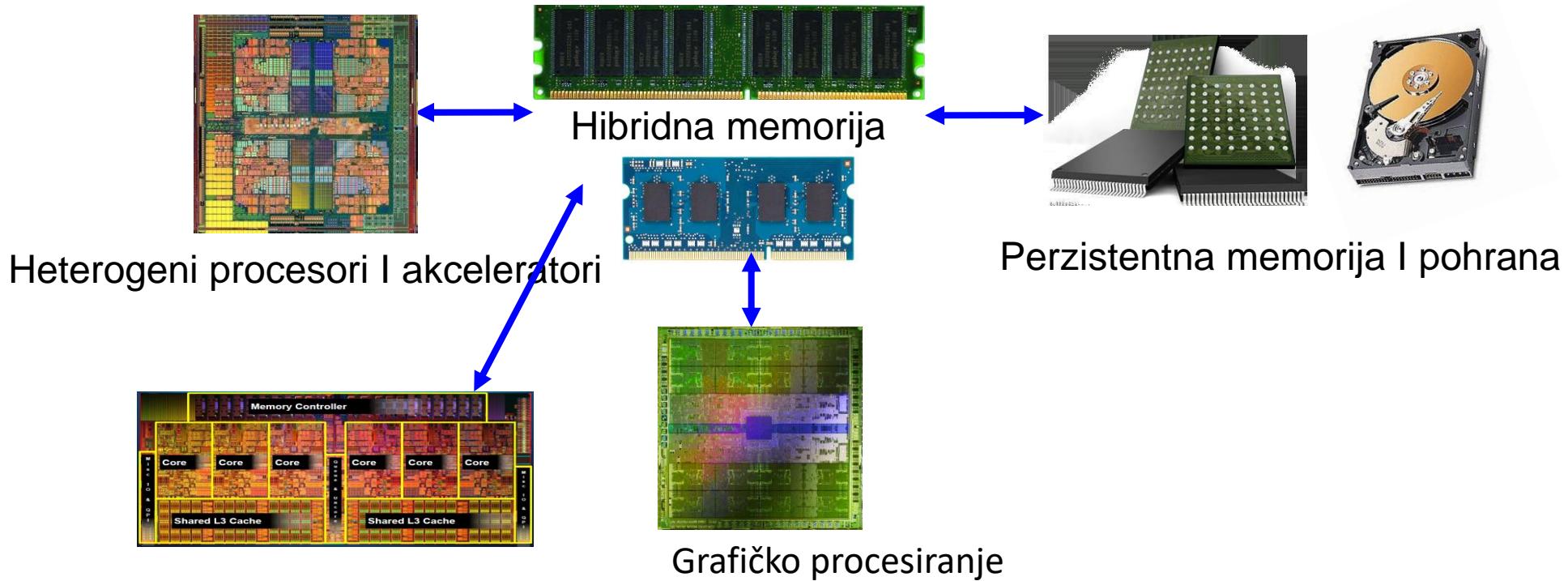




Računalna arhitektura

Osnovni pojmovi i
ciljevi

Trenutno najaktivnija područja istraživanja u računalnim arhitekturama



Želimo izgraditi bolje arhitekture

Četiri glavna smjera razvoja

- Sigurne/pouzdane arhitekture
- Energetski efikasne arhitekture
- Arhitekture sa niskom latencijom, predvidljivih performansi
- Arhitekture za AI/ML, analizu genoma, medicinu

Što ćemo naučiti na ovom kolegiju?

Kako računala rade

(od “dolje” prema “gore”)

... I zašto nam je to bitno

Zašto imamo računala

Zašto koristimo računalnu znanost

Da rješimo probleme

Da dobijemo uvid u način rada računala

Hamming, "Numerical Methods for Scientists and Engineers," 1962.

**Da omogućimo bolji život i
budućnost**

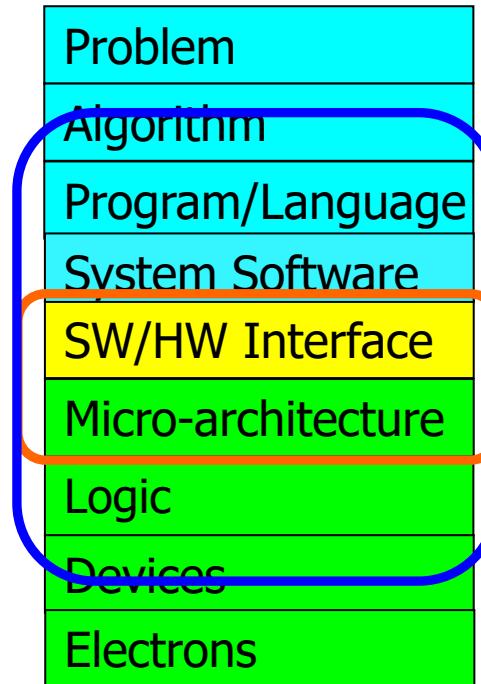
Kako računalo rješava probleme?

Kroz “orquestraciju” elektrona

Kako elektroni rješavaju probleme?

Transformacijska hijerarhija

Arhitektura (prošireni pogled)



Arhitektura ("uski" pogled)

Nivoi transformacije

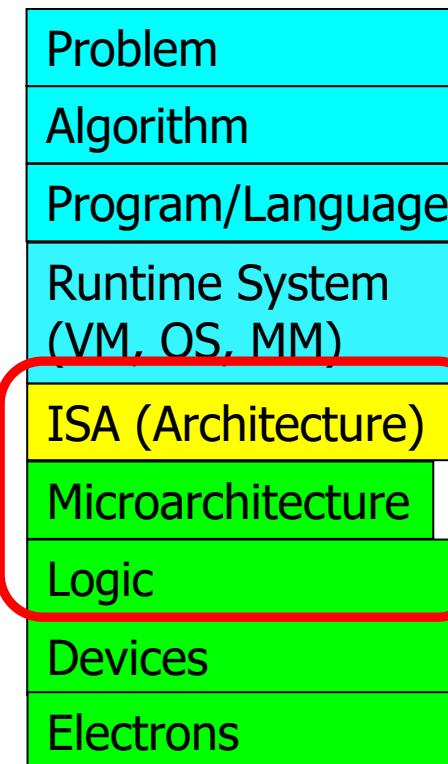
“The purpose of computing is [to gain] insight” (Richard Hamming)
We gain and generate insight by solving problems
How do we ensure problems are solved by electrons?



Algoritam

Korak-po-korak procedura koja sigurno ima svoj kraj, u kojoj je svaki korak precizno određen i računalo ga može odraditi.

Many algorithms for the same problem



ISA
(Instruction Set Architecture)

Sučelje/ugovor između softvera I hardvera. Ono za što programer prepostavlja da hardver može odraditi.

Mikroarhitektura
Implementacija ISA

Digitalni logički krugovi
Gradivni blokovi arhitekture

Gradja računala

- Znanost i umjetnost dizajniranja računalnih platformi (hardvera, sučelja, sistemskog softvera, programerskog modela)
- Da bi se dostigao skup ciljeva dizajna
 - Npr. najviše performance za specifične zadatke
 - Npr. najduži vijek rada baterije
 - Npr. najbolje prosječne performanse u poznatim zadacima uz najbolji odnos cijene i performansi
 - ...
 - Dizajn superračunala uključuje potpuno drugačije ciljeve dizajna u usporedbi sa pametnim telefonom (iako je dosta osnovnih prepostavki slično)

