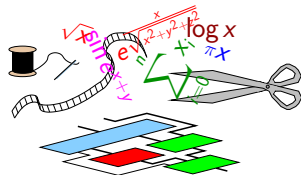


# Computing just right: Application-specific arithmetic

Florent de Dinechin



# Outline

Anti-introduction: the arithmetic you want in a processor

Operator parameterization

Operator specialization

Operator fusion

Tabulation of pre-computed values

Conclusion: the FloPoCo project

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## Processors are general-purpose

(more or less – Intel and ARM more, GPUs less)

The good arithmetic in a processor is the most generally useful: additions, multiplications, and then?

- *Should a processor include a divider and square root?*
- *Should a processor include elementary functions (exp, log sine/cosine)*
- *Should a processor include decimal hardware?*
- ...

## Should a processor include a divider? (1)

How do you divide  $X$  by  $D$ ?

# Should a processor include a divider? (1)

How do you divide  $X$  by  $D$ ? As in decimal, but simpler:

## The iteration of the paper-and-pencil algorithm

- find the next quotient digit *binary: it can be 0 or 1, so try 1*
- multiply this digit by the dividend *this one is easy*
- subtract from the divisor *one subtraction here*
- if the result is negative,
  - the quotient digit should have been zero,
  - therefore we should have subtracted 0,
  - it will be easy to fix.
- start again, one digit to the right

Very light iteration (one subtraction and one test),  
but each iteration provides only one bit of the quotient:  
(more than) **53 cycles** for double-precision floating-point.

## Should a processor include a divider? (2)

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### Digit recurrence algorithms

Generalizations of the paper-and-pencil algorithm

- large radix: from  $2^3$  to  $2^6$
- fancy internal number systems to speedup
  - digit-by-number product
  - subtraction
  - finding the next quotient digit

Heavier iterations,

giving one digit (2 to 5 bits) per iteration.

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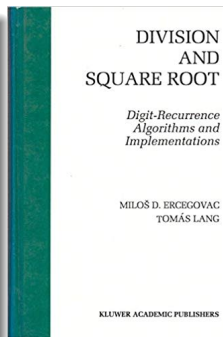
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A lot of research, worth one full book (Ercegovac and Lang, 1994)

## Should a processor include a divider? (3)

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The Itanium: a brand new processor without a divide instruction.

**Instead of a hardware divider,**  
**a second FMA (fused multiply and add) is more generally useful**  
and can even be used to compute divisions.

## Multiplicative division algorithms

Executive summary: approximate  $1/D$

- Various iterations involving 2 multiplications
  - Newton-Raphson, Goldschmidt, ...
  - Polynomial approximation (Taylor-like), ...
- Each iteration *doubles* the number of correct quotient digits

Heavy iterations, but few of them,  
and all the freedom of software.



... and two more books.

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Answer in 2018 is : **YES** again (Bruguera, Arith 2018)

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- speculation all over the place
- prescaling and other tricks
- iteration hardware: **20** fast 58-bit adders, **12** 58-bit muxes, and more...



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*We do this to reduce overall energy consumption!*

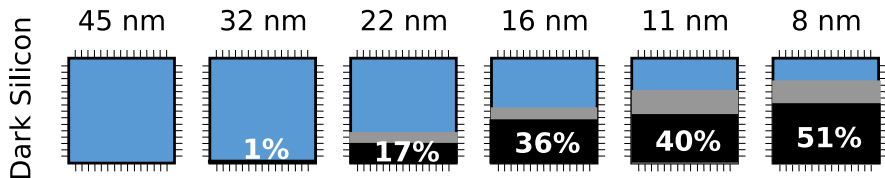
*There is this huge superscalar ARM core that consumes a lot, we save energy if we can switch it off a few cycles earlier*

# A good example of dark silicon made useful

## Dark silicon?

In current tech, you can no longer use 100% of the transistors 100% of the time without destroying your chip.

“Dark silicon” is the percentage that must be off at a given time



(picture from a 2013 HiPEAC keynote by Doug Burger)

### One way out the dark silicon apocalypse (M.B. Taylor, 2012)

Hardware implementations of rare (but useful) operations:

- when used, dramatically reduce the energy per operation (compared to a software implementation that would take many more cycles)
- when unused, serve as radiator for the used parts

# Should a processor include elementary functions? (1)

Dura Amdahl lex, sed lex

SPICE Model-Evaluation, cut from Kapre and DeHon (FPL 2009)

**Table 2.** Verilog-AMS Compiler Output

Models	Instruction Distribution					
	Add	Mult.	Div.	Sqrt.	Exp.	Log
bjt	22	30	17	0	2	0
diode	7	5	4	0	1	2
hbt	112	57	51	0	23	18
jfet	13	31	2	0	2	0
mos1	24	36	7	1	0	0
vbic	36	43	18	1	10	4

Current performance of exp or log is 10 to 100 cycles,  
to compare with 1 to 5 cycles for add and mult.

