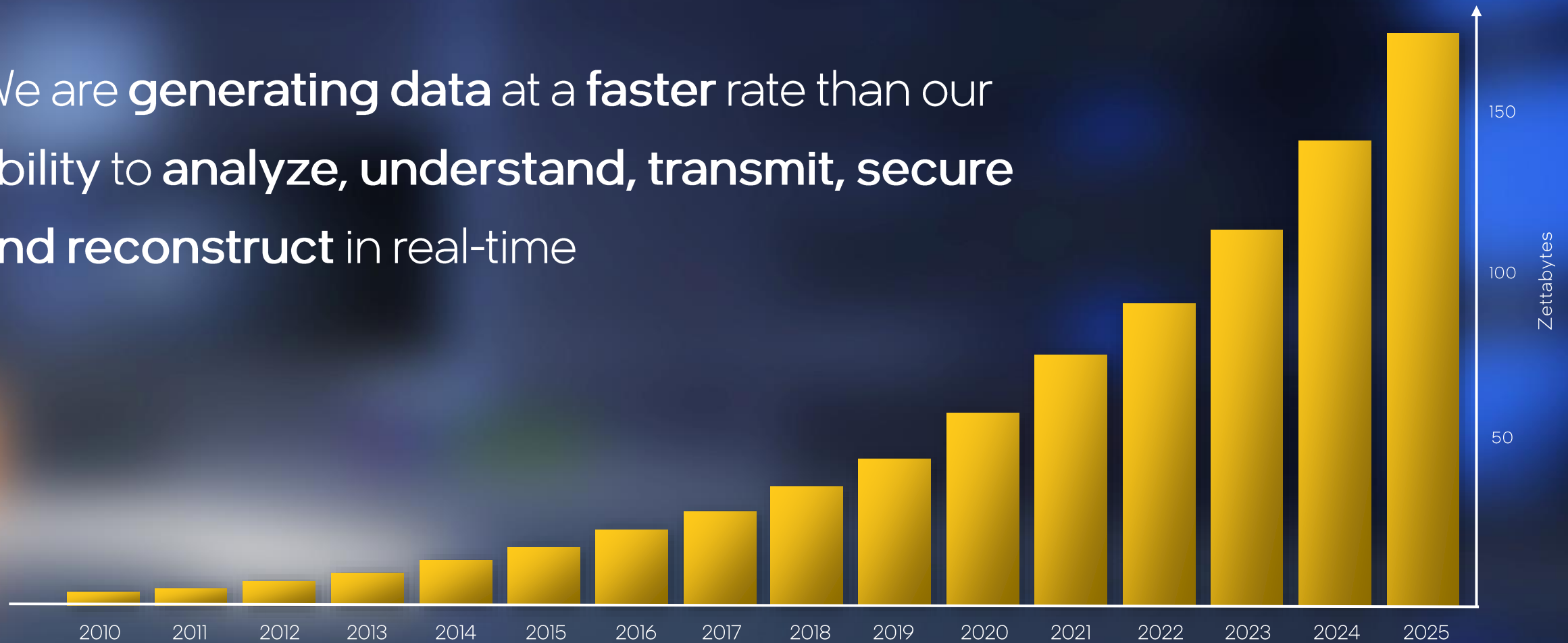




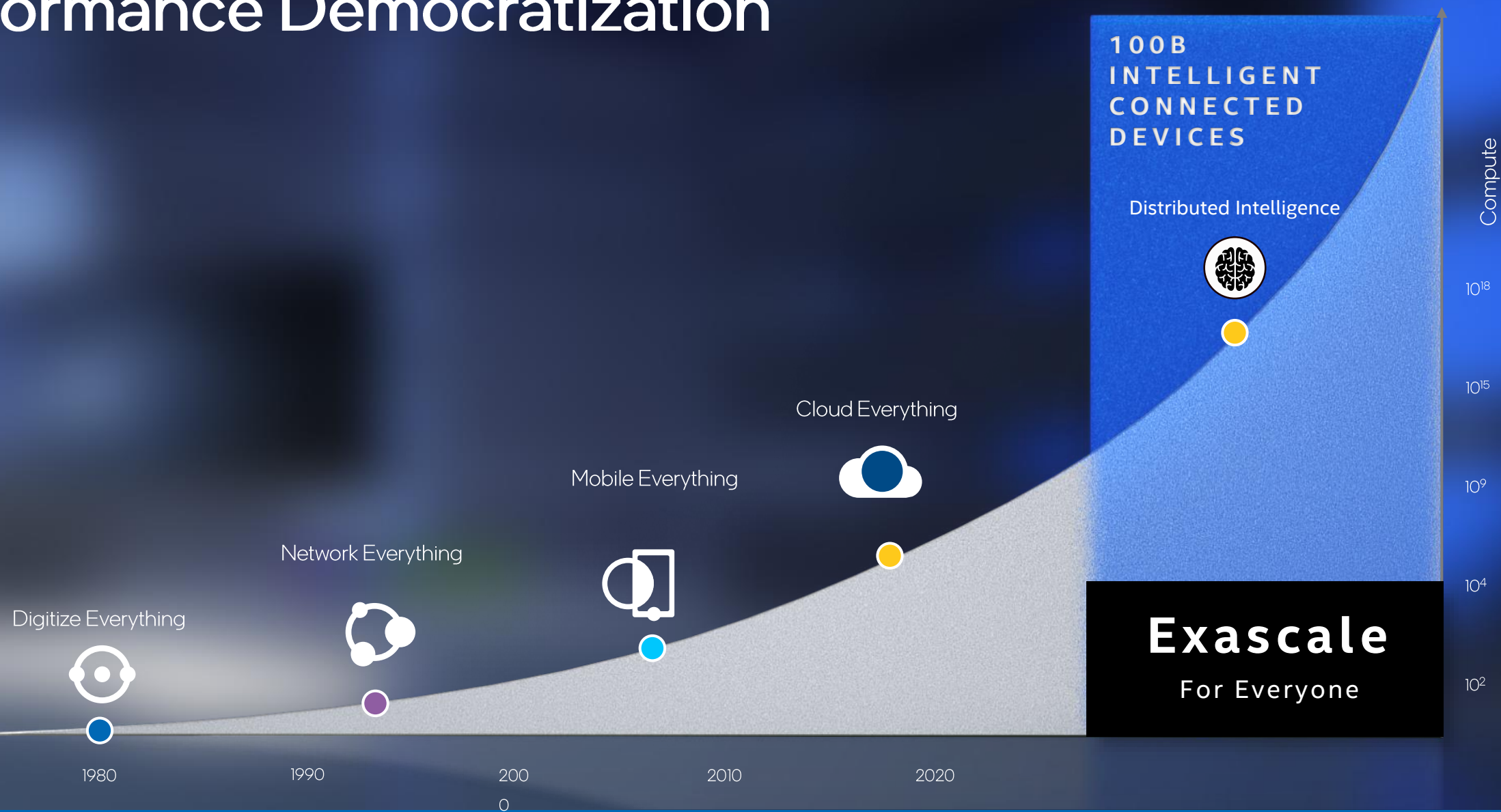
The Data Problem

We are **generating data** at a **faster** rate than our ability to **analyze, understand, transmit, secure and reconstruct** in real-time

175ZB



Performance Democratization





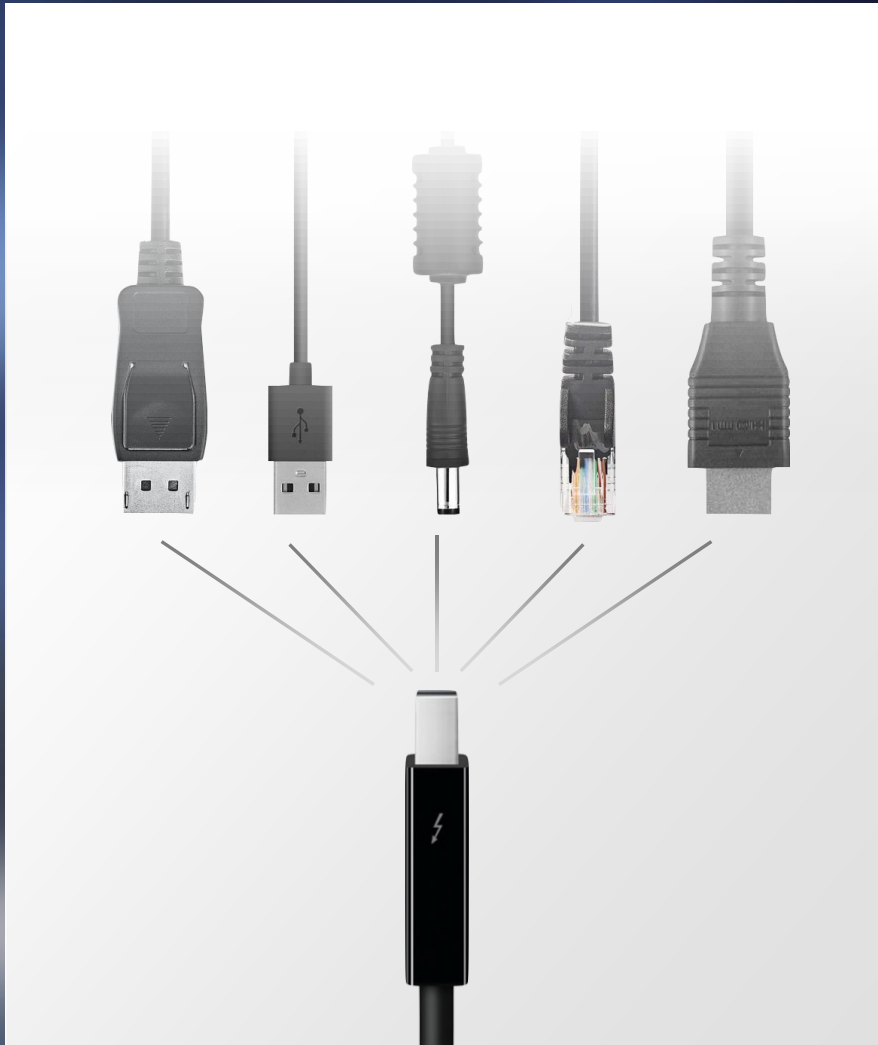
We create world-changing
technology that enriches the lives
of every person on earth