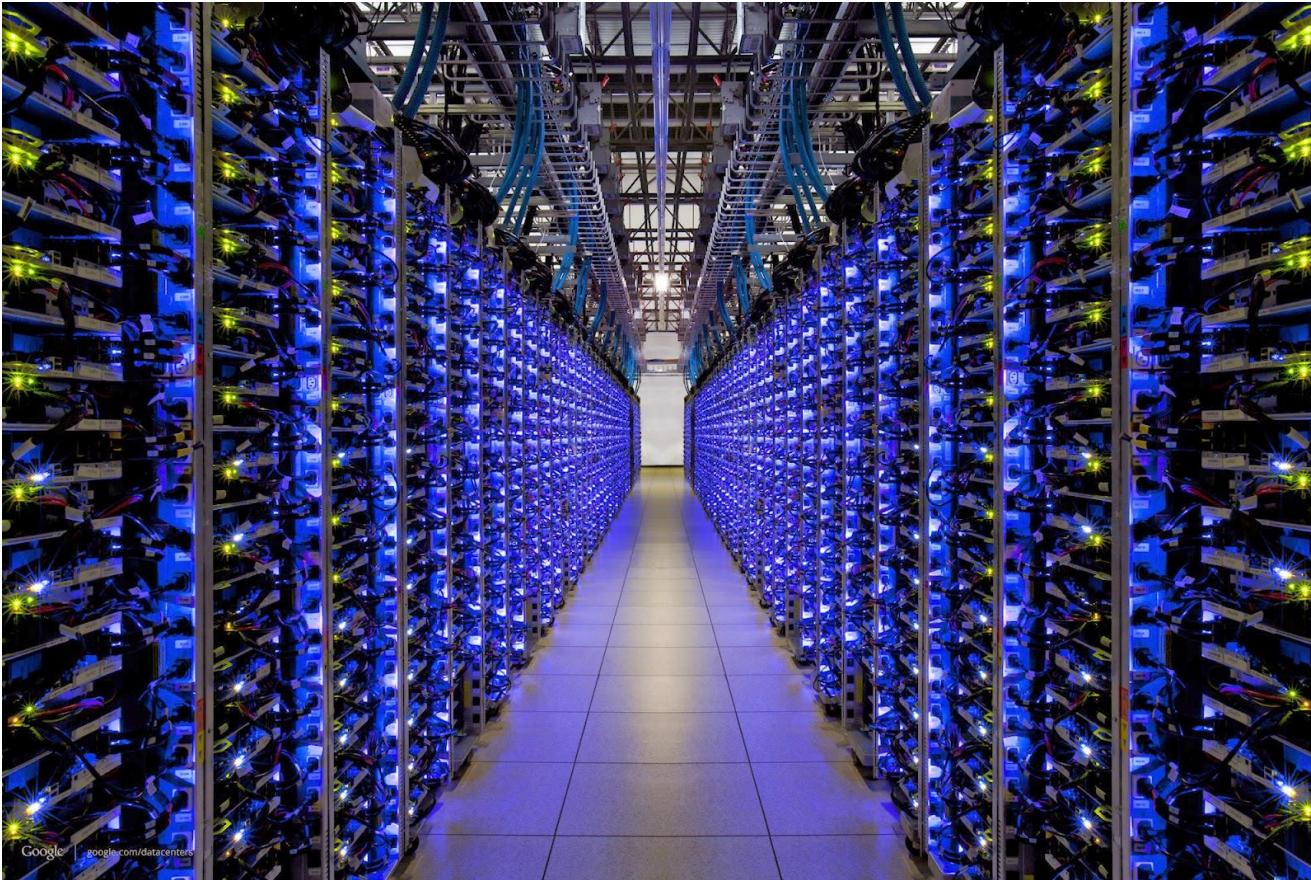
Različite platforme, različiti ciljevi



Različite platforme, različiti ciljevi



Različite platforme, različiti ciljevi



Različite platforme, različiti ciljevi



Jack Dongara

Različite platforme, različiti ciljevi

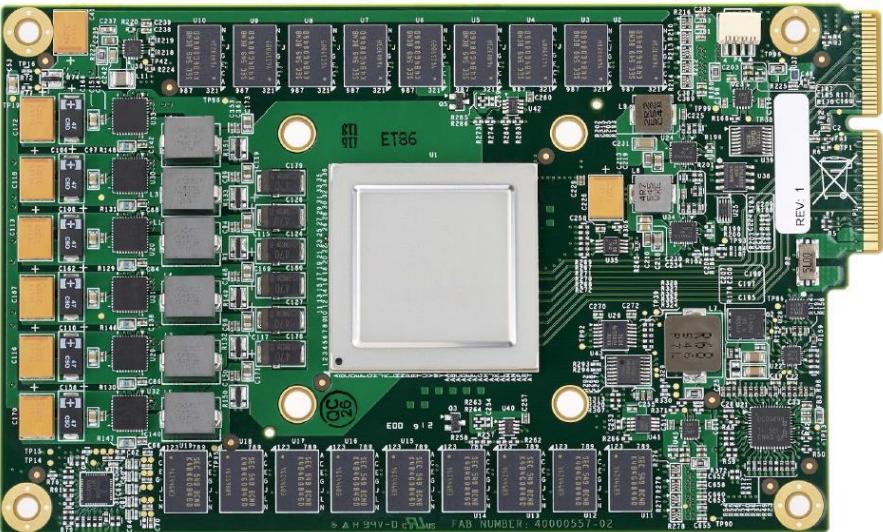


Figure 3. TPU Printed Circuit Board. It can be inserted in the slot for an SATA disk in a server, but the card uses PCIe Gen3 x16.