## Should a processor include elementary functions? (2)

Answer in 1976 is **YES** (Paul&Wilson)

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Answer in 1976 is **YES** (Paul&Wilson)

... and the initial x87 floating-point coprocessor was designed with a basic set of elementary functions

- implemented in microcode
- with some hardware assistance, in particular the 80-bit extended format.

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### Table-based algorithms

- Moore's Law means cheap memory
- Fast algorithms thanks to huge (tens of Kbytes!)  
**tables of pre-computed values**
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None of the RISC processors designed in this period  
even considers elementary functions support

## Should a processor include elementary functions? (4)

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Answer in 2019 is... **maybe?**

- A few low-precision hardware functions in NVidia GPUs  
(Oberman & Siu 2005)
- The SpiNNaker-2 chip includes hardware exp and log  
(Mikaitis et al. 2018)
- Intel AVX-512 includes all sort of fancy floating-point instructions to speed up elementary function evaluation (Anderson et al. 2018)

## I won't answer the other questions here

... because we are working on them

- ✓ *Should a processor include a divider and square root?*
- ✓ *Should a processor include elementary functions (exp, log sine/cosine)*
- *Should a processor include decimal hardware?*
- ...

At this point of the talk...

... everybody is wondering when I start talking about FPGAs.

## One nice thing with FPGAs

... is that there is an easy answer to all these questions

- ✓ *divider? square root?* Yes iff your application needs it
- ✓ *elementary functions?* Yes iff your application needs it
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- ✓ *multiplier by  $\log(2)$ ? By  $\sin \frac{17\pi}{256}$ ?* Yes iff your application needs it
  - there probably never will be an instruction “multiply by  $\log(2)$ ” in a general purpose processor.
- ...

In FPGAs, useful means: useful to **one** application.



# In an FPGA, you pay only for what you need

If your application is to simulate jfet,

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... you want to build a floating-point unit with 13 adds, 31 mults, 2 divs, 2 exps, **and nothing more.**

## Conclusion so far: FPGA arithmetic is ...

... all sorts of operators that just wouldn't make sense in a processor.

### 4 recipes to exploit the flexibility of FPGAs

- operator parameterization
- operator specialization
- operator fusion
- tabulation of precomputed values

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(I hesitated to add a fifth: fancy number systems)

# Operator parameterization

Anti-introduction: the arithmetic you want in a processor

Operator parameterization

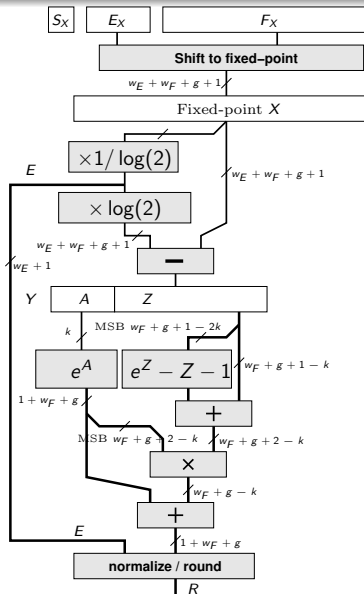
Operator specialization

Operator fusion

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Conclusion: the FloPoCo project

# Example: an architecture for floating-point exponential



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Fortunately, we have constraints:

- Computing just right:  
a high-level constraint of **overall accuracy** (to be defined).



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  - dimensions of DSP and RAM blocks
  - LUT cluster size,
  - ...

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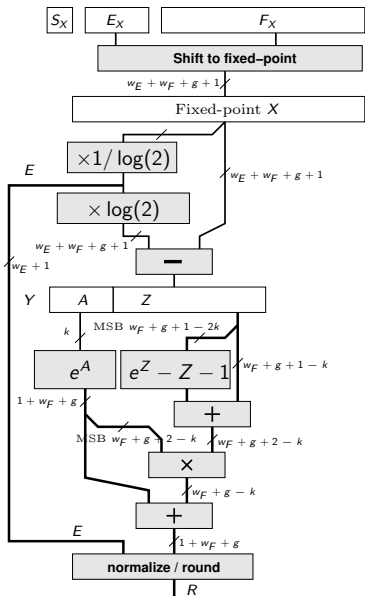
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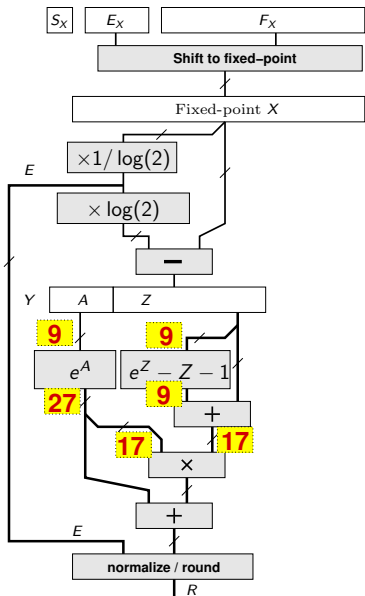
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... to guide you when navigating the implementation space