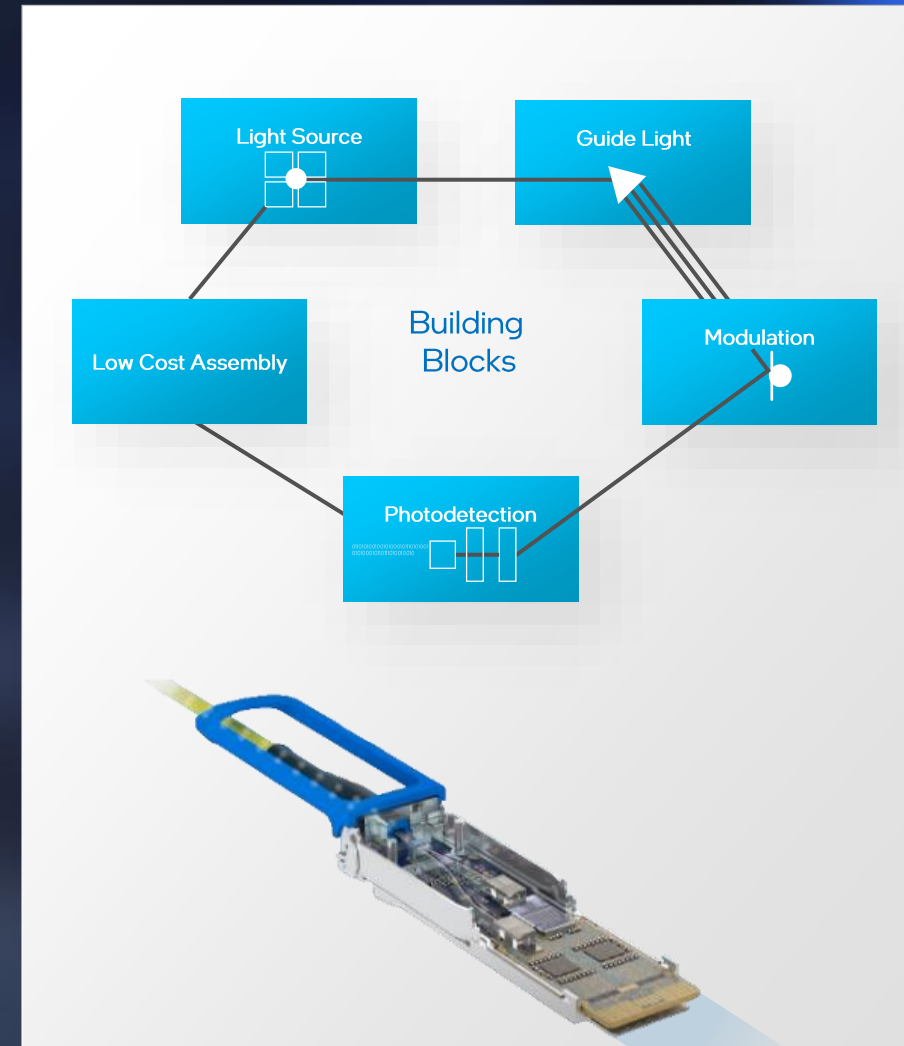
In Pursuit of
1000X

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USB & Thunderbolt



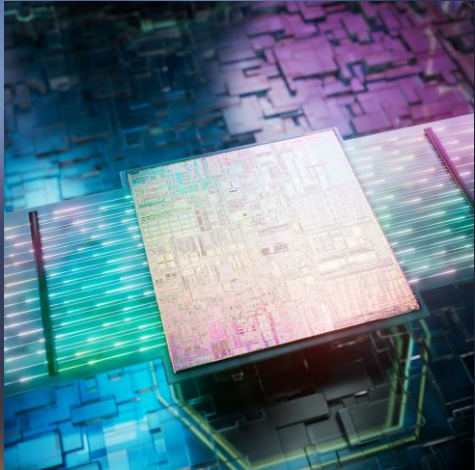
Silicon Photonics



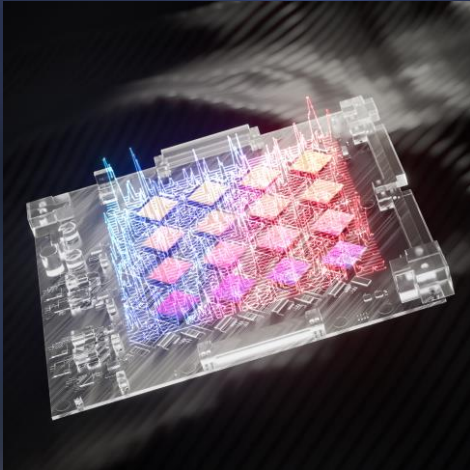


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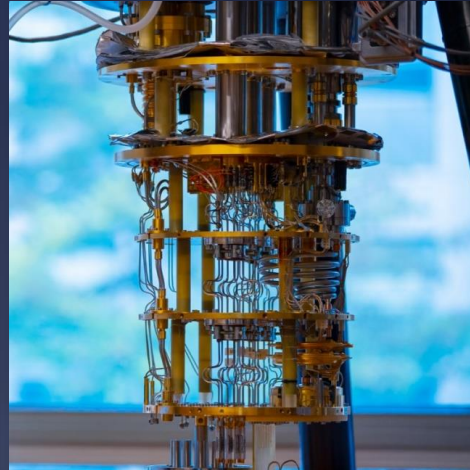
Today's Tracks



Integrated
Photonics



Neuromorphic
Computing



Quantum
Computing



Confidential
Computing



Machine
Programming



Integrated Photonics



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The
Future
Begins
Here

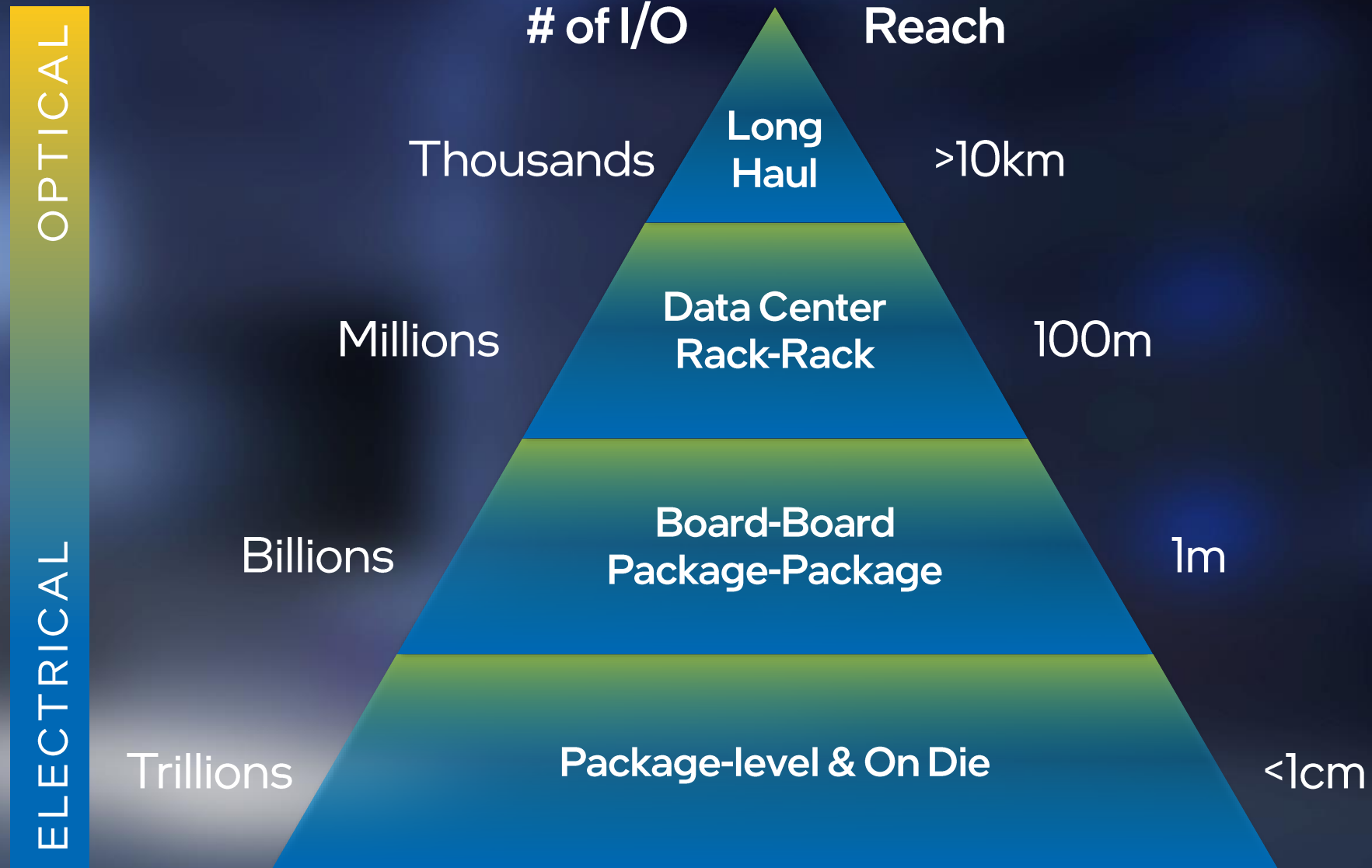
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Attacking the I/O Power Wall

James Jaussi

Senior Principal Engineer and
Director of PHY Research Lab

Labs Day 2020





Over
4 Million

Intel 100G transceivers shipped
to our customers

Integrated Photonics
Bringing optical I/O
directly into our servers
and onto our packages





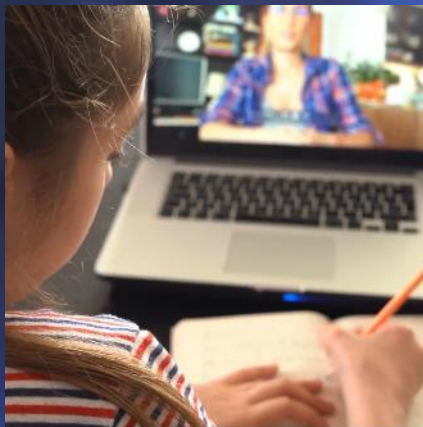
Millions to Billions
1000X



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intel.



