#### The Parallel Computing Revolution Is Only Half Over

Rob Schreiber, Cerebras Systems, Inc.

ATPESC, August 1, 2019





### What this is?









### Computer History Museum Timeline: 1933





### 2.4 million cores

### The pioneers









### The parallel computing era

Controversy

Success!

**Technology Triumphant** 

The Crisis

A Pressing Need

A New Era

Parallel computers were once controversial

### Amdahl

If the parallel fraction is f then the maximum possible speedup is 1/f



### Speedup, efficiency



S(p) = T(1) / T(p)

E(p) = S(p) / p



#### Mapreduce: Parallelism is easy. Performance is hard



It's the memory and the network

And the algorithm

### Dusty Decks

# Vendor: "I can build you a machine that is a **billion** times more powerful than the one you used earlier"

Customer: "But will I need to rewrite my code?"

### Automatic parallelization

The compiler should create an optimized, parallel implementation of the algorithm in the code

### Alan Perlis

Adapting old programs to fit new machines usually means adapting new machines to behave like old ones.

Optimization hinders evolution.



http://www.cs.yale.edu/homes/perlis-alan/quotes.html

# Success

Almost all of HPC *machine* performance is due to parallelism

- 1975 2019: 10<sup>8</sup> flops → 10<sup>17</sup> flops
  - 1 OOM from clock rate
  - 8 OOM from parallelism
- 2 OOM more power required
- 1 OOM more \$ required

### Four eras, four exponentials



The past is easy to predict. The future?



### Ivan Sutherland, at Caltech, 1977

### "The VLSI Revolution is Only Half Over"

### Was Sutherland right?



# VLSI: Technology Triumphant

## After Ivan, What Happened?



1975: HPC is based on high-end technology

Hardware was customized for HPC

### 1971: Infancy of Silicon Valley, microprocessor





### Architectures – no one knew what to do

- SIMD / MIMD
- Shared memory / Distributed memory
- COMA
- Hypercubes
- Transputers
- Message-passing dialects
- Latency tolerance
- From workstations to supercomputers

### The confused 80s



### 1971 – 1990: Micros catch up

- Transistor count doubles every two years.
- 1971 2000 transistors (i4004)
- 1990 1,000,000 transistors (i80486)
- It took 19 years of exponential growth to catch up to old style computers for HPC
- But then...

### Killer micros

"No one will survive The Attack of the Killer Micros" *Eugene Brooks, Panel talk at Supercomputing 90.* 

Cray Research says it is worried by "killer micros" – compact, extremely fast work stations that sell for less than \$100,000.

John Markoff, in the New York Times, 1991



### VLSI and supercomputers after 1990

Then the attack really happens

- A mass market drove investment and innovation
  - Dennard scaling made micros faster, cheaper, same power
  - Commodity pricing killed architectural specialization
- By 2000, all HPC machines are clusters of commodity designs
- AND we knew how to program them (MPI)

### From 1990 to 2010

7 OOM, from 0.1 teraflops to 0.1 exaflops Greater than the gains from 1942 (pre-electronic) to 1990

A loss of computer design diversity; the one-size-fits-all processor
# The Crisis

### Dennard Scaling Ended

... in every technology generation the transistor density doubles, the circuit becomes 40% faster, and power consumption (with twice the number of transistors) stays the same.

• 2005-2007: leaky transistors.  $V_{dd}$  stops dropping. Clock rate hits a wall.

#### Moore's Law limit

#### "There's no getting around the fact that we build these things out of atoms."

-- Gordon Moore

#### The transition, to the post-Moore era

# A pressing need

#### Al --- for science too

- Compute demand for DNN training has grown 300,000x since 2012
- Doubling time 3.5mo vs 18 mo (Moore)
- Training a DNN can take weeks

- see, ref https://blog.openai.com/ai-and-compute/





#### **Processor Specialization**

	Area (mm^2)	Transistors (billion)	Teraflops
CPU	800	20	1
GPU	500	10	10



## First GPGPU. Now, a new class of Al-optimized accelerators

- Purpose-built compute engine
- More parallel compute on each chip

#### Al-optimized accelerators are here

#### **Compare chips**

	Area (mm^2)	Transistors (billion)	Teraflops
CPU	800	20	1
GPU	500	10	10
Al-optimized (Volta, GC, TPU)	800	20	100

#### Still not enough! Days to train Resnet-50 on Volta

# A New Era



#### Scaling everything else

- Specialized architectures
- A heterogeneous Top 500 list
- Heterogeneous clusters of heterogeneous nodes
- Better algorithms
- The AI revolution
  - In science as well as all other applications of computing
- New memory technology
- Photonics
- 2.5D and 3D interconnects
- Wafer scale
- Quantum
- Other stuff too weird to mention, yet

### Chip scaling and feature scaling

When feature size scaling stops, use bigger chips

#### EE Times, May 24, 2019

Startups Cerebras, Habana, and UpMem will unveil new deep-learning processors. Cerebras will describe a much-anticipated device using wafer-scale integration.

### Accelerating AI

- Distributed memory
- Tightly integrated, fine-grain, active messages
- One-clock per hop network latency



#### Scaling the area too

	Area (mm^2)	Transistors (billion)	Teraflops
CPU	800	20	1
GPU	500	10	10
<b>Al-optimized</b>	800	20	100
Cerebras	> 50X	to be announced	



Cerebras Systems is a stealth mode startup backed by premier venture capitalists and the industry's most successful technologists. We are entrepreneurs dedicated to solving hard problems. We value integrity, passion, problem solving ability, and a sense of humor, and are always looking for extraordinary people to join our team.