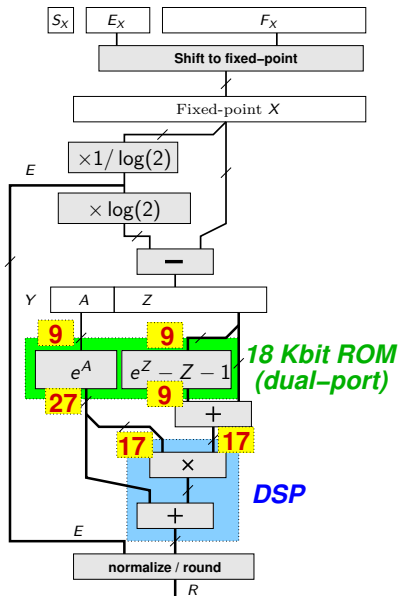
# Example: single precision exponential



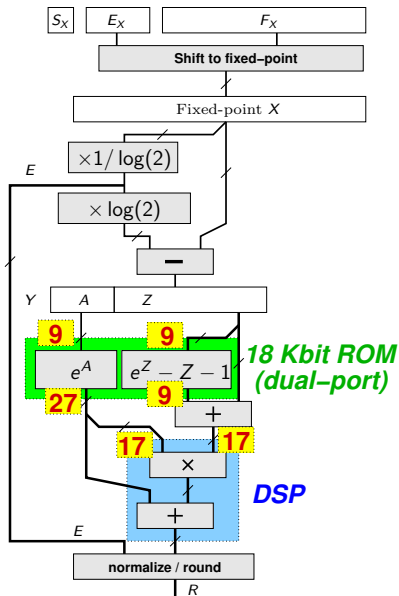
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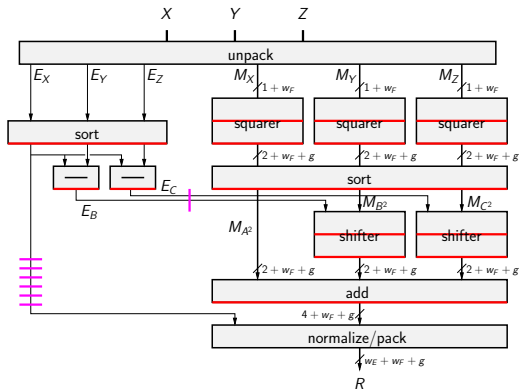
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## Xilinx resources

- 1 BlockRAM,
- 1 DSP,
- and <400 slices

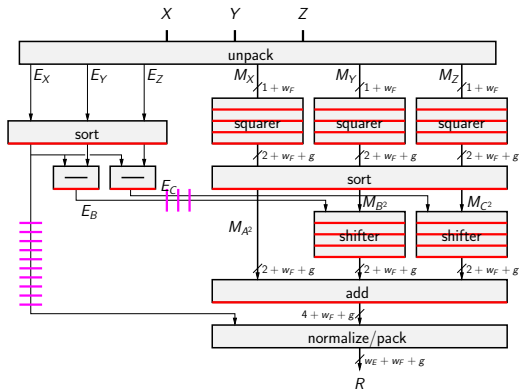
# Adapting to the performance context



## One operator does not fit all

- Low frequency, low resource consumption

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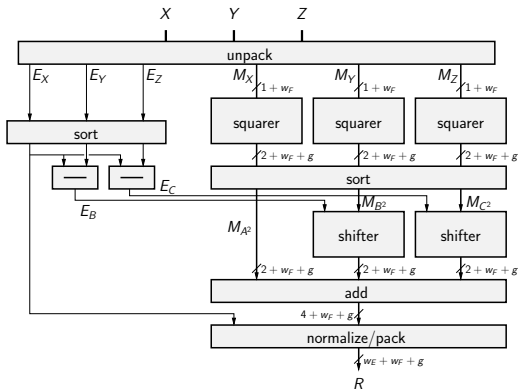


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# Adapting to the performance context



## One operator does not fit all

- Low frequency, low resource consumption
- Faster but larger (more registers)
- Combinatorial

# Frequency-directed pipelining

The good interface to pipeline construction

“Please pipeline this operator to work at 200MHz”

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Better because *compositional*

When you assemble components working at frequency  $f$ , you obtain a component working at frequency  $f$ .