Reach

>10km

100m

1m

<1cm

OPTICAL

ELECTRICAL

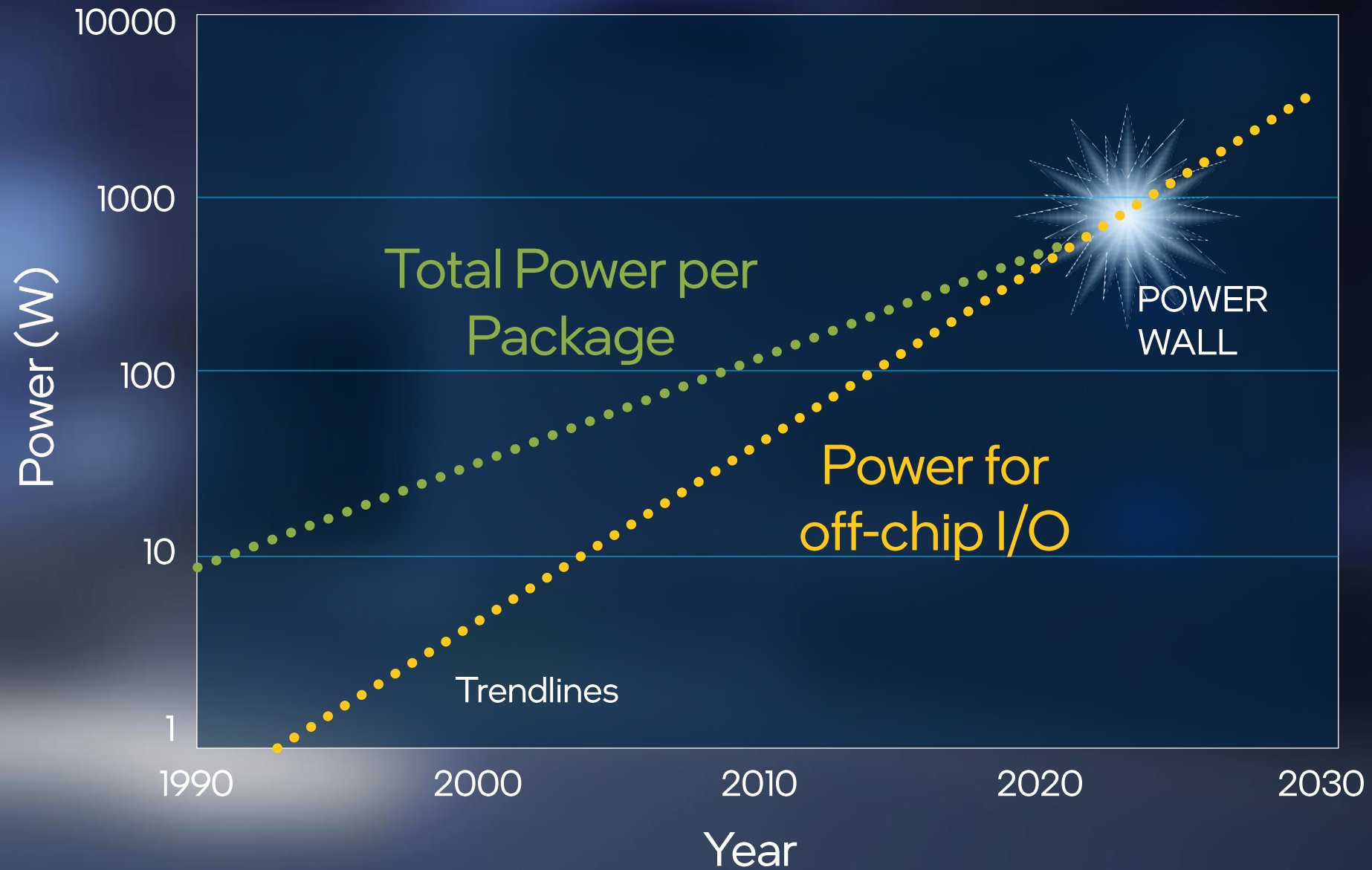
Electrical I/O

Theoretical Limit

Practical Limit

Link Performance

Electrical I/O is
performance-distance
limited



Credit: DARPA for trendlines



Integrated Photonics
will fundamentally
change compute I/O.

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Silicon Photonics Building Blocks

Light Source



Modulation
Mux/Demux



Guide/Amplify
Light



Detection



Integrated Photonics

Silicon Photonics
CMOS Electronics
Package Integration

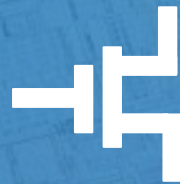
Light Source



Modulation
Mux/Demux



CMOS Circuits



Packaging



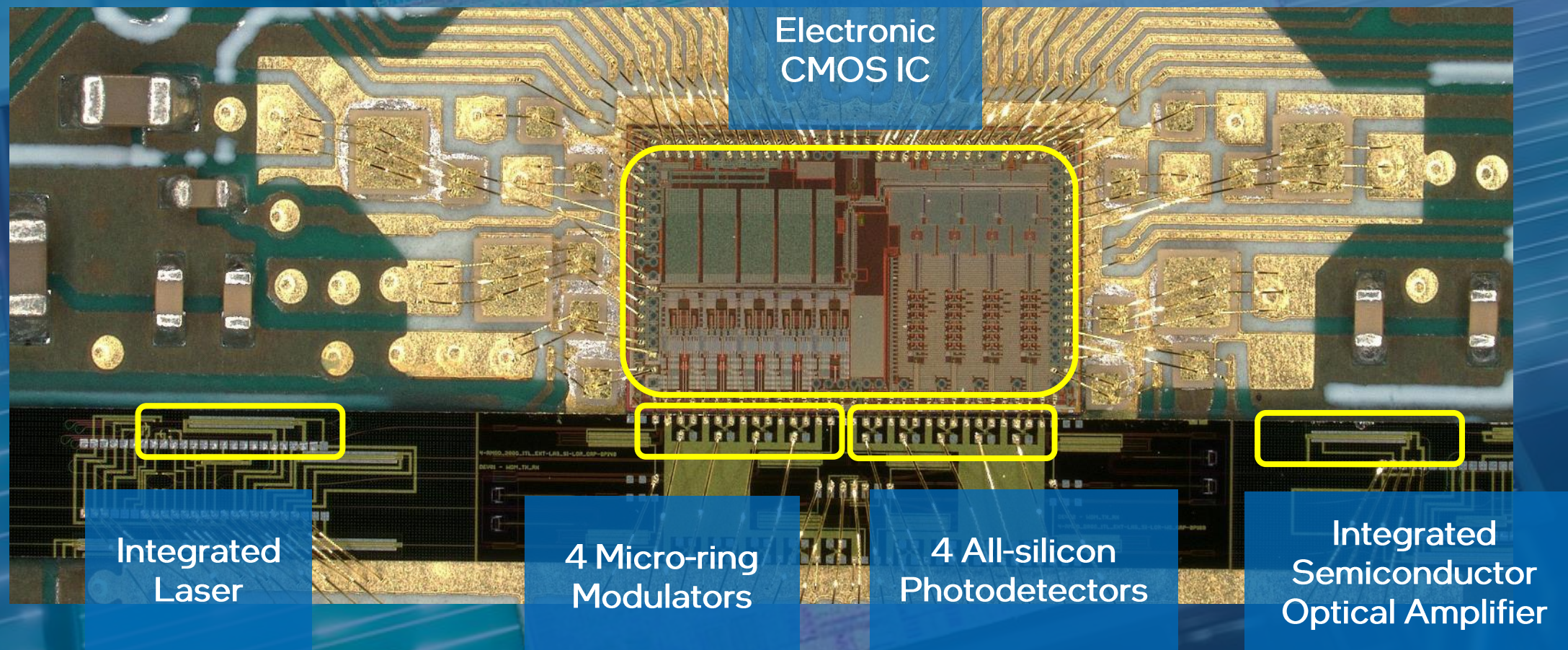
Guide/Amplify
Light



Detection



Integrated Photonics Prototype



Industry-leading Prototype with Key Technology Building Blocks



Neuromorphic Computing

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Synapses to Silicon: Brain-inspired Microarchitecture

Mike Davies

Director Of Neuromorphic Computing Research

Labs Day 2020

2018 IROS Drone Racing Competition



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Brains are Unrivalled Computing Devices

COCKATIEL PARROT



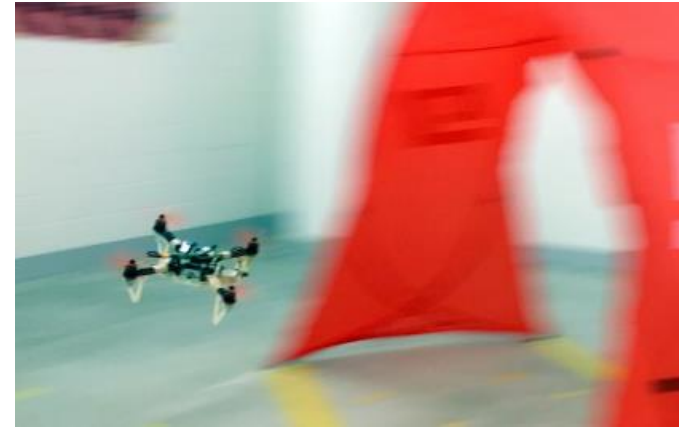
Brain
Power: 50 mW
Mass: 2.2 grams

Navigates and learns
unknown environments
at 22 mph

Can learn to speak
English words

Can learn to
manipulate cups
for drinking

AUTONOMOUS DRONE



CPU/GPU controller
Power: 18,000 mW
Mass: ~40 grams

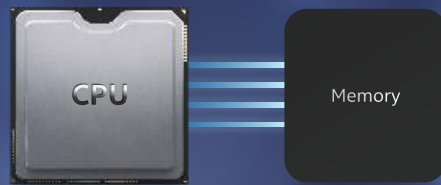
Pre-trained to fly
between known
gates at 5.6 mph

Can't learn anything
online

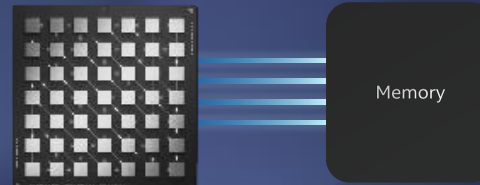
Sources: PNAS, June 13, 2016; <https://link.springer.com/article/10.1007/s00360-011-0603-1>; Davide Scaramuzza, ETH Zurich and A. Loquercio et al, "Deep Drone Racing: From Simulation to Reality with Domain Randomization," IEEE Trans. Robotics, 2020.

A New Kind of Computer Architecture

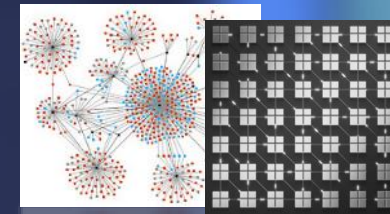
Standard Computing



Parallel Computing



Neuromorphic Computing



PROGRAMMING BY ENCODING ALGORITHMS	OFFLINE TRAINING USING LABELED DATASETS	LEARN ON THE FLY THROUGH NEURON FIRING RULES
SYNCHRONOUS CLOCKING	SYNCHRONOUS CLOCKING	ASYNCHRONOUS EVENT-BASED SPIKES
SEQUENTIAL THREADS OF CONTROL	PARALLEL DENSE COMPUTE	PARALLEL SPARSE COMPUTE

Loihi

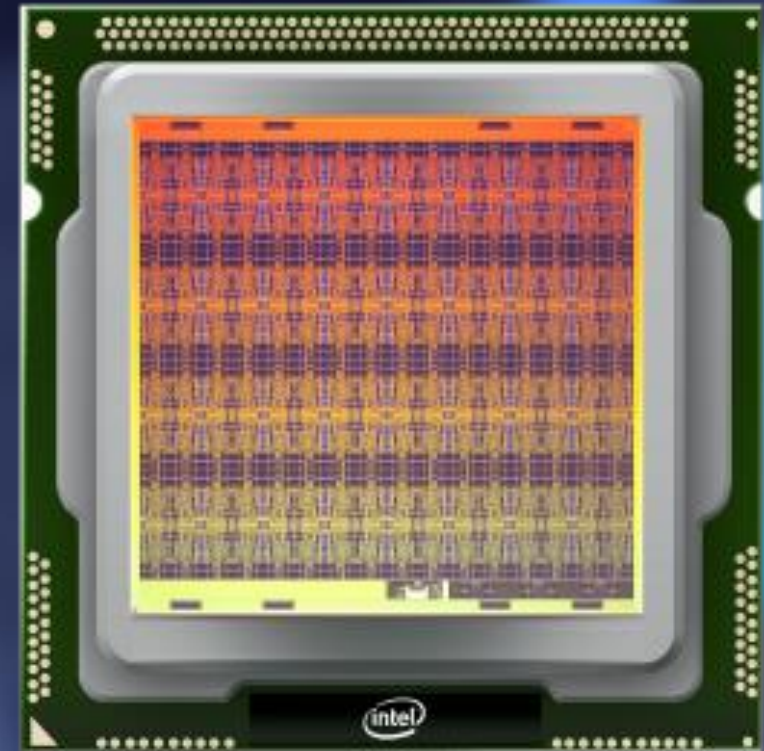
KEY PROPERTIES

- 128k neurons and 128 million synapses
- Compute-memory integrated architecture
- Fully digital in standard 14nm process
- Asynchronous design enables scalability
- Versatile on-chip learning – a first for the field

Yet,

- No floating point numbers!
- No multiply-accumulators!