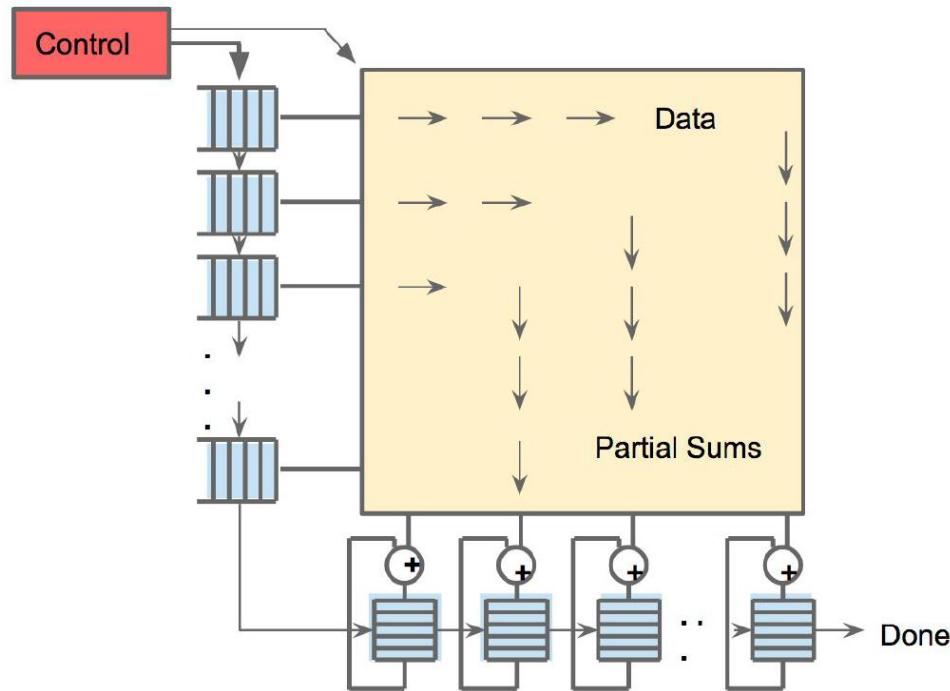
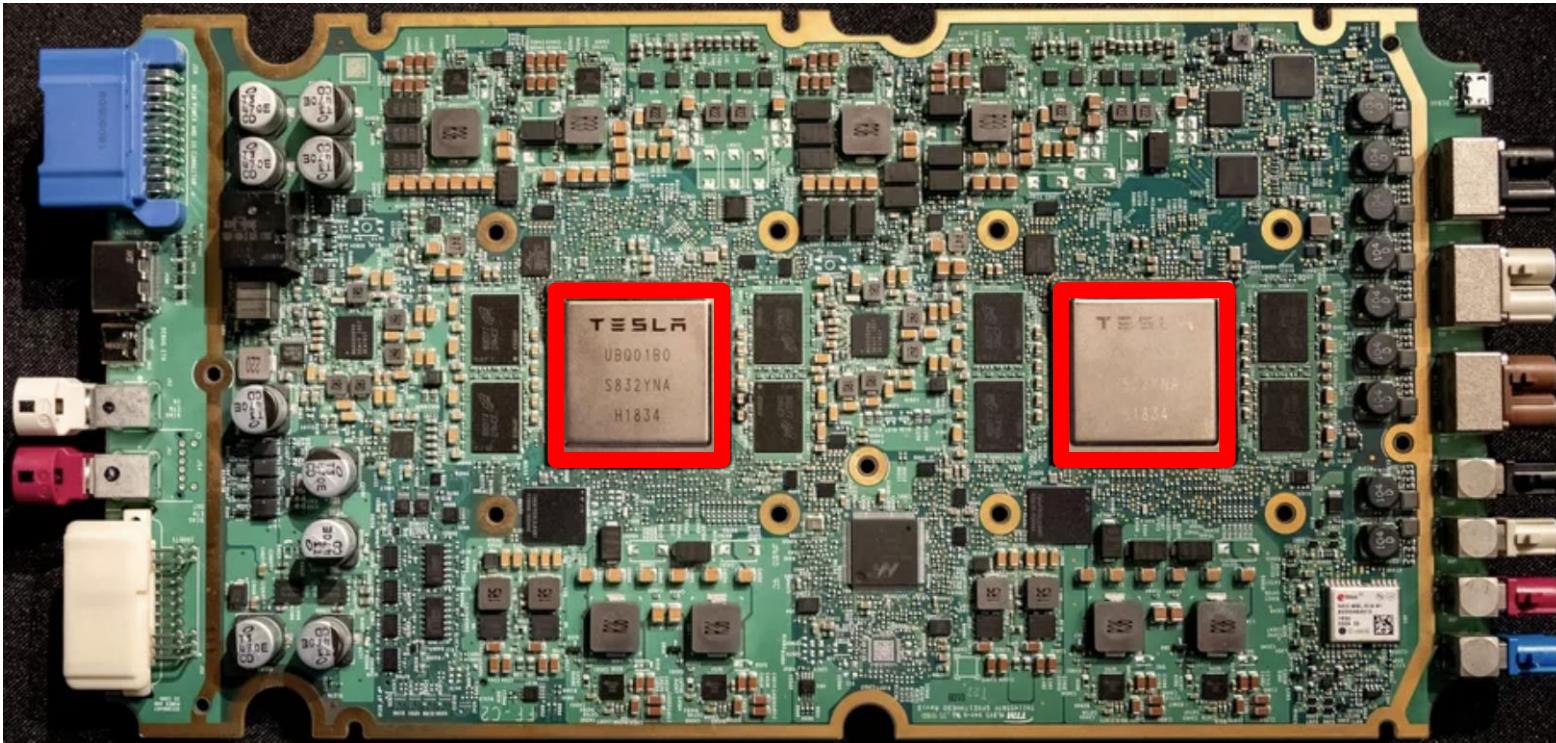


Figure 4. Systolic data flow of the Matrix Multiply Unit. Software has the illusion that each 256B input is read at once, and they instantly update one location of each of 256 accumulator RAMs.

Jouppi et al., "In-Datacenter Performance Analysis of a Tensor Processing Unit", ISCA 2017.

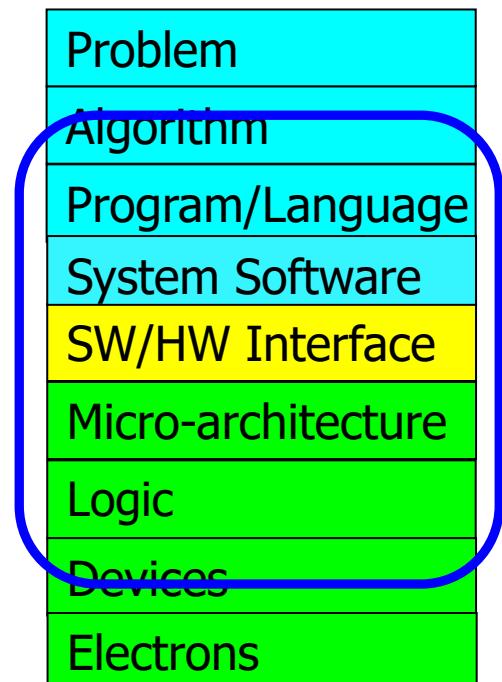
Različite platforme, različiti ciljevi

- ML accelerator: 260 mm², 6 billion transistors, 600 GFLOPS GPU, 12 ARM 2.2 GHz CPUs.
- Dva redundantna čipa radi sigurnosti.



Aksiom

Da bismo postigli najbolju energetsku efikasnost i performanse,
Moramo koristiti prošireni pogled na računalo.



**Ko-dizajnirati kroz hijerarhiju
algoritme prema uređajima**

**Specijalizirati koliko je moguće
unutar ciljeva dizajna**

Što je građa računala/računalna arhitektura?

- Znanost I umjetnost dizajniranja, odabiranja I povezivanja hardverskih komponenti I dizajniranje hardver/softver sučelja radi kreiranja računalnog sustava koji je u skladu sa zahtjevima – funkcionalnim, zahtjevima za performanse, potrošnje, cijene I sličnih ciljeva

Zašto treba upoznati građu računala?

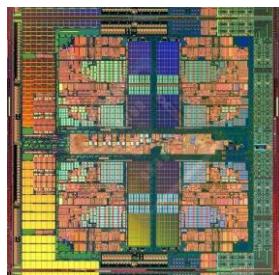
- Razvoj boljih sustava: bržih, jeftinijih, manjih, pouzdanijih
 - Korištenjem napretka i promjena u proizvodnim tehnologijama
- Razvoj boljih aplikacija
 - Gdje je 3D bio prije 20 godina? VR? Samovozeći automobile?
 - Analiza genoma? Personalizirana medicina?
- Razvoj boljih rješenja za probleme
 - Softverske inovacije su izgrađene na trendovima i promjenama u računalnoj arhitekturi
 - Moore-ov zakon o napretku performansi omogućava ovakav napredak
- Da razumijemo zašto računala rade kako rade

Računalna arhitektura danas

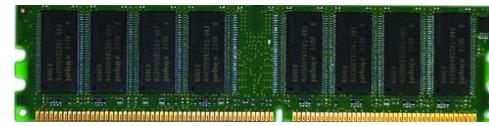
- Vrlo dobro vrijeme za učenje o računalnoj arhitekturi i građi računala
- Industrija je u fazi velikih promjena (nove arhitekture) – velika količina različitih potencijalnih dizajna
- **Velika količina kompleksnih problema motiviraju, ali su i uzrokovane promjenama**
 - Glad za podacima i aplikacijama koje intenzivno rade s podacima
 - Ograničenja u dizajnu po pitanju potrošnje, energije, zahtjeva za hlađenjem
 - Kompleksnost dizajna
 - Problemi u skaliranju tehnologije
 - Usko grlo memorije
 - Problemi sa pouzdanošću
 - Problemi sa programibilnošću
 - Problemi sa sigurnosti
- Na ova pitanja nemamo nužno jednoznačne, definitivne odgovore

Računalna arhitektura danas

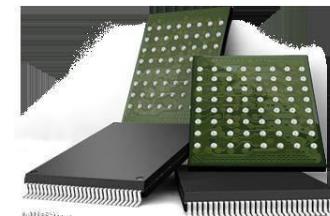
- Velika razlika u usporedbi sa 90-im ili 2000-im
- Aplikacije I tehnologije traže nove arhitekture



