# Numbers and Calculators 

ARCHI 2019


## TOP 500



Summit
2,397,824 Cores
2,801,664 GB mem
200,795 TFlop/s

13,000,000 W
200,000,000 \$



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MareNostrum P9 CTE
19,440 Cores
27,648 GB mem
1,018 TFlop/s

85,000 W
34,000,000 €


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Version $\mathrm{N}^{\circ} 3$
38 PFlop/s

85,000 W
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20 Watts
30,000 €

TOP 500 The List.


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## Outline

1. Analogic computation
2. Computer's Zoo
3. A few words about gate
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## Numbers in continuous space: Analog computer

- Uses continuous property of physical phenomena (electrical, mechanical, hydraulic)
- Resilient to quantization noise But subject to physical noise (electronic, $\left.{ }^{\circ} \mathrm{C}, . ..\right)$
- Can be more powerful than digital computer
- Dominant in HPC until the 70s
- Example:
- Used for the Apollo 11 mission
- Tide-Prediction machine (William \& James Thomson)


## Alternatives to numerical computer

- Human Brain
- 38 PetaFlops, 20 Watts
- Analog computer
- Not program by algorithm no need to store, fetch, decode instructions and operand
- Hybrid digital / analog computer
- Complement their digital counterparts in solving equations relevant in:
Biology, fluid dynamics, weather prediction, quantum chemistry, plasma physics, ...


## Toward an hybrid analog co-processor



Telefunken RA770

- System configured by the equations similar to the targeted system and allow variables in the analog computer to evolve with time
- Analog computer to provide a quick approximation
- Digital computer for programming, storage and precision
- Example
$\mathrm{d} x_{1} / \mathrm{d} t=a_{1} x_{1}+f_{1}\left(x_{2}\right)+b_{1}$
$\mathrm{d} x_{2} / \mathrm{d} t=a_{2} x_{2}+f_{2}\left(x_{1}\right)+b_{2}$

2 diff. equation with 2 variables


Cowan, G. E. R., Melville, R. C., \& Tsividis, Y. P. (2006). A VLSI Analog Computer/Digital Computer Accelerator. IEEE Journal of Solid-State Circuits, 41(1), 42-53. doi:10.1109/jssc.2005.858618

## Toward an hybrid analog co-processor

Predator-Prey model: Rabbit evolution's

$$
\frac{d r}{d t}=\alpha_{1} r-\alpha_{2} r f
$$ Fox evolution's

$\frac{d f}{d t}=-\beta_{1} f+\beta_{2} r f$


- Advantages
- Voltages \& currents evolves continuously
- Highly parallel
- No clock
- Accuracy within a few percent
- Limitations
- Large problem requires large numbers of analog computational blocks (or be able to divide by hand the problem => not parallel anymore)
- Difficult to configure and connect distant analog blocks
- Difficult in implementing multivalued functions
- Approximate computing: Precision can't be increased by adding "bit", it requires larger chips
- Difficult to program Compiler attempt


## Neuromorphic computing

- Limit of the Turing-Von Neumann model
- Use analog circuit to mimic neurobiological architectures
- Memristors
- Spintronic memories
- Threshold switches

- Initiative to rethink the concept of computing
- IEEE Rebooting Computing


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MicroVax 3000 (1987): in Cyrillic alphabet
" VAX - when you care enough to steal the very best".


Magnified Intel 8207 controller dual-port RAM.
Shepherd with two headed ram.

## Binary pneumatic adder


Pneumatic AND Gate

Pneumatic OR Gate


Transistor Amplifier


Pneumatic XOR Gate

http://only-paper.ru/forum/38-23291-1

## Fluidic calculator

- Use of a Fluid to perform analog or digital operation
- Pneumatics
- Hydraulics
- No moving part (paper computer is not consider fluidic)
- Use in environment where electronic digital is unreliable (electromagnetic interference, ionizing radiation... )



## Fluidic calculator: Examples



MONIAC (1949) Computer to simulate economic principles at a time digital computer could not.