Fundamental to
deep learning
hardware



Loihi

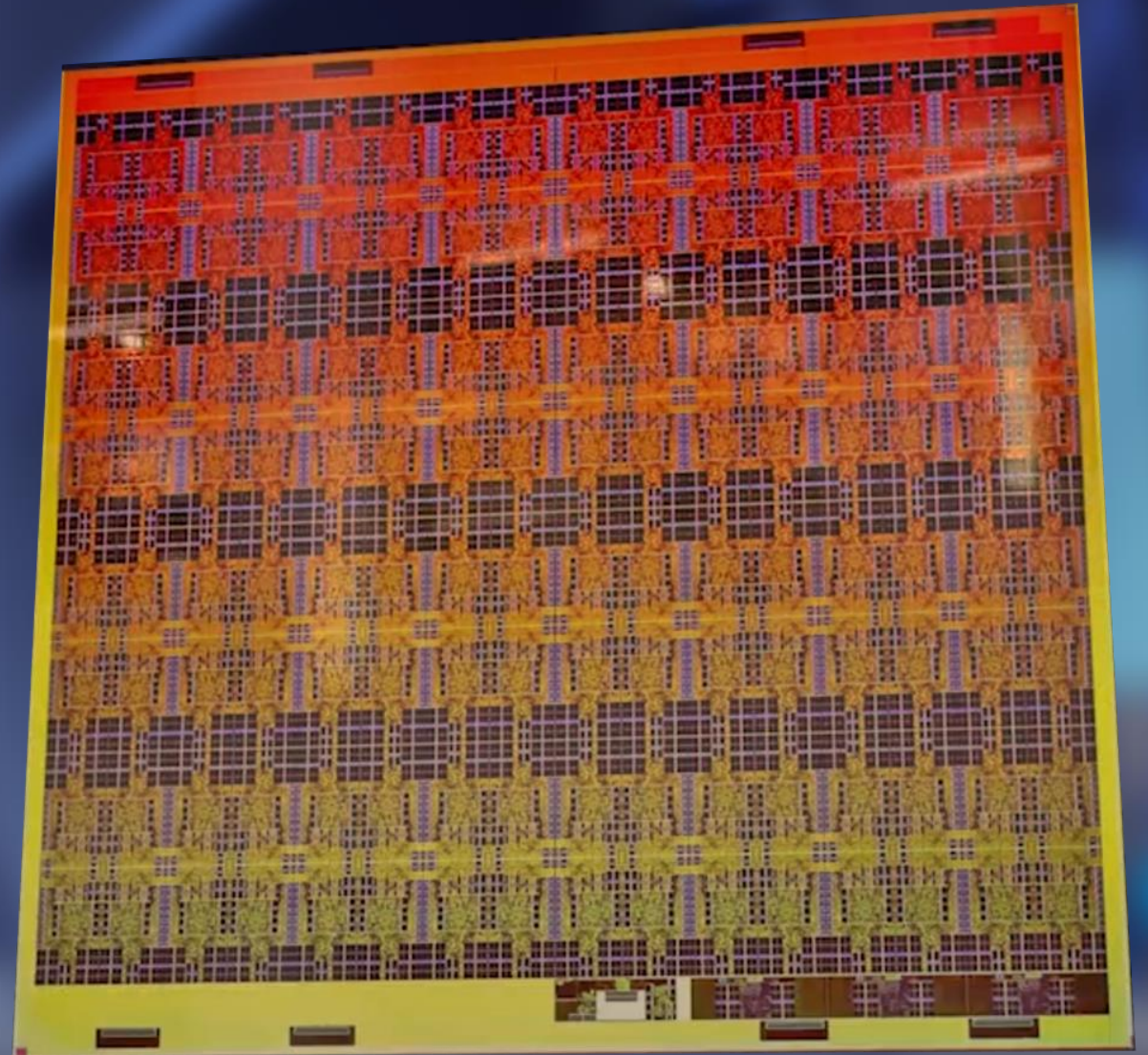
KEY PROPERTIES

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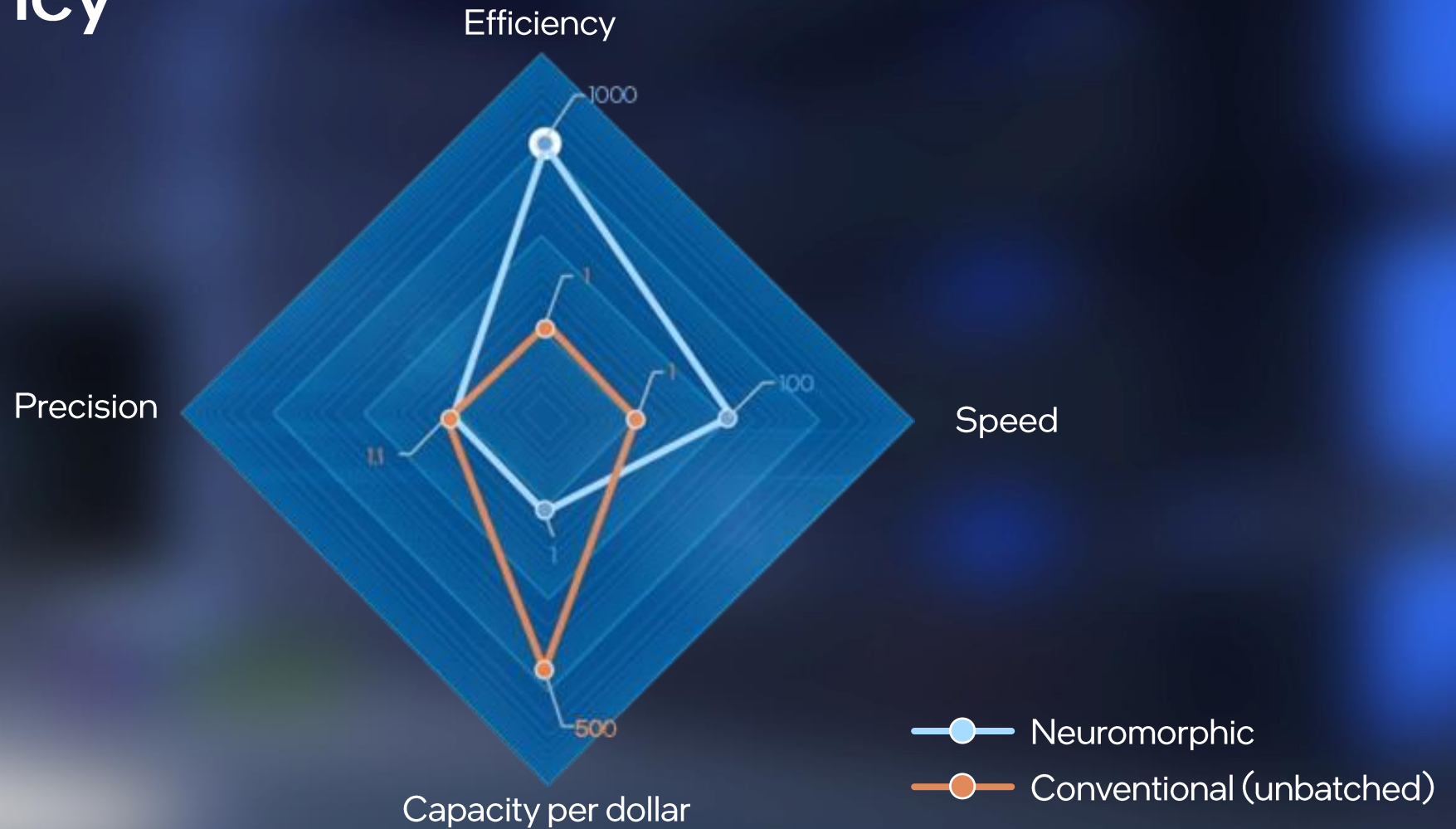
Yet,

- No floating point numbers!
- No multiply-accumulators!

Fundamental to
deep learning
hardware



Loihi Efficiency



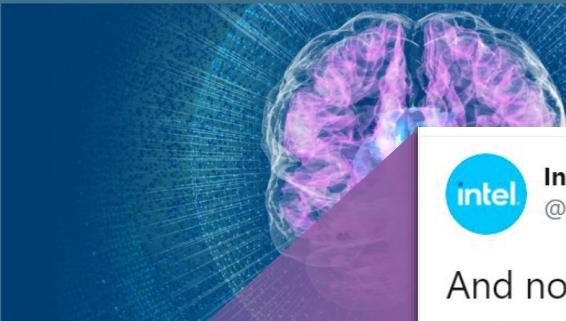


Pohoiki Springs



Beyond Today's AI

New algorithmic approaches emulate the human brain's interactions with the world.



Neuromorphic Computing Community Probabilistic Computing Resources

The emergent capabilities in artificial intelligence being driven by Intel Labs have more in common with human cognition than with conventional computer logic.

HIGHLIGHTS

- Neuromorphic computing research emulates the neural structure of the human brain.
- The Loihi research chip includes 130,000 neurons optimized for spiking neural networks.
- Intel Labs is making Loihi-based systems available to the global research community.
- Probabilistic computing addresses the fundamental uncertainty and noise of natural data.
- Collaborations on next-generation AI extend to worldwide industry and academic researchers.

What Is Neuromorphic Computing

The first generation of AI was rules-based and emulated classical logic to draw reasoned conclusions within a specific, narrowly defined problem domain. It was well suited to monitoring processes and improving efficiency, for example. The second, current generation is largely concerned with sensing and perception, such as using deep-learning networks to analyze the contents of a video frame.


A coming next generation will extend AI into areas that correspond to human cognition, such as interpretation and autonomous adaptation. This is critical to overcoming the so-called "brittleness" of AI solutions based on neural network training and inference, which depend on literal, deterministic views of events that lack context and commonsense understanding. Next-generation AI must be able to address novel situations and abstraction to automate ordinary human activities.

Intel Labs is driving computer-science research that contributes to this third generation of AI. Its focus areas include neuromorphic computing, which is concerned with emulating the neural structure and operation of the human brain, as well as probabilistic computing, which creates algorithmic approaches to dealing with the uncertainty, ambiguity, and contradiction in the natural world.

Neuromorphic Computing Research Focus

The key challenges in neuromorphic research are matching a human's flexibility, and ability to learn from unstructured stimuli with the energy efficiency of the human brain. The computational building blocks within neuromorphic computing systems are logically analogous to neurons. Spiking neural networks (SNNs) are a novel model for arranging those elements to emulate natural neural networks that exist in biological brains.