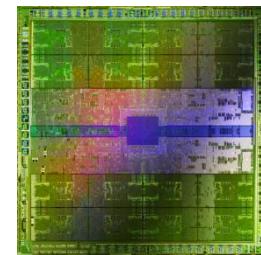
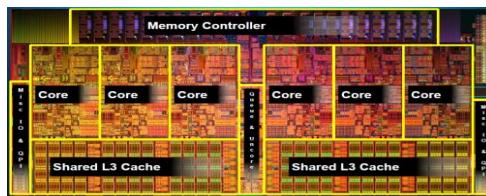
Heterogeni procesori I akceleratori



Hibridna memorija



Perzistentna memorija I pohrana



Grafičko procesiranje

**Sve komponente I sučelja
prolaze kroz
fazu ponovnog pregleda**

Iz povijesti: “Prilike na dnu”

There's Plenty of Room at the Bottom

From Wikipedia, the free encyclopedia

"**There's Plenty of Room at the Bottom: An Invitation to Enter a New Field of Physics**" was a lecture given by [physicist Richard Feynman](#) at the annual [American Physical Society](#) meeting at [Caltech](#) on December 29, 1959.^[1] Feynman considered the possibility of direct manipulation of individual atoms as a more powerful form of synthetic chemistry than those used at the time. Although versions of the talk were reprinted in a few popular magazines, it went largely unnoticed and did not inspire the conceptual beginnings of the field. Beginning in the 1980s, nanotechnology advocates cited it to establish the scientific credibility of their work.

https://en.wikipedia.org/wiki/There%27s_Plenty_of_Room_at_the_Bottom

Važne postavke “prilika na dnu”

- Moore-ov zakon
- Kako “produljiti” vijek trajanja?
 - Proizvodnja manjih tranzistora – već sada su na razini “par atoma”
 - Pronalaženje materijala sa boljim svojstvima – npr. bakar umjesto aluminija, hafnium oksid i zrak za izolaciju, kompatibilnost materijala (veliki izazov)
 - Preciznijom proizvodnjom (ExtremeUV za $<10\text{nm}$ nodove)
 - Kreiranjem novih tehnologija – FinFET, Gate All Around tranzistori, Single Electron transistor, ...
- Zašto? Zato što smo često previše lijeni da mijenjamo “na vrhu”

Iz povijesti: “Prilike na vrhu”

REVIEW

There's plenty of room at the Top: What will drive computer performance after Moore's law?

Charles E. Leiserson¹, Neil C. Thompson^{1,2,*}, Joel S. Emer^{1,3}, Bradley C. Kuszmaul^{1,†}, Butler W. Lampson^{1,4}, ...

* See all authors and affiliations

Science 05 Jun 2020:
Vol. 368, Issue 6495, eaam9744
DOI: 10.1126/science.aam9744

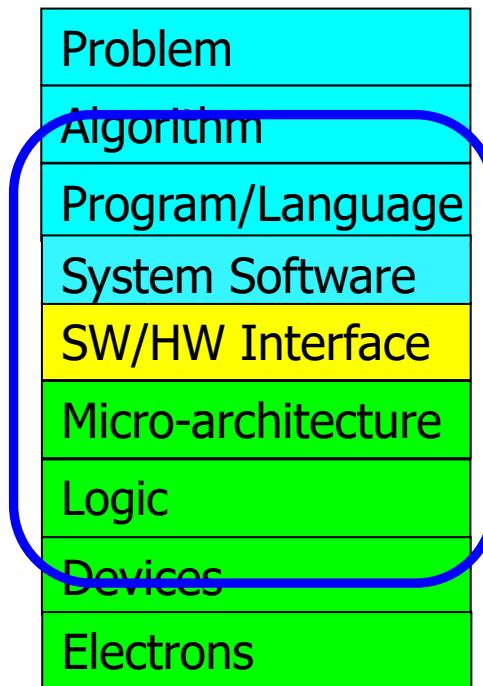
Much of the improvement in computer performance comes from decades of miniaturization of computer components, a trend that was foreseen by the Nobel Prize-winning physicist Richard Feynman in his 1959 address, “There's Plenty of Room at the Bottom,” to the American Physical Society. In 1975, Intel founder Gordon Moore predicted the regularity of this miniaturization trend, now called Moore's law, which, until recently, doubled the number of transistors on computer chips every 2 years.

Unfortunately, semiconductor miniaturization is running out of steam as a viable way to grow computer performance—there isn't much more room at the “Bottom.” If growth in computing power stalls, practically all industries will face challenges to their productivity. Nevertheless, opportunities for growth in computing performance will still be available, especially at the “Top” of the computing-technology stack: software, algorithms, and hardware architecture.

Axiom, još jednom

Ima puno prostora I “na vrhu” I na dnu”, ali još više prostora I prilika imamo ako kvalitetno komuniciramo između “vrha” I dna” I ako optimiziramo kroz cijeli stack

Zato nam je bitan prošireni pogled



Jako puno je noviteta u razvoju računala

Jako puno je noviteta u razvoju računala

Performanse

I

Energetska efikasnost

Intel Optane Persistent Memory (2019)

- Postojana podatkovna memorija
- Bazirana na 3D-XPoint tehnologiji



PCM kao glavna memorija: Ideja iz 2009

- Benjamin C. Lee, Engin Ipek, Onur Mutlu, and Doug Burger,
"Architecting Phase Change Memory as a Scalable DRAM Alternative"
Proceedings of the 36th International Symposium on Computer Architecture (ISCA), pages 2-13, Austin, TX, June 2009. Slides (pdf)

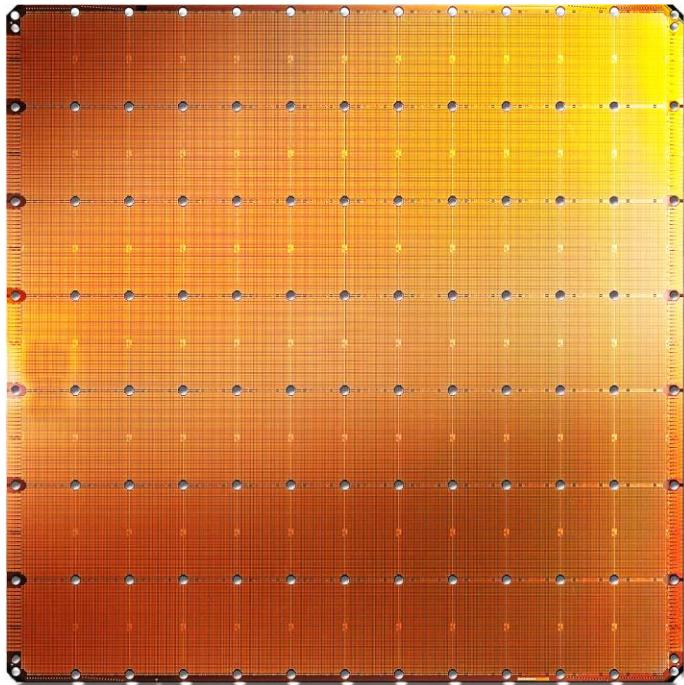
Architecting Phase Change Memory as a Scalable DRAM Alternative

Benjamin C. Lee[†] Engin Ipek[†] Onur Mutlu[‡] Doug Burger[†]

[†]Computer Architecture Group
Microsoft Research
Redmond, WA
`{blee, ipek, dburger}@microsoft.com`

[‡]Computer Architecture Laboratory
Carnegie Mellon University
Pittsburgh, PA
`onur@cmu.edu`

Cerebras's Wafer Scale Engine (2019)