FLUID CIRCUIT performs the operation of dividing by 10 in an all-fluid digital computer: for every 10 input pulses circuit delivers one output pulse. Input pulses enter from above the plane of circuit through circular, bumplike hole attached to straight channel running from top to bottom just to right of center. The 10 identical logic elements, or modules, are arranged in a series of five pairs, three at left and two at right. Each pair contains two steady input streams (small sausage shapes), two outputs (small circular
shapes attached to short straight channels), eight control jets (small teardrop shapes) and eight open vents (large circular shapes)


Aircraft Flight control systems, Valve in anesthesia machines for its advantages (lower mass, cost, drag, inertia, complexity)

## Mechanical computers

- Various form
- Build from levers \& gears
- Balls
- Dominos



## Flip-Flop

- Definition:

A Flip-Flop (latch) is a circuit that has 2 stable states and can be used to store state information.


## Marble’s Flip-Flop

Objectives:
How to design a system with a minimum number of gate ?


https://www.turingtumble.com/

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## 1945: ENIAC




When Computers Were Women

## ENNIFER S. LIGHT

Preper Pdert ad ohn W

 neers dominate the story ys it is usalaly told, but they hardly worked alone
Nearly two hundred poung women, both civilian and military, worked on




 the ermale technicians whom exising computer histories have render
invisible. In purticulat it examines how the oob of progammet perceive









## ENIAC: Numbers

- 20 accumulators / modules
- ADD / SUBSTRACT
- 10 Decimal Digit «Register » in
- Serial decimal (10 bits per digit)
- With a ring counter made of cascaded flip-flop (bit shift) (!= binary counter)
- Arithmetic done by "counting" pulses with the ring counter and generate carry pulse if the counter wrapped around. (idea borrowed from digit wheels of mechanical adding machine)
- Constant entered with punched cards
- Numbers transferred between module through buses


ENIAC decade ring counter. From Burks, "Electronic Computing Circuits of the ENIAC," Proceedings of the IRE 35: 746-767, ${ }^{\text {a/ }}$ IRE (now IEEE), 1947. All rights reserved.

## ENIAC: Operations



Programming done by women
(switches and cables)

## ENIAC: Multiplication

Question:
How to decompose the set of numbers $\{0,1,2,3,4,5,6,7,8,9\}$ With a set of numbers of minimal size ?


Fig. 4-Block diagram of multiplication circuits.

## What is the best radix?

- A metric: Radix economy

$$
E(b, N)=\left[\log _{b}(N)+1\right] \cdot b
$$

- Number of digits (N) * Number of possible values each digit could have (b)
- Example: $\mathbf{1 0 0}_{10}$
- $100_{10}$ : 3 digits
$\mathrm{E}=3 * 10=30$
- $1100100_{2}: 7$ digits
$\mathrm{E}=7$ * $2=14$
- $10201_{3}: 5$ digits
$\mathrm{E}=5$ * $3=15$
- But binary system has greater noise immunity

| Base | $\mathbf{E}(\mathbf{b}, \mathbf{5 3 2 9})$ |
| :---: | :---: |
| 1 | 2665 |
| 2 | 22,9 |
| $\mathbf{e}$ | 22,1 |
| 3 | 22,2 |
| 4 | 23,9 |
| 5 | 26,3 |
| 6 | 28,3 |
| 7 | 31,3 |
| 8 | 33 |
| 9 | 34,6 |
| 10 | 37,9 |
| 16 | 50,9 |
| 20 | 58,4 |
| 30 | 84,8 |
| 40 | 107,7 |
| 60 | 138,8 |

## Ternary calculation

- Fowler's machine (1840), Treasurer of the Poor Law Union
- Used to compute the proportional fee for each parish of the Poor Law Union
- Difficult task in the pre-decimal English currency
- 20 shilling $=1$ pound
- 12 pence $=1$ shilling
- 4 farthings = 1 penny
- Need to convert everything in farthing (=> large numbers)


St. Michaels Church, Devon, England


## 1958: SETUN

- Ternary computer
- Balanced ternary numeral system (-1|0|+1)
- Three-valued ternary logic (16 binary operators in Boolean logic \& 19683 in Ternary logic !)

http://trinary.ru/projects/setunws/
- Words made of 18 Trits
- Each trits stored in a pair of magnetic cores, wired in tandem to represent 3 stable states
- 1960's
- Attempt to build ternary logic gates and memory cells
- 1973 TERNAC (G. Frieder)
- Possible usage:
- Found in redundant binary representation to avoid carries propagation
- 2009: quantum computer made of qutrit (instead of qubit)
... and according to



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## Balanced Number: Why is that such a nice system ?