## Conclusion about operator parameterization

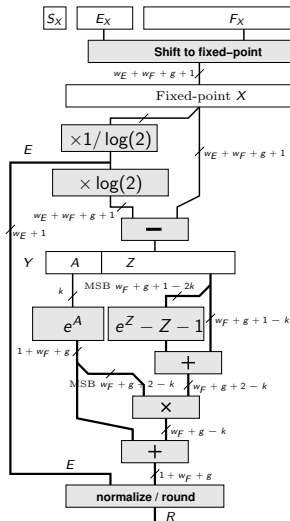
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  - ... context-specific implicit knowledge

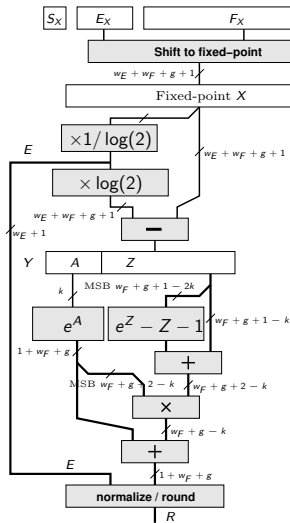
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- Parameterization is useful
  - at the application level,
  - but also when designing compound components.
- Fancy situations will occur
  - example: the multiplier by  $\log(2)$ :
    - ▶ small input (12 bits for FP64)
    - ▶ large output (69 bits for FP64)





# Operator specialization

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## Specializing an operator to its context

First idea: design a specific architecture when one input is constant

- **multiplier by a constant**

more efficient than inputting the constant to a standard multiplier

$$\begin{array}{r} \text{xxxxx} \\ \times \quad 11001 \\ \hline \text{xxxxx} \\ 00000 \\ 00000 \\ \text{xxxxx} \\ \text{xxxxx} \\ \hline \cdot \text{yyyyyyyyyy} \end{array} \quad \longrightarrow \quad \begin{array}{r} \text{xxxxx} \\ \times \quad 11001 \\ \hline \text{xxxxx} \\ \text{xxxxx} \\ \text{xxxxx} \\ \hline \cdot \text{yyyyyyyyyy} \end{array}$$

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- and even more efficient than multiplying by 1/3
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- (technique shown later)
- Here, we use a completely different algorithm
- (addition of a constant doesn't save much on an FPGA in general)

# Specializing an operator to its context

Second idea: shared inputs

- **squarer** more efficient than multiplier
  - each digit-by digit product is computed twice in a squarer

$$\begin{array}{r} \phantom{\times} 2321 \\ \times 2321 \\ \hline \phantom{\times} 2321 \\ \phantom{\times} 4642 \\ \phantom{\times} 6963 \\ \phantom{\times} 4642 \\ \hline 5387041 \end{array} \quad \rightarrow \quad \begin{array}{r} \phantom{\times} 2321 \\ \times 2321 \\ \hline \phantom{\times} 2321 \\ \phantom{\times} 464 \\ \phantom{\times} 69 \\ \phantom{\times} 4 \\ \hline 5387041 \end{array}$$

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- Same idea works for  $x^3$ , etc
- ...

# More subtle operator specialization (1)

- **truncated multiplier** in fixed point

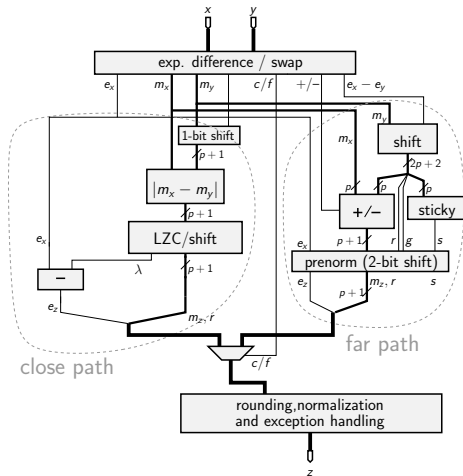
	$\begin{array}{r} .10101 \\ \times .11001 \\ \hline 10101 \\ 00000 \\ 00000 \\ 10101 \\ 10101 \\ \hline .0100001101 \\ \text{rounded to } .01000 \end{array}$	$\rightarrow$	$\begin{array}{r} .10101 \\ \times .11001 \\ \hline 10101 \\ 00000 \\ 00000 \\ 10101 \\ 101011 \\ \hline .0100001 \\ \text{rounded to } .01000 \end{array}$
--	---	---------------	---

- same accuracy with truncated(n+1) as with standard(n)
- almost half the cost



## More subtle operator specialization (2)

- **Floating-point addition of two numbers of the same sign**
  - This happens in sum of squares, etc – or when physics tells you!
  - one leading-zero counter and one shifter can be saved:



## More subtle operator specialization (3)

- **Fixed-point large accumulator** of floating-point values
  - ... when the physics tells you so
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- ...