Cerebras WSE

1.2 Trillion transistors
 $46,225 \text{ mm}^2$

- Najveći ML akcelerator na čipu
- 400,000 jezgri



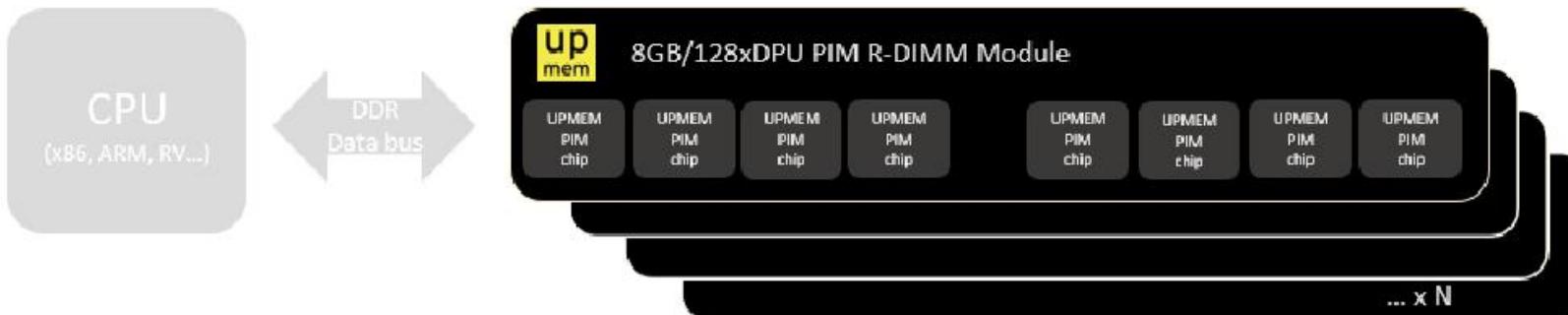
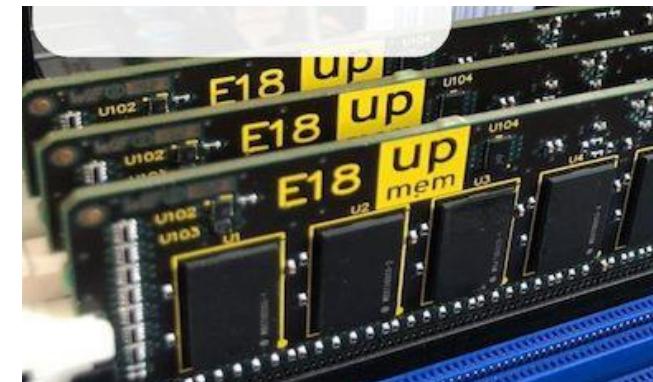
Largest GPU
21.1 Billion transistors
 815 mm^2

NVIDIA TITAN V

<https://www.cerebras.net/cerebras-wafer-scale-engine-why-we-need-big-chips-for-deep-learning/>

UPMEM Processing-in-DRAM Engine (2019)

- Procesiranje u DRAM-u
- Uključuje standardne DIMM module, sa velikim brojem DPU procesora koji su kombinirani sa DRAM čipovima
- Zamjena za standardne DIMM-ove
 - DDR4 R-DIMM modules
 - 8GB+128 DPU (16 PIM chips)
 - Standard 2x-nm DRAM process
 - **Ogromne rezerve** compute & memory bandwidtha



Samsung Function-in-Memory DRAM (2021)

Samsung
Newsroom

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Samsung Develops Industry's First High Bandwidth Memory with AI Processing Power

Korea on February 17, 2021

Audio



Share



The new architecture will deliver over twice the system performance and reduce energy consumption by more than 70%

Samsung Electronics, the world leader in advanced memory technology, today announced that it has developed the industry's first High Bandwidth Memory (HBM) integrated with artificial intelligence (AI) processing power – the HBM-PIM. The new processing-in-memory (PIM) architecture brings powerful AI computing capabilities inside high-performance memory, to accelerate large-scale processing in data centers, high performance computing (HPC) systems and AI-enabled mobile applications.

Kwangil Park, senior vice president of Memory Product Planning at Samsung Electronics stated, "Our groundbreaking HBM-PIM is the industry's first programmable PIM solution tailored for diverse AI-driven workloads such as HPC, training and inference. We plan to build upon this breakthrough by further collaborating with AI solution providers for even more advanced PIM-powered applications."

Specialized Processing in Memory (2015)

- Junwhan Ahn, Sungpack Hong, Sungjoo Yoo, Onur Mutlu, and Kiyoung Choi,
"A Scalable Processing-in-Memory Accelerator for Parallel Graph Processing"
Proceedings of the 42nd International Symposium on Computer Architecture (ISCA), Portland, OR, June 2015.
[Slides (pdf)] **[Lightning Session Slides (pdf)]**

A Scalable Processing-in-Memory Accelerator for Parallel Graph Processing

Junwhan Ahn Sungpack Hong[§] Sungjoo Yoo Onur Mutlu[†] Kiyoung Choi
junwhan@snu.ac.kr, sungpack.hong@oracle.com, sungjoo.yoo@gmail.com, onur@cmu.edu, kchoi@snu.ac.kr
Seoul National University [§]Oracle Labs [†]Carnegie Mellon University

Simple Processing in Memory (2015)

- Junwhan Ahn, Sungjoo Yoo, Onur Mutlu, and Kiyoung Choi,
"PIM-Enabled Instructions: A Low-Overhead, Locality-Aware Processing-in-Memory Architecture"
Proceedings of the 42nd International Symposium on Computer Architecture (ISCA), Portland, OR, June 2015.
[Slides (pdf)] [Lightning Session Slides (pdf)]

PIM-Enabled Instructions: A Low-Overhead, Locality-Aware Processing-in-Memory Architecture

Junwhan Ahn Sungjoo Yoo Onur Mutlu[†] Kiyoung Choi
junwhan@snu.ac.kr, sungjoo.yoo@gmail.com, onur@cmu.edu, kchoi@snu.ac.kr

Seoul National University

[†]Carnegie Mellon University

Processing in Memory on Mobile Devices

- Amirali Boroumand, Saugata Ghose, Youngsok Kim, Rachata Ausavarungnirun, Eric Shiu, Rahul Thakur, Daehyun Kim, Aki Kuusela, Allan Knies, Parthasarathy Ranganathan, and Onur Mutlu,
"Google Workloads for Consumer Devices: Mitigating Data Movement Bottlenecks"

Proceedings of the 23rd International Conference on Architectural Support for Programming Languages and Operating Systems (ASPLOS), Williamsburg, VA, USA March 2018

Google Workloads for Consumer Devices: Mitigating Data Movement Bottlenecks

Amirali Boroumand¹ Saugata Ghose¹ Youngsok Kim²
Rachata Ausavarungnirun¹ Eric Shiu³ Rahul Thakur³ Daehyun Kim^{4,3}
Aki Kuusela³ Allan Knies³ Parthasarathy Ranganathan³ Onur Mutlu^{5,1}

In-DRAM Processing (2013)

- Vivek Seshadri et al., “Ambit: In-Memory Accelerator for Bulk Bitwise Operations Using Commodity DRAM Technology,” MICRO 2017.

Ambit: In-Memory Accelerator for Bulk Bitwise Operations Using Commodity DRAM Technology

Vivek Seshadri^{1,5} Donghyuk Lee^{2,5} Thomas Mullins^{3,5} Hasan Hassan⁴ Amirali Boroumand⁵
Jeremie Kim^{4,5} Michael A. Kozuch³ Onur Mutlu^{4,5} Phillip B. Gibbons⁵ Todd C. Mowry⁵

¹Microsoft Research India ²NVIDIA Research ³Intel ⁴ETH Zürich ⁵Carnegie Mellon University

Google TPU Generation I (~2016)



Figure 3. TPU Printed Circuit Board. It can be inserted in the slot for an SATA disk in a server, but the card uses PCIe Gen3 x16.