And now a conversation that will fire up everyone's neurons with Mike Davies, Director of Neuromorphic Computing at Intel Labs. Follow [#BehindTheBrains](#) to keep track and enjoy the thread 

Join us on Twitter for a Q&A with

Mike Davies

intel.



11:00 AM · Sep 17, 2020 · Twitter Web App



News Byte

November 18, 2019

[Contact Intel PR](#)

Accenture, Airbus, GE and Hitachi Join Intel Neuromorphic Research Community



What's New: Today, Intel announced the first corporate members – Accenture, Airbus, GE and Hitachi – to join the fast-growing Intel Neuromorphic Research Community (INRC). The INRC has tripled in size over the past year and now has more than 75 organizations, spanning leading

Latest News: Artificial Intelligence



October 29, 2020

[Intel to Acquire SigOpt to Scale AI Productivity and Performance](#)

October 29, 2020

[Artificial Intelligence](#)

October 20, 2020

[Intel Powers First Satellite with AI on Board](#)

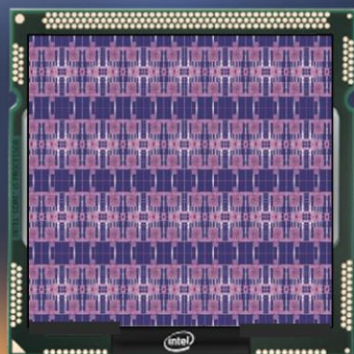
INRC includes
over 100
groups



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Opportunity at All Scales

Future
Neuromorphic
Technology



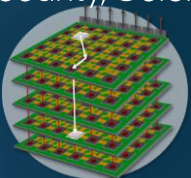
Visual Intelligence



Personalized Computing
(Real-time speech, speaker ID,
localization, denoising)



At-Scale Problem Solving
Data Analytics, Security, Scientific Computing



Intelligent Sensors
(Low latency, event-based,
anomaly detection)



Robotic Sensing + Control



SWaP-constrained AI
(Autonomous systems)



Human-Computer Interfacing
(EEG, neuroprosthetics)



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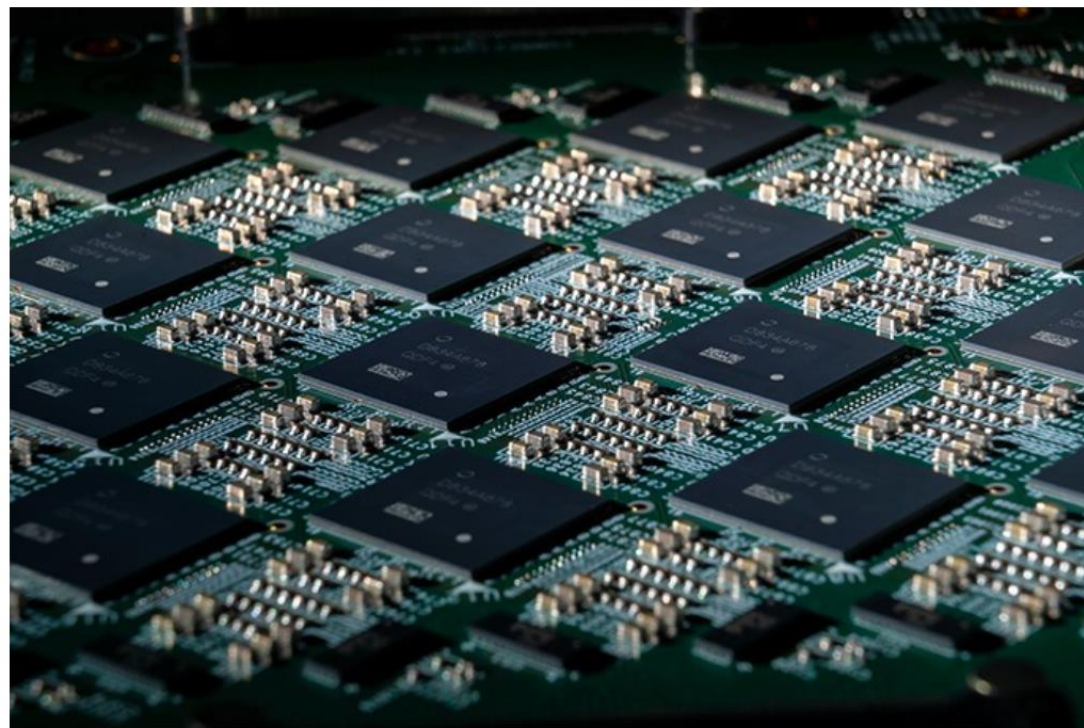
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News Byte

October 2, 2020

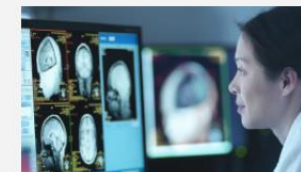
[Contact Intel PR](#)

Intel and Sandia National Labs Collaborate on Neuromorphic Computing



A close-up shot of an Intel Nahuku board, each of which contains 8 to 32 Intel Loihi neuromorphic chips. Intel's latest neuromorphic system, Pohoiki Beach, is made up of multiple Nahuku boards and contains 64 Loihi chips. Pohoiki Beach was introduced in July 2019. (Credit: Tim Herman/Intel Corporation)

Latest News: Artificial Intelligence



November 18, 2020

[Survey Shows Next Era of Healthcare Will Be Powered by AI](#)



November 17, 2020

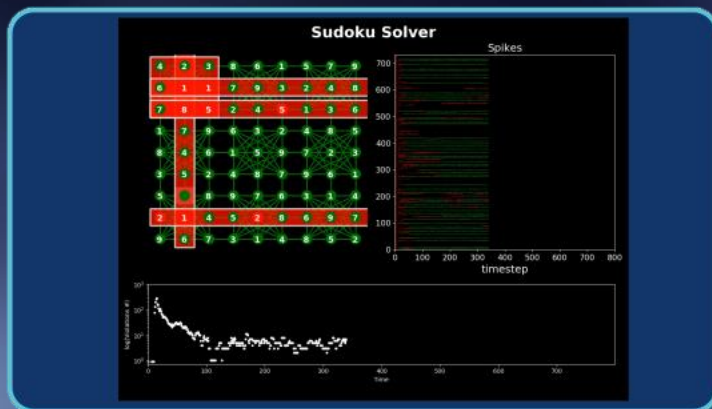
[First Intel Structured ASIC for 5G, AI, Cloud and Edge Announced](#)



October 29, 2020

[Intel to Acquire SigOpt to Scale AI Productivity and Performance](#)

[Read More](#)



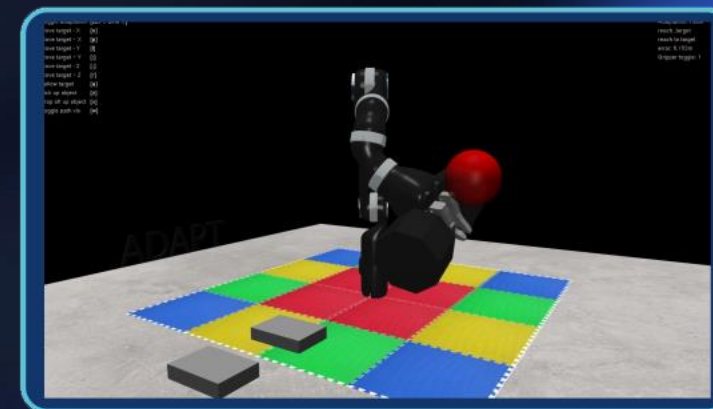
Constrained optimization problems
 (e.g. Sudoku)
 1000x lower energy
 100x faster



Head direction localization and learning
 v00x lower power vs CPU
 1000x lower energy
 100x faster



Similarity search
 24x faster and 30x lower
 energy (vs CPU)



**Adaptive robotic arm control 40x
 lower power , 50% faster (vs GPU)**



Visual-tactile sensing
 45x lower power
 20% faster (vs GPU)

The Intel logo, featuring the word "intel" in white lowercase letters with a small blue square above the "i", set against a solid blue square background.

intel®

+

PROPHESÉE
META VISION FOR MACHINES



Mercedes-Benz

logitech®

Lenovo™

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Quantum Computing

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Four biggest challenges to Quantum Practicality & How We Might Solve Them

Anne Matsuura

Director of Quantum Computing Architecture

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Changing the World

TIME

"Quantum
Will Change
Everything"

Climate
Modeling

Travel &
Logistics

Cryptography

Drug Design

Financial
Modeling

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Quantum Computing: Key Concepts