## Conclusion on operator specialization

Look at your equations,  
they are full of operations waiting to be specialized

# Operator fusion

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Conclusion: the FloPoCo project

$\frac{x}{\sqrt{x^2 + y^2}}$  really more complex than  $x/y$  ?

- From the hardware point of view: same black box
- From the mathematical point of view: both are algebraic functions

## A simpler example: floating-point sum of squares

$$x^2 + y^2 + z^2$$

(not a toy example but a useful building block)



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- $x^2$ ,  $y^2$ , and  $z^2$  are positive:
  - one half of your FP adder is useless
- Accuracy can be improved:
  - 5 rounding errors in the floating-point version
  - $(x^2 + y^2) + z^2$  : asymmetrical

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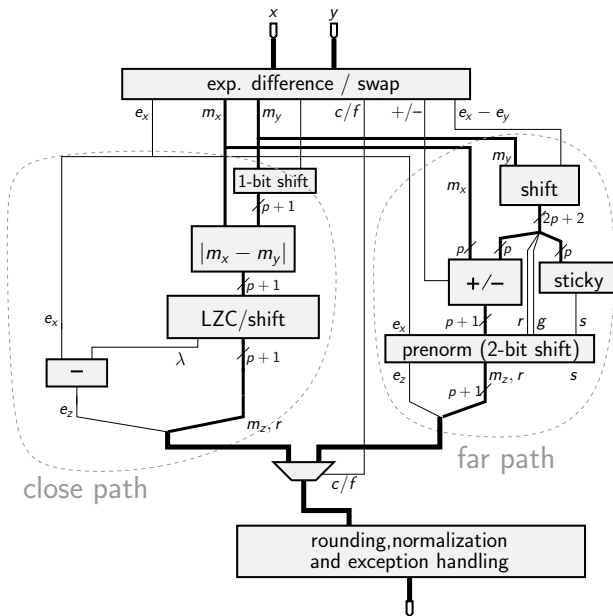
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  - half the hardware required
- $x^2$ ,  $y^2$ , and  $z^2$  are positive:
  - one half of your FP adder is useless
- Accuracy can be improved:
  - 5 rounding errors in the floating-point version
  - $(x^2 + y^2) + z^2$  : asymmetrical

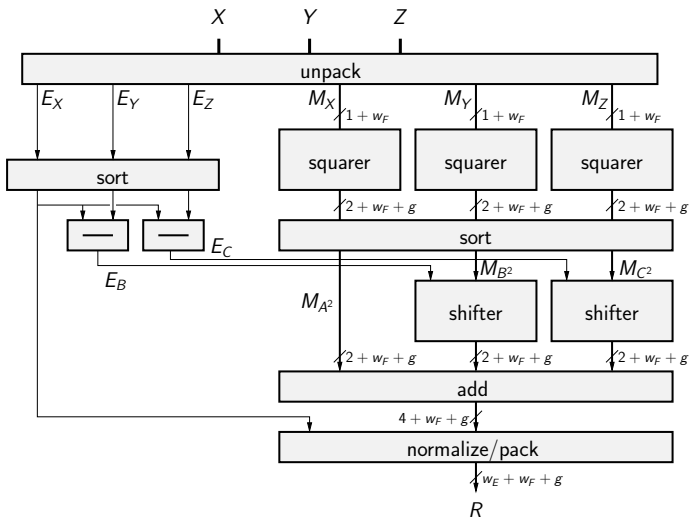
### Operator fusion

- provide the floating-point interface
- optimize a fixed-point architecture
- ensure a clear accuracy specification

# A floating-point adder



# A floating-point sum-of-product architecture



# Savings

A few (old) results for floating-point sum-of-squares on Virtex4:  
(*classic*: assembly of classical FP adders and multipliers,  
*custom*: the architecture on previous slide)

Simple Precision	area	performance
LogiCore classic	1282 slices, 20 DSP	43 cycles @ 353 MHz
FloPoCo classic	1188 slices, 12 DSP	29 cycles @ 289 MHz
FloPoCo custom	453 slices, 9 DSP	11 cycles @ 368 MHz