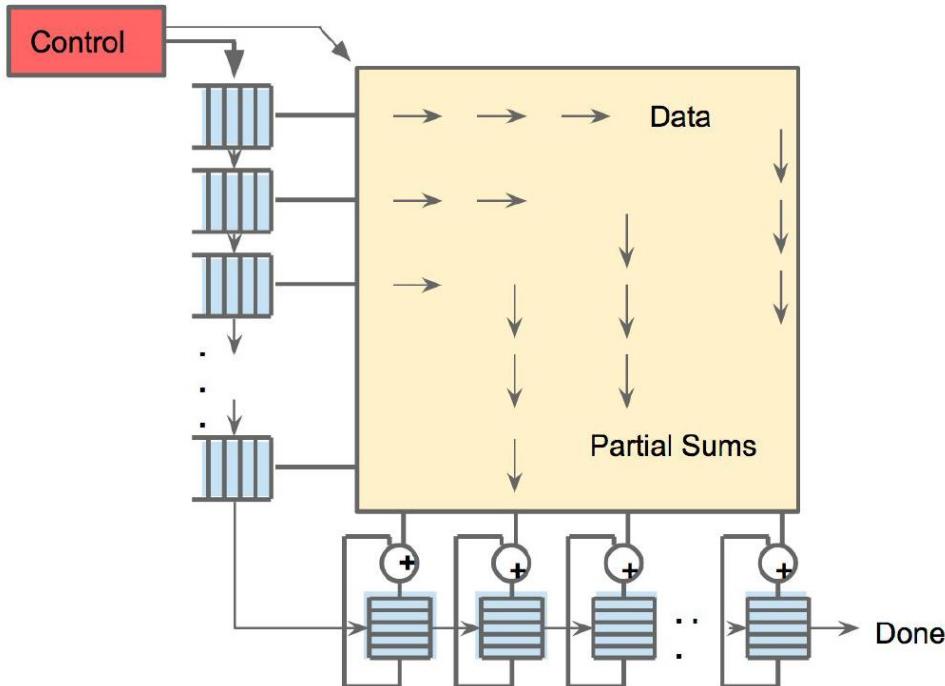


Figure 4. Systolic data flow of the Matrix Multiply Unit. Software has the illusion that each 256B input is read at once, and they instantly update one location of each of 256 accumulator RAMs.

Jouppi et al., “In-Datacenter Performance Analysis of a Tensor Processing Unit”, ISCA 2017.

Google TPU Generation II (2017)



<https://www.nextplatform.com/2017/05/17/first-depth-look-googles-new-second-generation-tpu/>

4 TPU chips
vs 1 chip in TPU1

High Bandwidth Memory
vs DDR3

Floating point operations
vs FP16

45 TFLOPS per chip
vs 23 TOPS

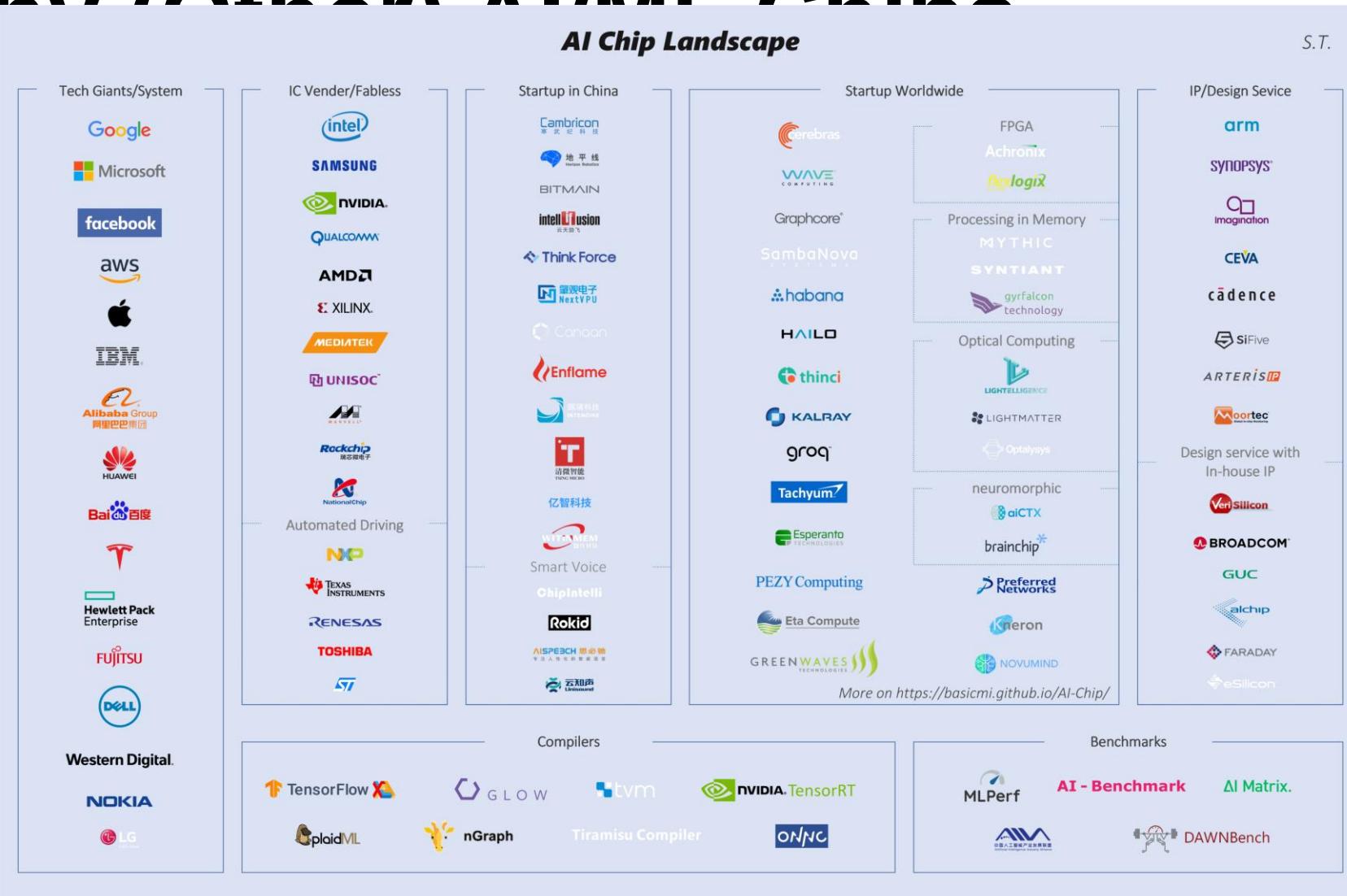
Designed for training
and inference
vs only inference

Ogromna količina AI/ML čipova drugih tvrtki

- Alibaba
- Amazon
- Facebook
- Google
- Huawei
- Intel
- Microsoft
- NVIDIA
- Tesla
- I još puno drugih koji tek dolaze...

Many (Other) AI/ML Chips

- Alibaba
- Amazon
- Facebook
- Google
- Huawei
- Microsoft
- NVIDIA
- Tesla
- Many
- Many



Puno zanimljivosti u građi računala danas

**Puno zanimljivosti u građi računala
danas**

Pouzdanost I sigurnost

Sigurnost: RowHammer (2014)



Priča o RowHammer napadu

- Predvidiva promjena bitova u uobičajenim DRAM čipovima
 - > 80% testiranih DRAM čipova je “ranjiva”
- Jedan u nizu primjera kako jednostavan hardverski problem može značiti veliku ranjivost na razini cijelog sustava

WIRED

Forget Software—Now Hackers Are Exploiting Physics

BUSINESS

CULTURE

DESIGN

GEAR

SCIENCE

ANDY GREENBERG SECURITY 08.31.16 7:00 AM

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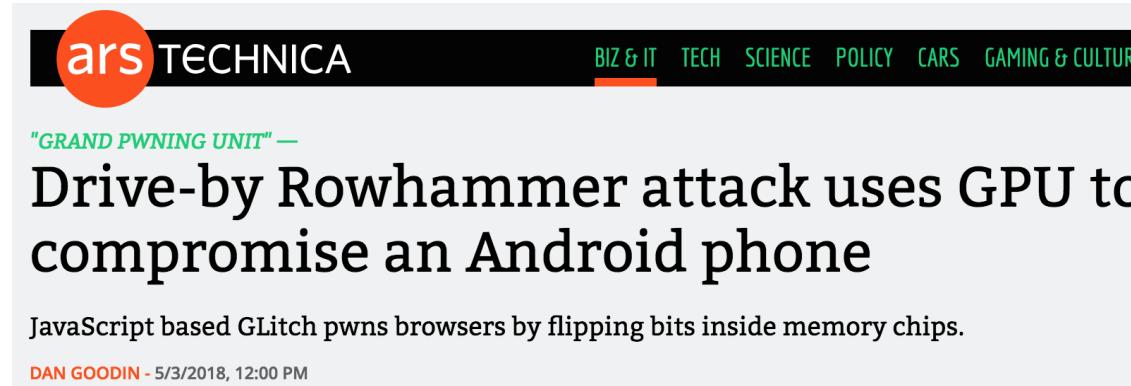
 SHARE
18276