Superposition

Classical Physics



Heads OR Tails

Quantum Physics



Heads AND Tails

Entanglement



N Quantum Bits or Qubits = 2^N States

Fragility



Observation or noise
causes loss of information

Quantum Computing



1



2



3



4



5



6



7



8



Quantum Computing



Quantum Computing



Quantum Computing

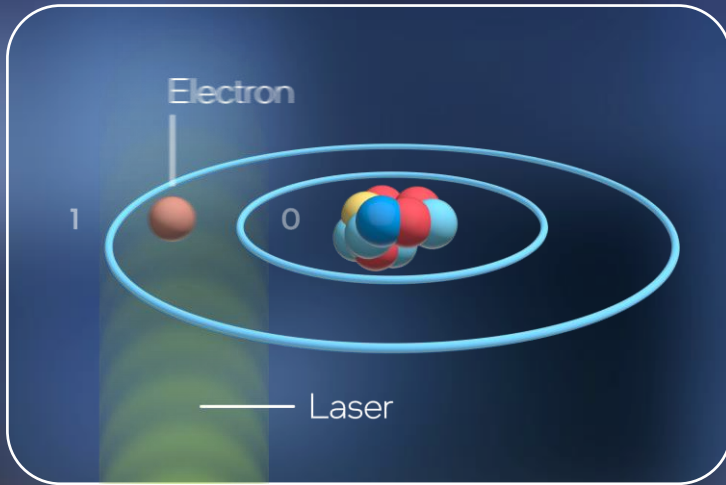


Spin Qbit
technology

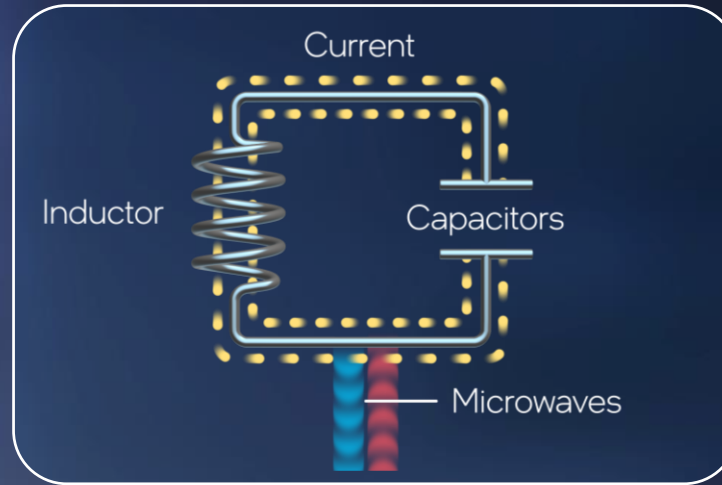
Cryogenic
control technology

Full stack innovation

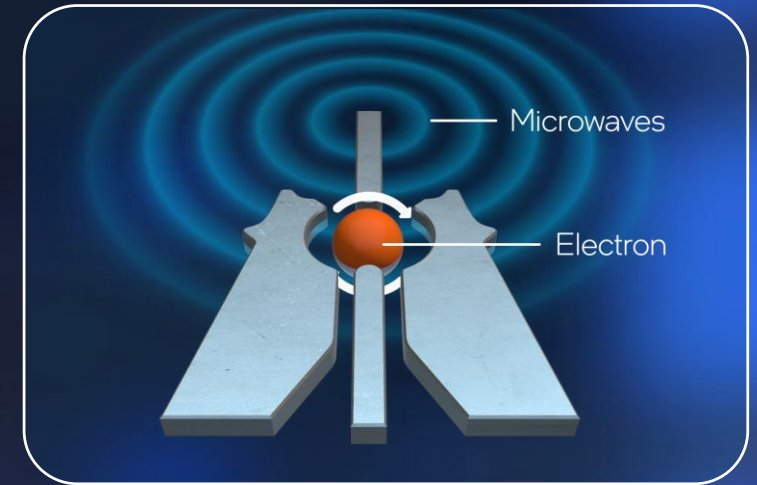
A Quantum Bit



Honeywell,
IonQ

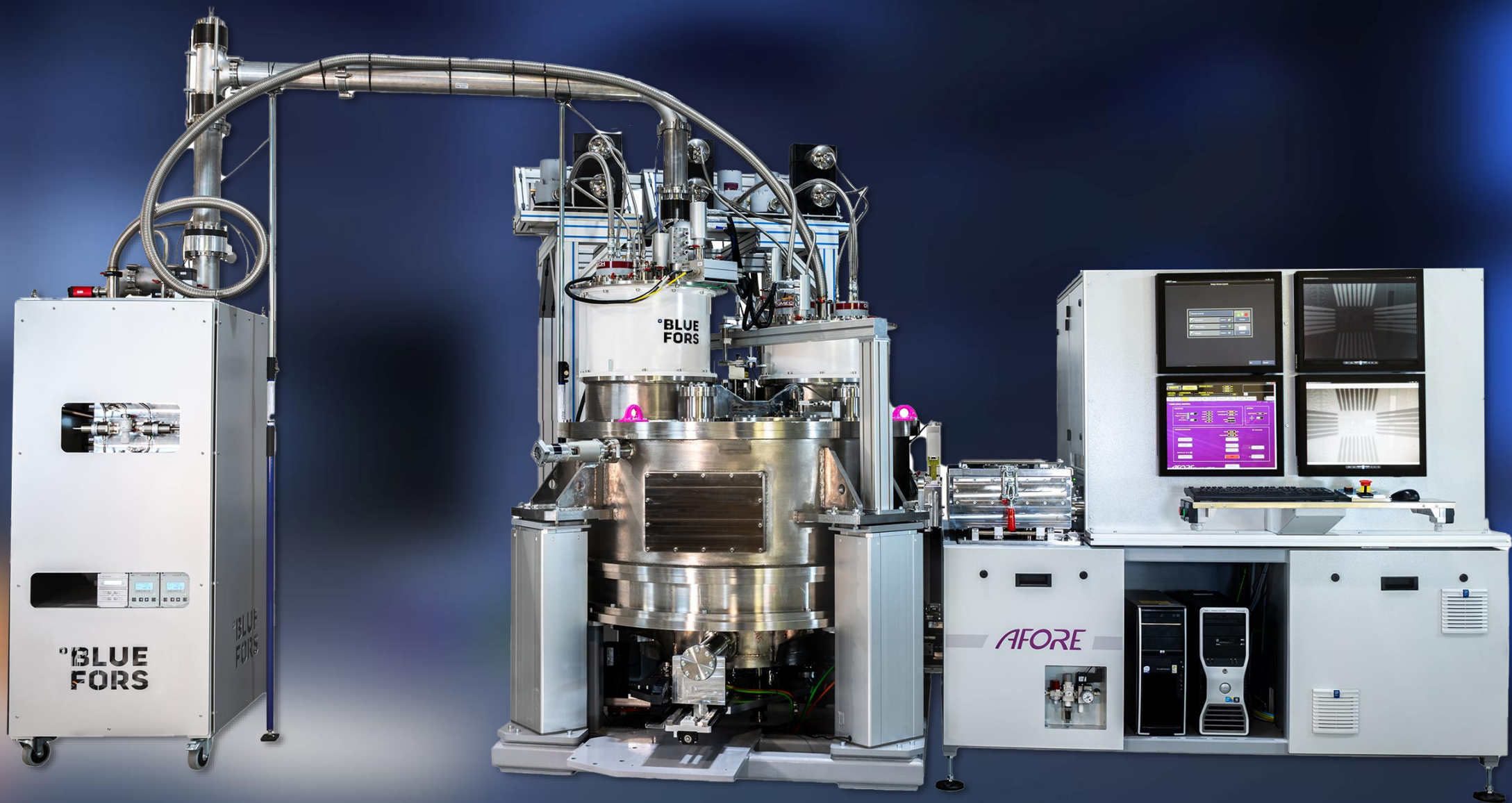


Intel Corporation,
HRL



Google, IBM,
Rigetti, DWave

Only one of these Qubits is built on the technology of transistors



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Architecture: Completely New Kind of Compute

Quantum Algorithms

Quantum Compiler

Quantum Runtime

Qubit Control Processor

Control Electronics

Qubit Chip

Key system challenges for Quantum Practicality

- New execution model
- Error mitigation & resilience
- Scalability
- Interconnect complexity
- Qubit device design

Putting it All Together

Quantum Algorithms

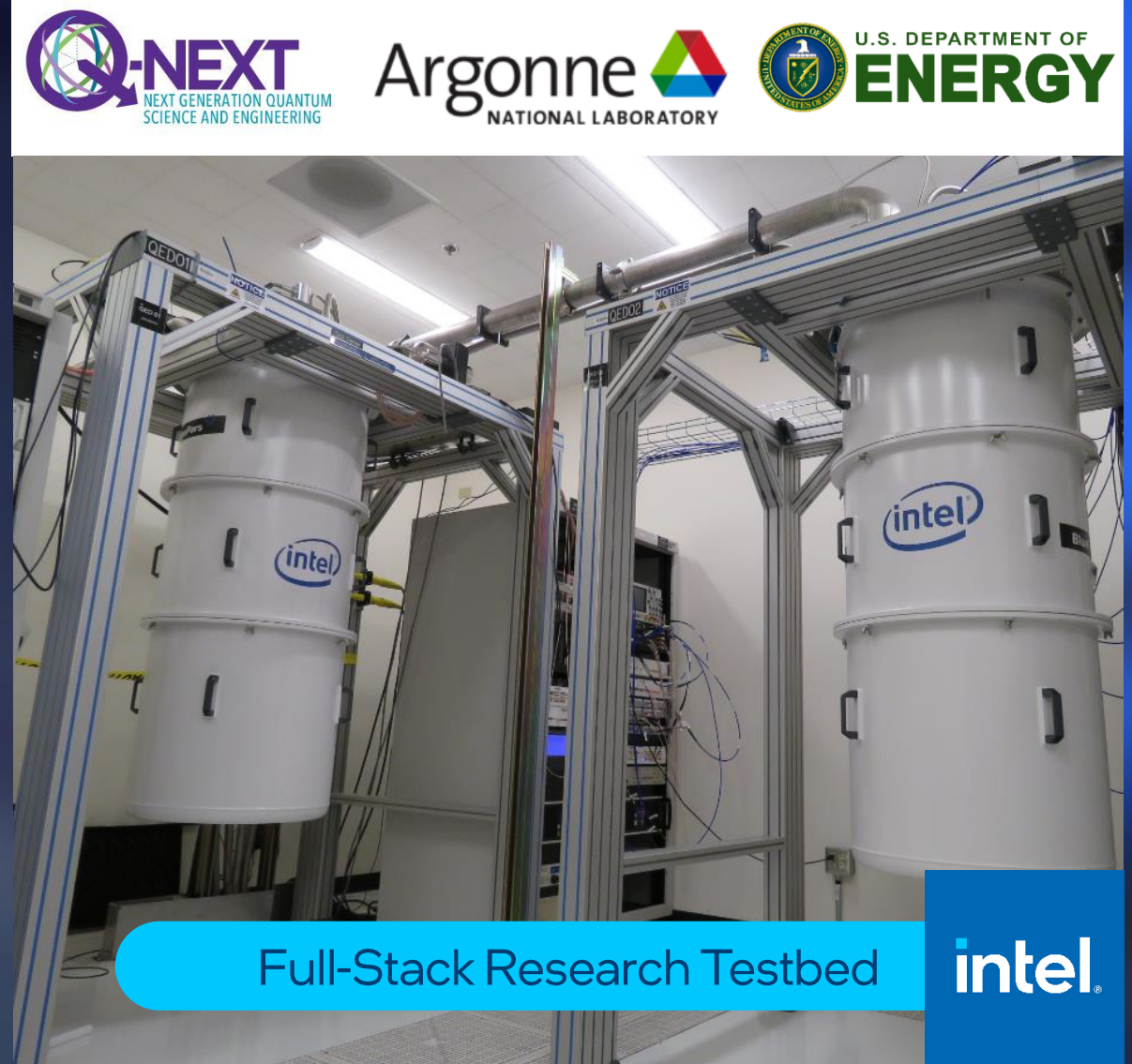
Quantum Compiler

Quantum Runtime

Qubit Control Processor

Control Electronics

Qubit Chip



*Q-NEXT brings together nearly 100 world-class researchers from three national laboratories, 10 universities and 10 leading U.S. technology companies with the single goal of developing the science and technology to control and distribute quantum information.