- System discussed by
A. Cauchy (1840), J. Leslie (1817), J. Colson’s (1726), ... Hindu Vedas (~1000 BCE)
- Balanced = arranged symmetrically around 0
- $E x=\{-1,0,1\}$
- 2-pan Balance to measure between $1-40 \mathrm{~g}$, How many weights required, when weights can go in 1 / 2 pan?
- (1,2,4,8,16,32 / 1,3,9,27)
- Properties
- Ease comparison ( 3 possible states (< = >) vs 2 (Yes/No) )
- Test Odd / Even:
- Radix2: Last digits
- Radix3: Number of 1 in the numeral
- Cut down the carry-rate in multi-digit multiplication
- No carry for 1 digit mult.
- Rounding = Truncation
- No diff. Between + / - numbers



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## Ways to use available transistors

1. 2000's: Vector Unit (Extension ISA)

| Year | 1996 | 1998 | 1999 | 2001 | 2004 | 2005 | 2006 | 2007 | 2008 | 2009 |  | 2012 | 2013 | 2014 | 2015 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| SIMD | MMX | 3DNow! | SSE | SSE2 | SSE3 |  | SSE4 |  | AVX | $\begin{gathered} \text { F16C/ } \\ \text { XOP } \end{gathered}$ |  | FMA | AVX2 |  | AVX-512 |
| SIMD Length | 64 |  | 128 |  |  |  |  |  | 256 |  |  |  |  |  | 512 |
| Bit Manipulation |  |  |  |  |  |  |  | ABM |  |  |  | BMI1 | BMI2 | ADX |  |
| Compressed Inst |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Crypto / Sec |  |  |  |  |  |  |  |  | AES-NI |  | CLMU | RdRand | SHA |  | MPX / SGX |
| Trans. mem |  |  |  |  |  |  |  |  |  |  |  |  | TSX |  |  |
| Virtualization |  |  |  |  |  | VT-x |  |  |  |  |  |  |  |  |  |
| \# inst. | 57 |  | 70 | 144 | 13 |  | 54 |  | 12 | 60 |  | 24 | 30 |  |  |

2. 2010's: More Cores (GPU)
3. 2020's: Dedicated core (Neural Network Processing unit)


## Example: AVX512 VNNI



## Trend: Fused operators

| Name | ++ | +*(FMA) | +/ | *+ | ** | */ | /+ | /* | // |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 168.wupwise | 38 | 74 | 0 | 42 | 27 | 0 | 7 | 4 | 0 |
| 171.swim | 180 | 184 | 0 | 162 | 48 | 0 | 10 | 7 | 0 |
| 172.mgrid | 249 | 98 | 0 | 91 | 11 | 0 | 2 | 0 | 0 |
| 173.applu | 1826 | 1783 | 86 | 1797 | 782 | 7 | 69 | 109 | 0 |
| 177.mesa | 116 | 274 | 0 | 164 | 71 | 0 | 10 | 10 | 0 |
| 178.galgel | 358 | 856 | 26 | 415 | 443 | 21 | 57 | 36 | 10 |
| 179.art | 73 | 98 | 0 | 100 | 34 | 0 | 8 | 3 | 0 |
| 183.equake | 52 | 119 | 3 | 75 | 74 | 8 | 10 | 8 | 1 |
| 188.ammp | 260 | 418 | 2 | 291 | 205 | 5 | 12 | 19 | 0 |
| 189.lucas | 80 | 402 | 0 | 87 | 54 | 2 | 2 | 2 | 0 |
| 191.fma3d | 215 | 461 | 12 | 266 | 144 | 11 | 24 | 32 | 0 |
| 301.apsi | 514 | 1015 | 175 | 881 | 673 | 83 | 192 | 302 | 14 |
| Total | 3961 | 5782 | 304 | 4371 | 2566 | 137 | 403 | 532 | 25 |

## Nvidia Tensor Core



## Google Tensor Processing Unit



## Google Tensor Processing Unit: A systolic array

- H.T. Kung, "Why systolic Architectures ?" IEEE Computer 1982.