 TWEET

FORGET SOFTWARE—NOW
HACKERS ARE EXPLOITING
PHYSICS

Još sigurnosnih problema

- Korištenje integriranog GPU-a u mobilnom sustavu za eskalaciju privilegija kroz WebGL sučelje



Grand Pwning Unit: Accelerating Microarchitectural Attacks with the GPU

Pietro Frigo
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Amsterdam
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Cristiano Giuffrida
Vrije Universiteit
Amsterdam
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Herbert Bos
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Kaveh Razavi
Vrije Universiteit
Amsterdam
kaveh@cs.vu.nl

Sigurnost: Meltdown i Spectre (2018)



Meltdown i Spectre

- Netko nam može ukrasti tajne podatke sa sustava, iako:
 - Aplikacije i podaci rade korektno
 - Hardver radi prema specifikaciji
 - Nemamo nikakvih problema sa softverskim ranjivostima ili bugovima
- Zašto?
 - Spekulativno izvršavanje ostavlja tragove tajnih podataka u cache memoriji procesora
 - Podaci koji ne bi trebali biti tu da nema spekulativnog izvršavanja
 - Maliciozni program može pregledati sadržaj cache memorije da pokupi tajne podatke do kojih ne bi trebao imati pristup
 - Maliciozni program može prisiliti drugi program da spekulativno izvrši kod koji ostavlja tragove tajnih podataka

Više o Meltdown/Spectre ranjivostima

Project Zero

News and updates from the Project Zero team at Google

Wednesday, January 3, 2018

Reading privileged memory with a side-channel

Posted by Jann Horn, Project Zero

We have discovered that CPU data cache timing can be abused to efficiently leak information out of mis-speculated execution, leading to (at worst) arbitrary virtual memory read vulnerabilities across local security boundaries in various contexts.

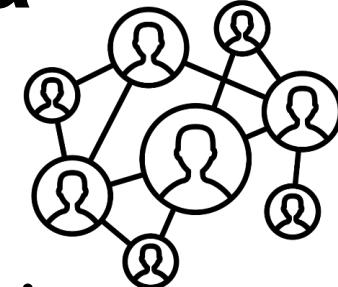
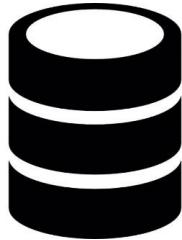
Sve zahtjevније aplikacije

Zamisli,

I ostvariti će se

Kako aplikacije pomiču granice, računala sve teže odrađuju potrebne poslove

Podaci zatrپavaju moderna ra unala



In-memory Databases

Data → performance & energy bottleneck

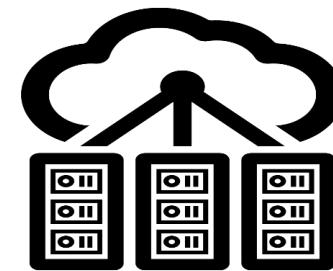


In-Memory Data Analytics

[Clapp+ (Intel), IISWC'15;
Awan+, BDCloud'15]

Datacenter Workloads

[Kanev+ (Google), ISCA'15]



Podaci zatrپavaju moderna ra unala



Chrome



TensorFlow Mobile

Data → performance & energy bottleneck



Video Playback

Google's **video codec**



Video Capture

Google's **video codec**

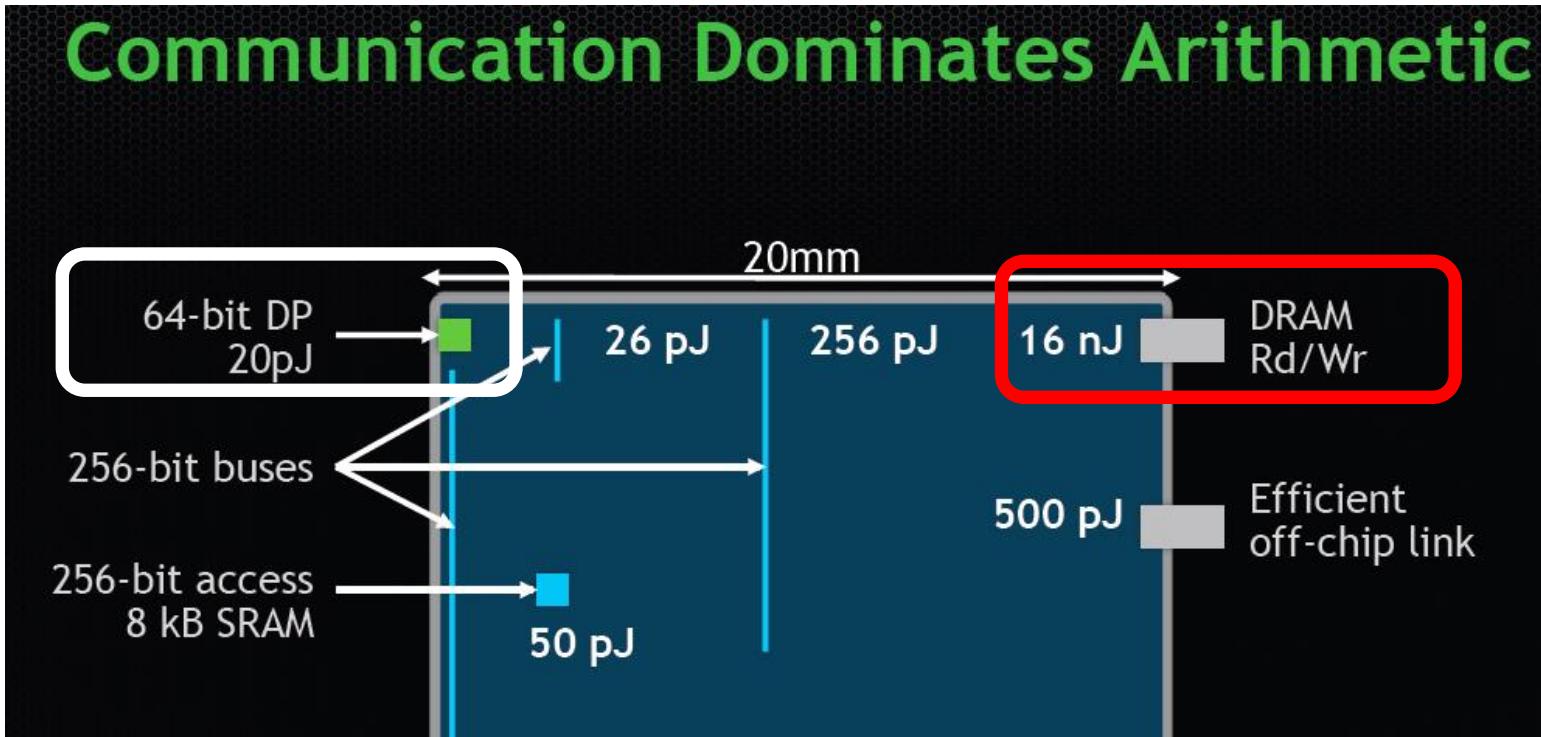
Premještanje podataka “ubija” rad računala