Confidential Computing



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The Data Silo Problem

- Privacy / Legality
- Data too valuable
- Data too large to transmit



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Confidential Computing Edge to Cloud

Jason Martin

Principal Engineer, Security and Privacy Research

Labs Day 2020

Confidential Computing



Data Confidentiality
Execution Integrity
Attestation

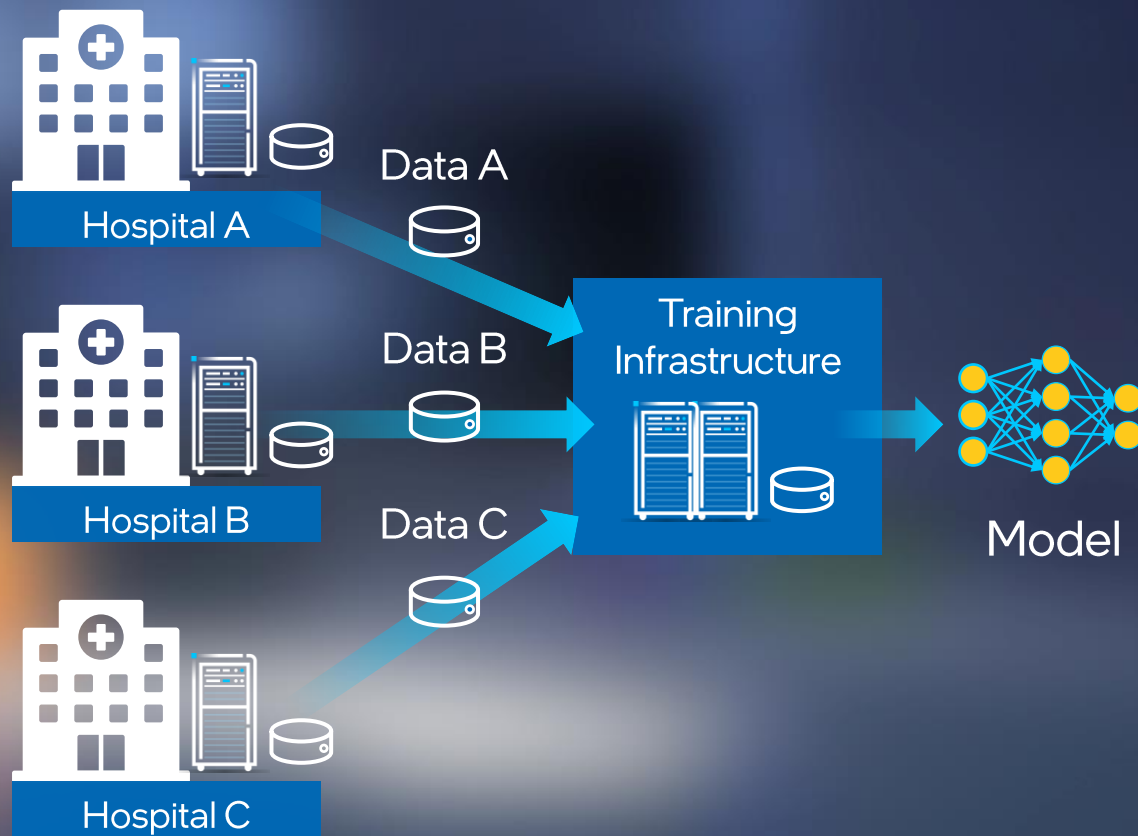
Confidential Computing

Hardware Control
Access

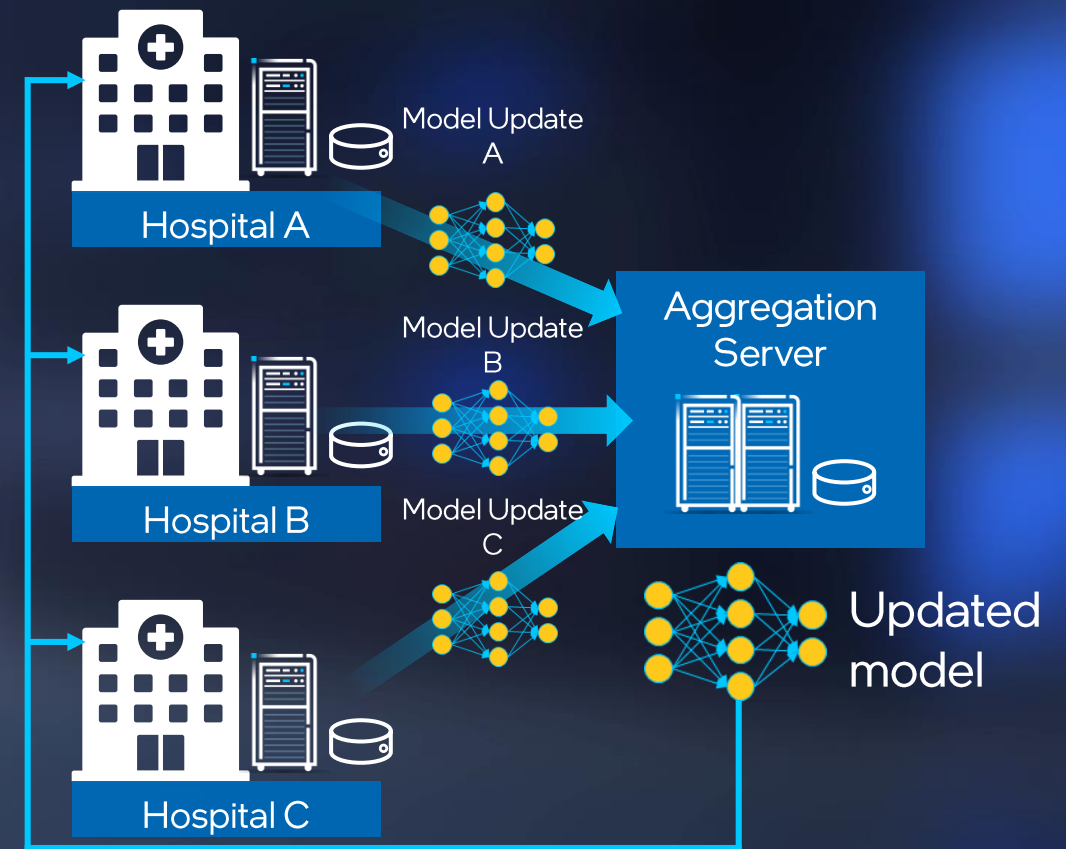
Encryption

Federated Learning – Move Compute to Data

Centralized Learning



Federated Learning



Intel-UPenn Collaboration



How much better does each institution do when training on the full data vs. just their own data?

17%
BETTER

on the hold-out BraTS data

2.6%
BETTER

on their own validation data

Brain tumor segmentation finds tumors from MRIs

Sheller, M.J., Edwards, B., Reina, G.A. *et al.* Federated learning in medicine: facilitating multi-institutional collaborations without sharing patient data. *Sci Rep* 10, 12598 (2020).

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A decorative graphic consisting of three squares: a small light red square at the top left, a medium dark red square to its right, and a large red square below them. The text 'Fully Homomorphic Encryption' is centered within the large red square.

Fully Homomorphic Encryption



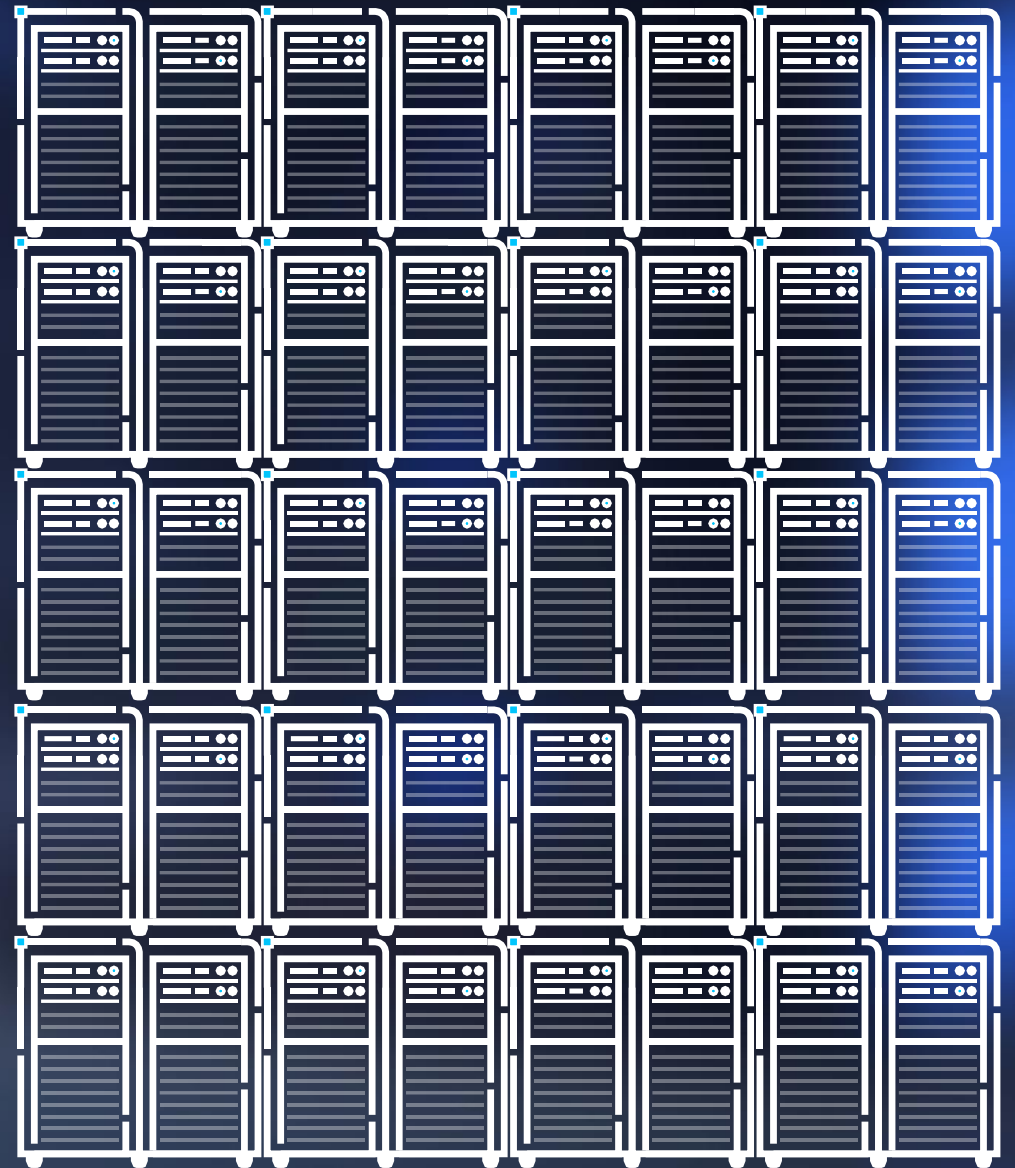
Traditional Encryption



Fully Homomorphic Encryption

10,000X

Larger



FHE Performance Explorations



See cited sources for workloads and configurations. Results may vary.
Jung et al. [HEANN Demystified](#), arXiv:2003.04510, March 2020
Riazi et al. [HEAX](#), ASPLOS 2020

Intel Launches Private AI Collaborative Research Institute

Advancing technologies in privacy and trust for decentralized AI



Carnegie Mellon University
National University of Singapore
Université Catholique de Louvain
University of California, San Diego
University of Louvain
University of Southern California
University of Toronto
University of Waterloo
Technische Universität Darmstadt