## Nvidia Special Function Unit

$$
F(x)=C_{0}+C_{1} x+C_{2} x^{2}
$$

| Function | Input Interval | m | Configuration | Accuracy (good bits) | ulp <br> error | \% exactly rounded | monotonic | Lookup table size |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $1 / X$ | $[1,2)$ | 7 | 26,16,10 | 24.02 | 0.98 | 87\% | yes | 6.50 Kb |
| $1 / \sqrt{X}$ | $[1,4)$ | 6 | 26,16,10 | 23.40 | 1.52 | 78\% | yes | 6.50 Kb |
| $2^{x}$ | [0,1) | 6 | 26,16,10 | 22.51 | 1.41 | 74\% | yes | 3.25 Kb |
| $\log _{2} X$ | [1,2) | 6 | 26,16,10 | 22.57 | n/a | n/a | yes | 3.25 Kb |
| $\sin / \mathrm{cos}$ | [0, $\pi / 2$ ] | 6 | 26,15,11 | 22.47 | n/a | n/a | no | 3.25 Kb |
| Total | 22.75 Kb |  |  |  |  |  |  |  |



## Rise of a new era

- Uses transistors for specialized Hardware
- Nvidia SFU, Tensor Core
- Google Tensor Processing Unit
- Intel Loihi
- Microsoft Catapult
- Movidius Myriad 2 VPU
- Neuromorphic processor, IBM TrueNorth, SpiNNaker
- Quantized format
- FP16
- BFLOAT
- Flexpoint
- Unum
- FPANR


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## Endianness



- Little-endian
- Ease multi-byte addition due to carry propagation (reason Datapoint \& Intel selected it)
- Allow to read a numerical value independently of the length as long as it fits into memory
- Big-endian
- Allow to get an approximation by reading the first byte (sloppy arithmetic)
- Ease division (MSB)
- Middle-endian
- PDP-11


## Floating-Point formats

- 3 basic formats



## Floating-Point formats (1)



- FP format found on computer with 24-bit word length
- HP 2114-2116, SDS-9 series
- No hardware support
- Hardware integer multiplication
- $1^{\text {st }}$ bit of the second word ignored (or sign copy to easy Fixed-Point implementation)
- FP numbers represented by 2 signed binary numbers


## Floating-Point formats (2)



- FP format available on PDP-8 (1965) \& RECOMP II (1958)
- FP numbers represented by 2 signed binary numbers


## Floating-Point formats (3)

William Kahan


- FP compare instruction == Integer compare for positive nb
- Popular on architecture with FP hardware support
- PDP-11

1970: came with the hidden first bit trick

- IEEE-754

1985: W. Kahan

## Quantized Format

Range: ~0.00006; 65504
IEEE-754 FP16

| S | E | E | E | E | E | M | n | M | M | M | M | N | , | M | M | M |  | M |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 15 |  |  |  |  | 10 |  |  |  |  |  |  |  |  |  |  |  |  |  |

Range: $\sim 1 e^{-38} ; 3 e^{+38}$


1510
0


FPANR FP16

| S | E | E | E | E | E | M | M | M | M | M | M | M | M | U | U |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 15 |  |  |  | 10 |  |  |  |  |  |  |  |  |  |  |  |
|  |  | 0 |  |  |  |  |  |  |  |  |  |  |  |  |  |

D. Defour, "FP-ANR: A representation format to handle floating-point cancellation at run-time," 2018 IEEE 25th Symposium on Computer Arithmetic (ARITH), Amherst, MA, 2018, pp. 76-83

## Posit aka Unum III



## Number's representation

- Fixed-point
- Floating-point
- Logarithmic number systems
- Tapered floating-point representation
- Significance arithmetic


Multiprecision


Interval


Floue

- Arbitrary-precision
- Floating-point expansions
- Rational arithmetic
- Interval arithmetic
- Algebraic system


Stochastique


Gogoplex/minex $10^{\text {gogol }}=10^{10^{100}}$

LNS
... but always remember that according to


Recurring attempts to invent cheaper substitutes for Interval Arithmetic have all failed in the end after enough local limited success initially to tantalize their inventors with dreams of glory.

## Trend in computation

- Limit of the traditional Von Neuman -Turing model
- Power consumption
- Care about data transfer ( Bandwidth, Latency)
- New ISA
- Rise of alternative representation format
- Each bit count
- Low precision \& Approximate computing
- Mixed-precision
- Analogic computation (neuromorphic processor)
- New way of processing data
- Fused operators
- Self-correcting algorithms