Double Precision	area	performance
FloPoCo classic	4480 slices, 27 DSP	46 cycles @ 276 MHz
FloPoCo custom	1845 slices, 18 DSP	16 cycles @ 362 MHz

- all performance metrics improved, FLOP/s/area more than doubled
- Plus: custom operator more accurate, and symmetrical

## Second fusion example: the floating-point exponential

Everybody knows FPGAs are bad at floating-point

- Versus the highly optimized FPU in a processor,
- basic operations ( $+$ ,  $-$ ,  $\times$ ) are **10x slower** in an FPGA

**This is the unavoidable overhead of programmability.**



## Second fusion example: the floating-point exponential

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**This is the unavoidable overhead of programmability.**

If you lose according to a metric, change the metric.

Peak figures for double-precision floating-point exponential

- Software in a PC: 20 cycles / DPExp @ 4GHz: **200 MDPExp/s**
- FPExp in FPGA: 1 DPExp/cycle @ 400MHz: **400 MDPExp/s**
- Chip vs chip: 6 Pentium cores vs 150 FPExp/FPGA
- Power consumption also better
- Single precision data even better

(Intel MKL vector libm, vs FPExp in FloPoCo version 2.0.0)

# Not all FLOPS are equal

## SPICE Model-Evaluation, cut from Kapre and DeHon (FPL 2009)

**Table 2.** Verilog-AMS Compiler Output

Models	Instruction Distribution					
	Add	Mult.	Div.	Sqrt.	Exp.	Log
bjt	22	30	17	0	2	0
diode	7	5	4	0	1	2
hbt	112	57	51	0	23	18
jfet	13	31	2	0	2	0
mos1	24	36	7	1	0	0
vbic	36	43	18	1	10	4

# Tabulation of pre-computed values

Anti-introduction: the arithmetic you want in a processor

Operator parameterization

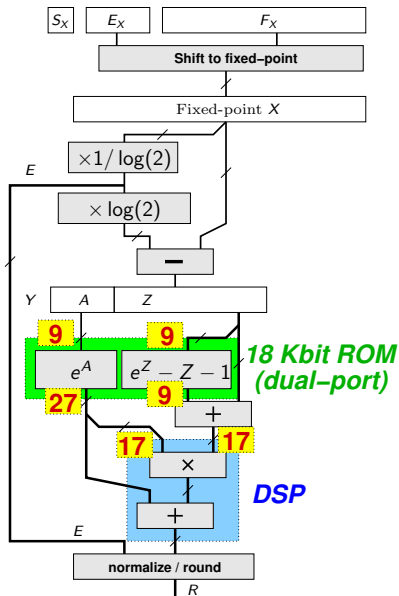
Operator specialization

Operator fusion

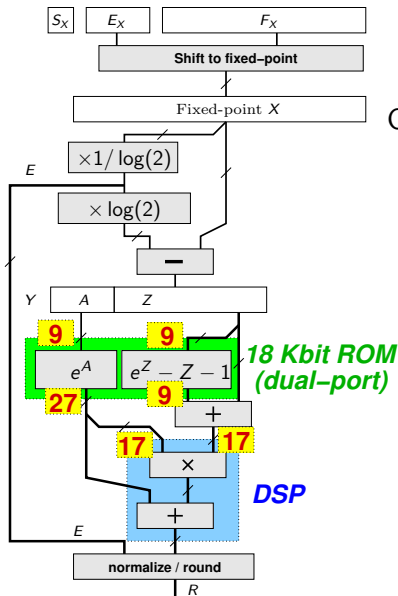
Tabulation of pre-computed values

Conclusion: the FloPoCo project

# We have seen it already



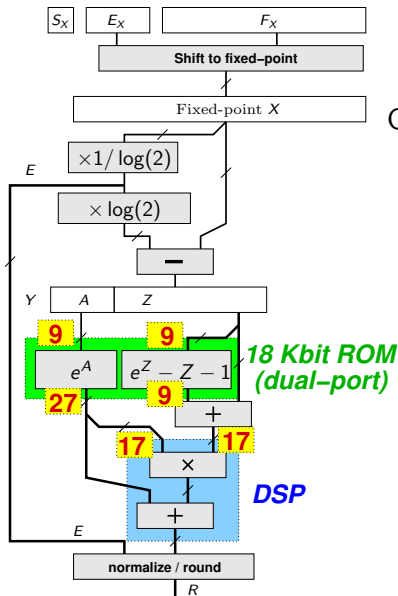
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Other examples:

- The KCM constant multiplication technique

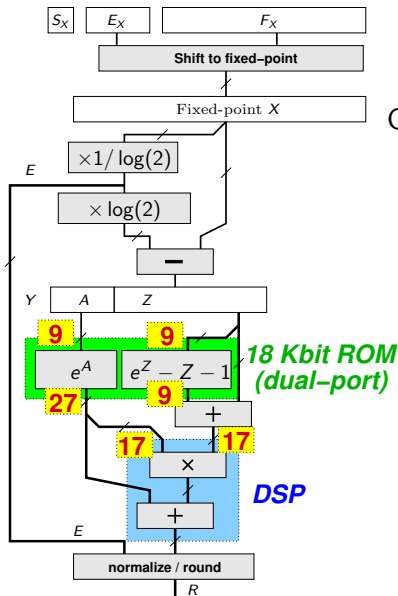
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Other examples:

- The KCM constant multiplication technique
- The state of the art division by 3

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Other examples:

- The KCM constant multiplication technique
- The state of the art division by 3
- Computing  $A \times B \bmod N$  as

$$\frac{1}{4}((A+B)^2 - (A-B)^2) \bmod N$$

where  $X^2 \bmod N$  is tabulated

- ...

# Conclusion: the FloPoCo project

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Operator specialization

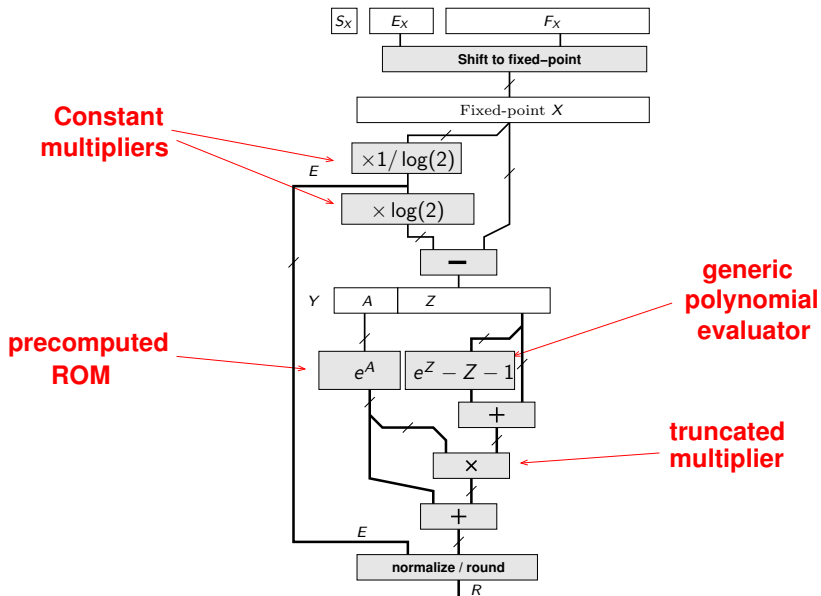
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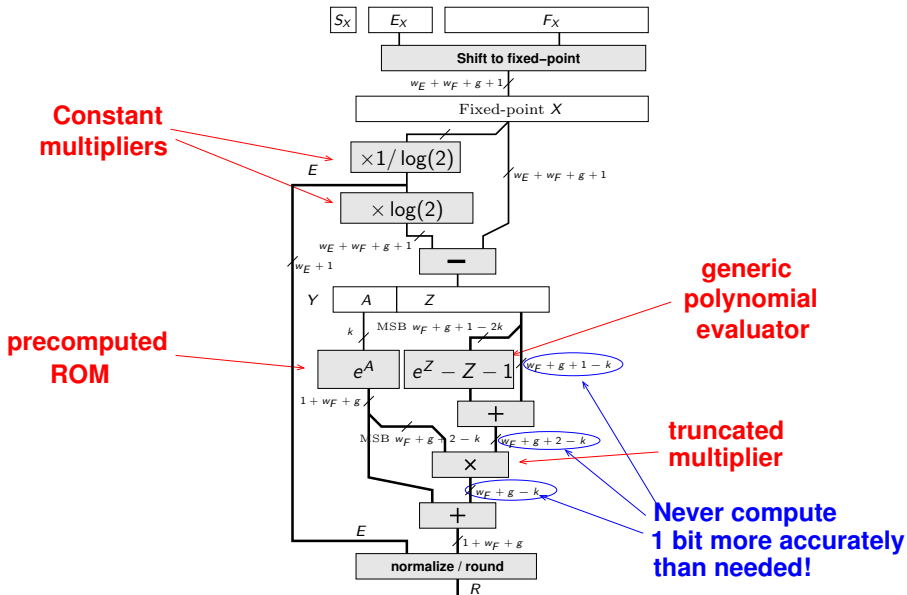
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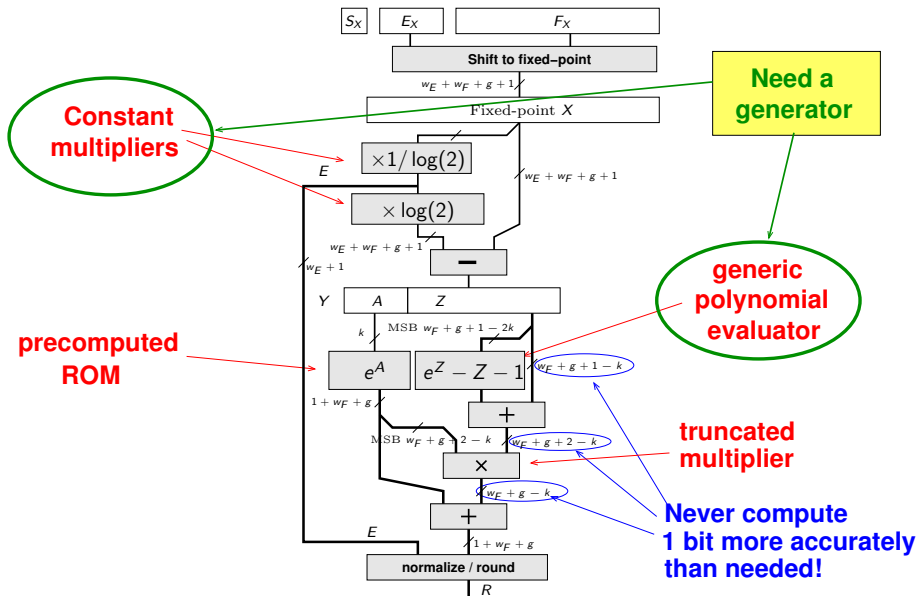
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Hey, but I am a physicist !