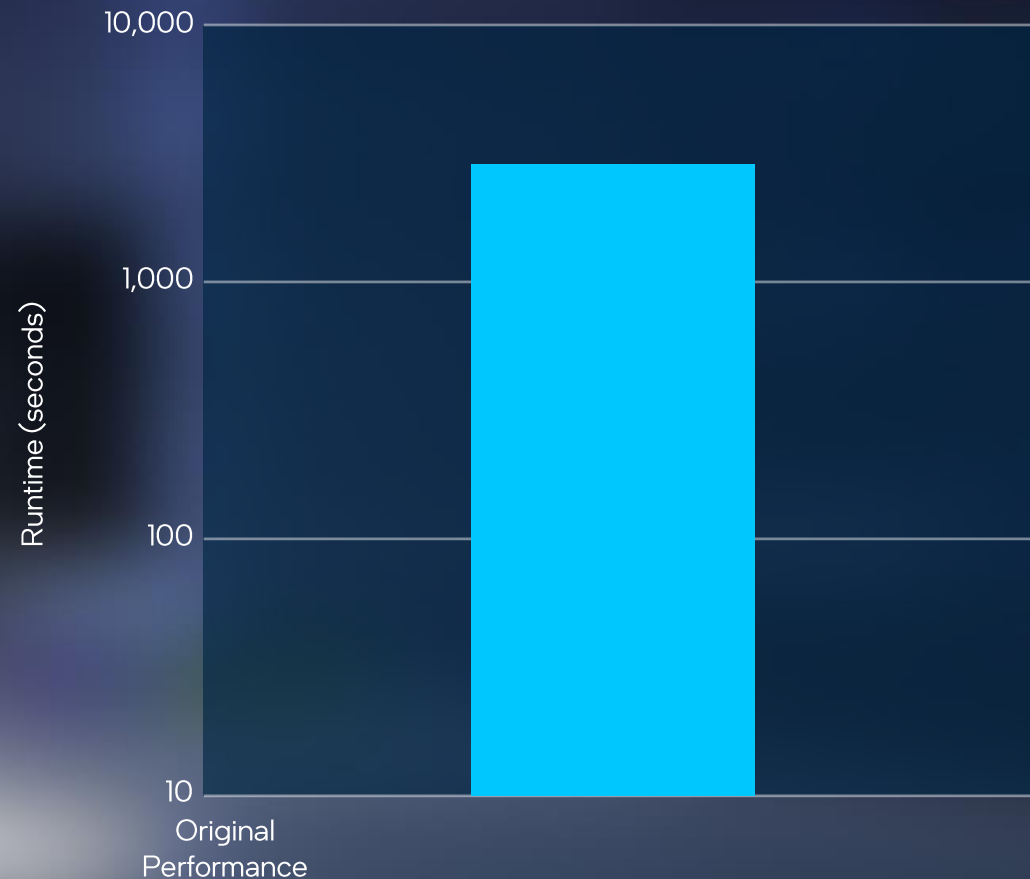
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Machine Programming

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Programming Challenges

Programming in the XPU Era



A cosmology application from the Stephen Hawking Institute

Source: Intel Labs

Ninja – an expert in SW development generally requiring a deep understanding of HW

Programming Challenges

Programming in the XPU Era



A cosmology application from the Stephen Hawking Institute

Source: Intel Labs
Ninja – an expert in SW development generally requiring a deep understanding of HW

Programming Challenges

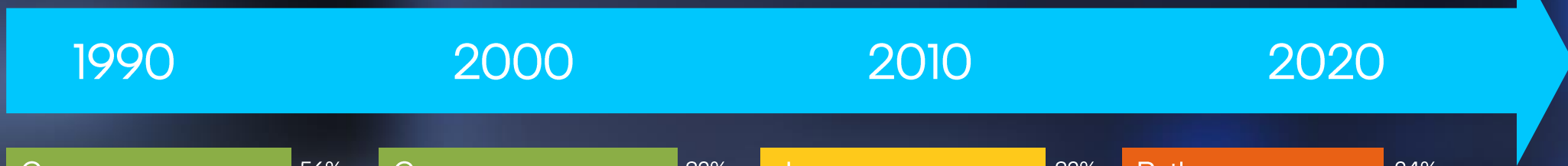
Programmer Population

18.2
Million



45%
Increase in 6
years
(2013-2019)

26.4
Million



Top Programming Languages

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Source – Programming Languages: <https://youtu.be/Og847HVwRSI>, <http://pypl.github.io/PYPL.html>
Source – Programmer Population size: <http://www.computersciencezone.org/developers>

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Reimagining the Future of AI-assisted Software Design

Justin Gottschlich

Principal Engineer, Machine Programming Research

Labs Day 2020

How do you develop software to fully exercise the capabilities of these novel types of hardware?



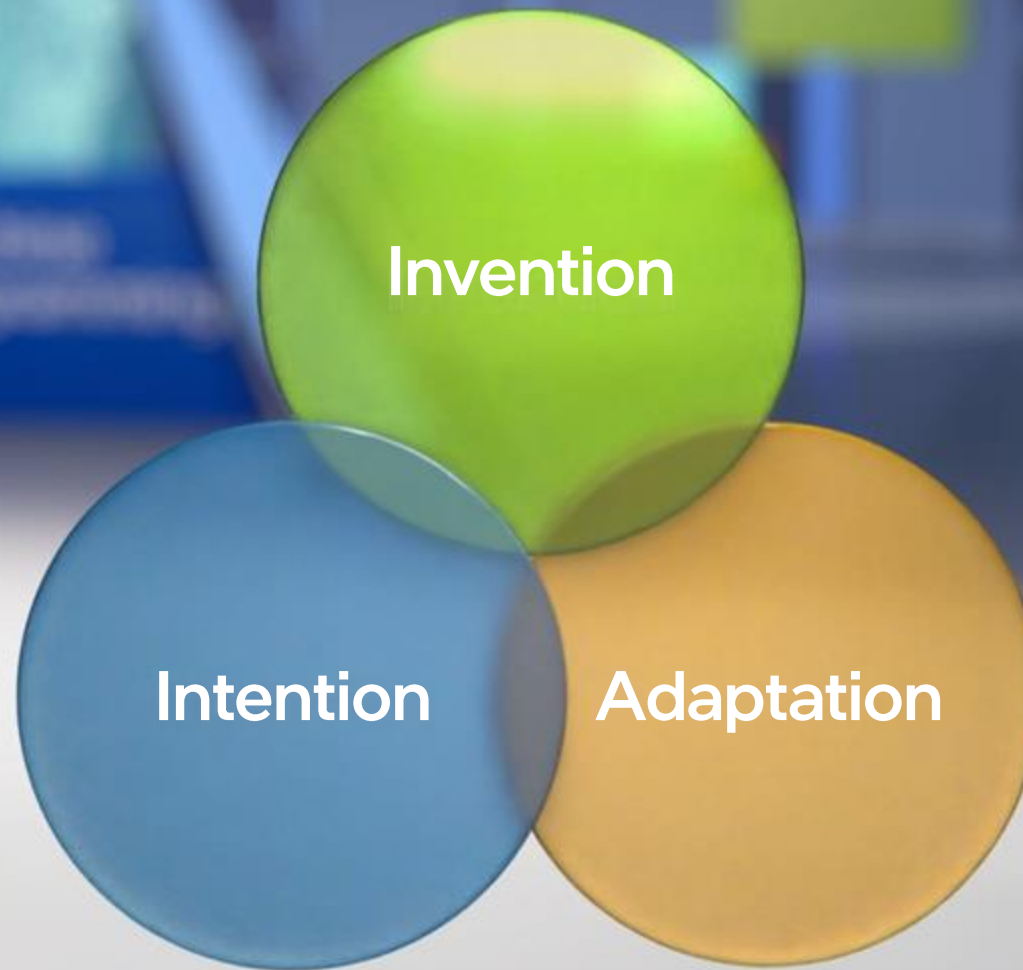
Machine Programming

- Any technique that automates software development

Intel's goal with MP

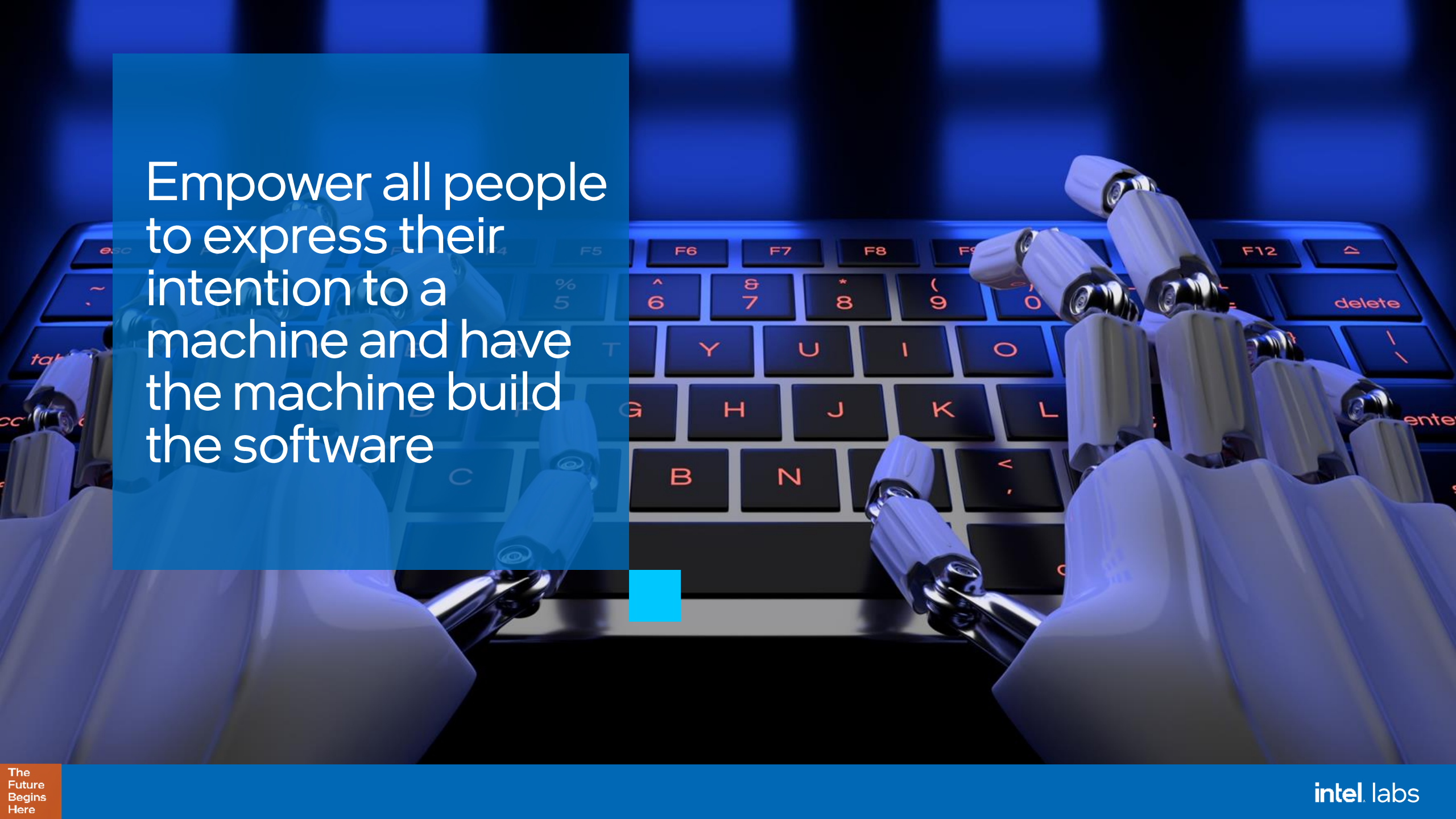
- Democratize and accelerate the creation of quality software

The Three Pillars of Machine Programming






Less than 1% of the global
population can code.



Empower all people
to express their
intention to a
machine and have
the machine build
the software



Programmers spend
50% of their time debugging

Can we do better?

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Performance results are based on testing as of dates shown in configurations and may not reflect all publicly available updates. See backup for configuration details. No product or component can be absolutely secure.

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Results have been estimated or simulated.

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