**62.7% ukupne energije koju sustav troši se
troši na premještanje podataka**

Google Workloads for Consumer Devices: Mitigating Data Movement Bottlenecks

Amirali Boroumand¹ Saugata Ghose¹ Youngsok Kim²
Rachata Ausavarungnirun¹ Eric Shiu³ Rahul Thakur³ Daehyun Kim^{4,3}
Aki Kuusela³ Allan Knies³ Parthasarathy Ranganathan³ Onur Mutlu^{5,1}

Premještanje podataka vs. Potrošnja za računanje



Dally, HiPEAC 2015

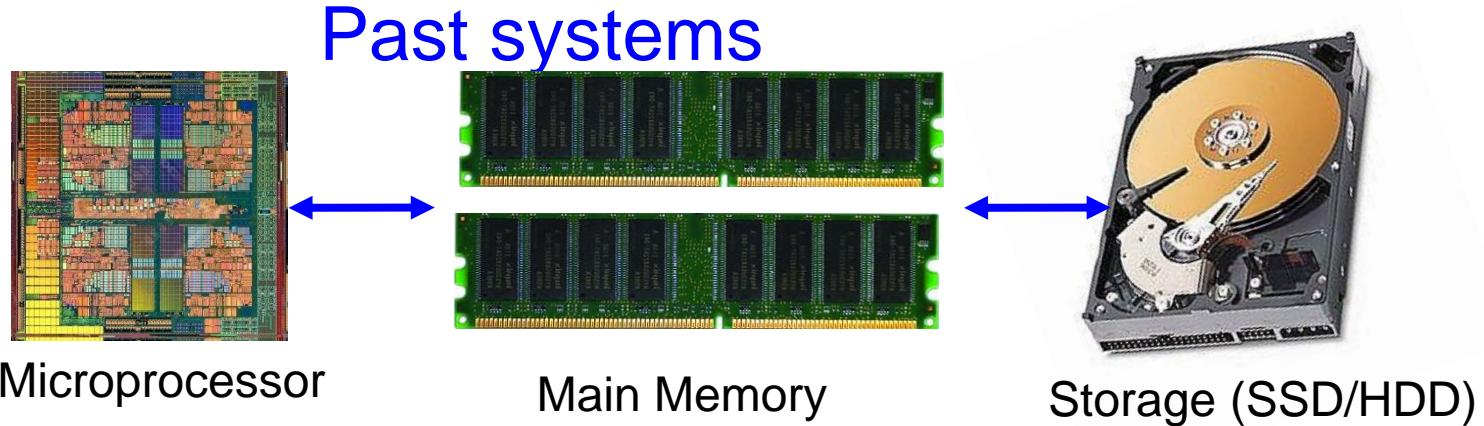
Memory access consumes $\sim 100\text{-}1000\times$
the energy of a complex addition

Puno zanimljivosti u građi računala danas

Istražuje se velika količina novih ideja

- Nove paradigmе computinga (Full Stack)
 - Procesiranje u memoriji, procesiranje “blizu” podataka
 - Neuromorfno racunarstvo
 - Sigurno I pouzdano računarstvo
- Novi akceleratori (Algoritam-Hardver ko-dizajn)
 - Artificial Intelligence & Machine Learning
 - Graph Analytics
 - Genome Analysis
- Nove vrste memorija I sustava za pohranu
 - Postojana podatkovna memorija
 - Procesiranje u memoriji, inteligentna memorija

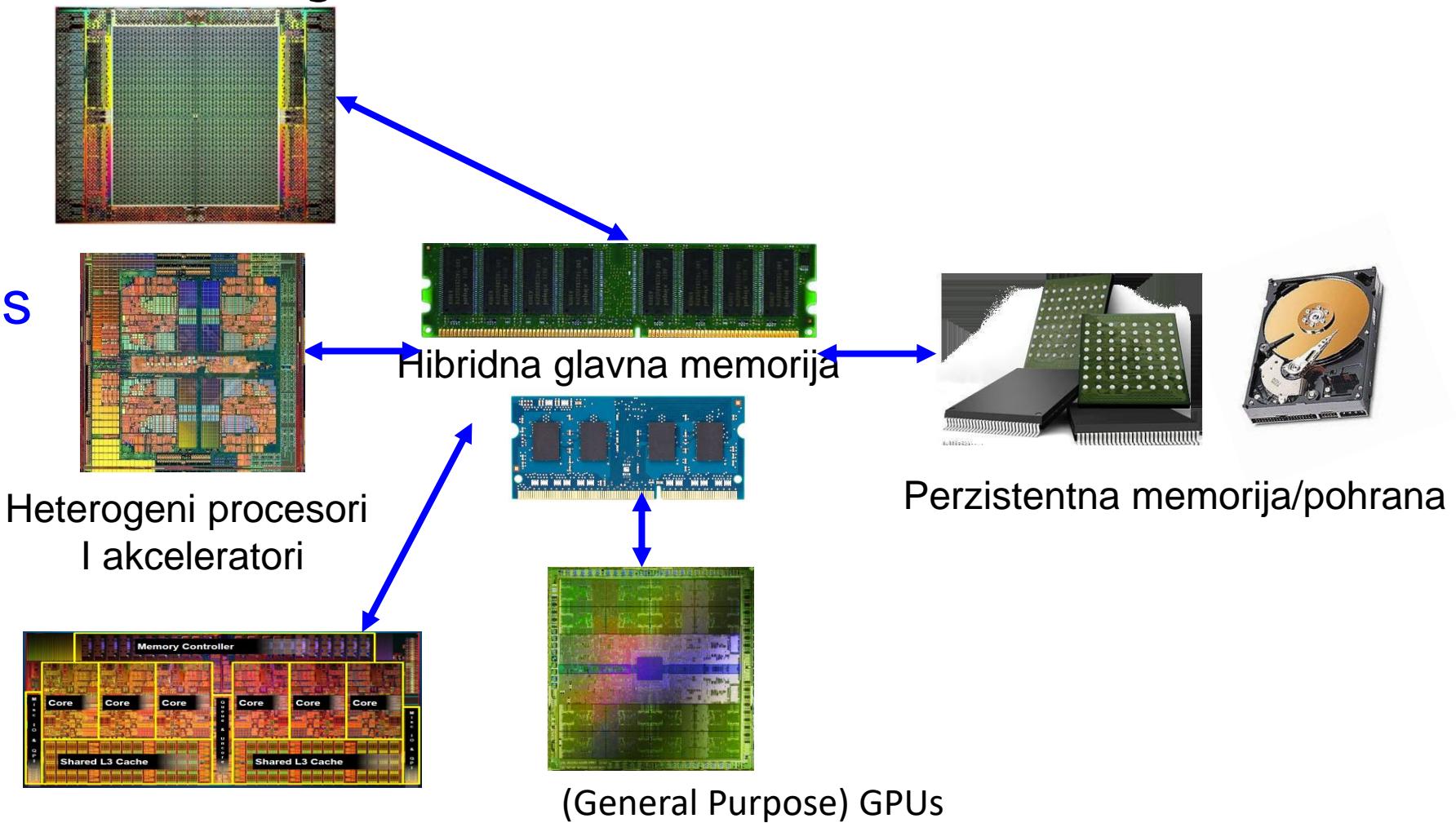
Sve kompleksniji sustavi



Sve kompleksniji sustavi

FPGA

Modern systems



Gradja računala danas

- Revolucija dolazi iz razumijevanja kako hardver I softver rade (I kako promijeniti obje tehnologije)
- Postoji puno prostora za izum novih paradigm za računanje, komunikaciju I pohranu
- Preporučeno štivo za pročitati: Thomas Kuhn, “[The Structure of Scientific Revolutions](#)” (1962)
 - Znanost “prije paradigmme” – nema knosenzusa oko nove tehnologije
 - “Normalna” znanost – nešto postaje dominantna teorija koju koristimo za objašnjavanje I unaprjeđivanje (postaju “business as usual”), iznimke se smatraju anomalijama
 - Revolucionarna znanost – prethodne pretpostavke se ponovno pregledavaju



Hvala na
pažnji!