... I don't want to design all these fancy operators !

## Hey, but I am a physicist !

... I don't want to design all these fancy operators !

You don't have to, it is my job

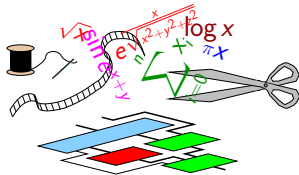
And it is a very comfortable niche

- An infinite list of operators to keep me busy until retirement
- small arithmetic objects, relatively technology-independent

# The FloPoCo project

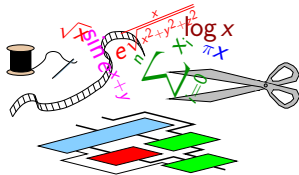
<http://flopoco.gforge.inria.fr/>

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  - written in C++, outputting VHDL
  - open and extensible



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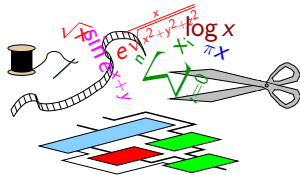
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- A generator framework
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  - open and extensible
- Goal: provide all the application-specific arithmetic operators you want (even if you don't know yet that you want them)
  - open-ended list, about 50 in the stable version, and a few others in "obscure branches"
  - integer, fixed-point, floating-point, logarithm number system
  - all operators fully parameterized
  - flexible pipeline for all operators

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  - integer, fixed-point, floating-point, logarithm number system
  - all operators fully parameterized
  - flexible pipeline for all operators
- Approach: **computing just right**
  - Interface: never output bits that are not numerically meaningful
  - Inside: never compute bits that are not useful to the final result



# Where do we stop?

## My own personal definition of an arithmetic operator

- An arithmetic **operation** is a *function* (in the mathematical sense)
  - few well-typed inputs and outputs
  - no memory or side effect
    - ▶ (even *filters* are defined by a transfer function)

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## An operator, as a *circuit*...

... is a direct acyclic graph (DAG):

- easy to build and pipeline
- easy to test against its mathematical specification

## One small problem

FloPoCo can generate an infinite number of operators, I don't want to test them all...

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FloPoCo can generate an infinite number of operators, I don't want to test them all...

### Solution

Each operator comes with its testbench generator

- expected outputs built from the mathematical specification,
- **not** by emulating the operator architecture!

## Here should come a demo

- Command line syntax: a sequence of **operator specifications**
- Options: target frequency, target hardware, ...
- Output: synthesizable VHDL.

FloPoCo is open-source and freely available from

<http://flopoco.gforge.inria.fr/>