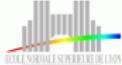


# Optimized Hardware Arithmetic Operators

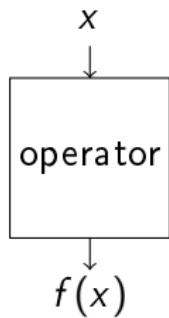
Romain Michard  
Arénaire group

June 25<sup>th</sup> 2008



# Context

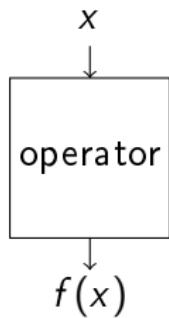
- Arithmetic operators



- Operations  
 $+, -, \times, \div, \sqrt{\phantom{x}}, \sin, \exp, \log, \dots$
- Algorithms  
polynomial approximations, table-based methods, shift-and-add, ...
- Number representations  
Redundancy, point position, accuracy

# Context

- Arithmetic operators



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- Arithmetic operators



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 $+, -, \times, \div, \sqrt{\phantom{x}}, \sin, \exp, \log, \dots$
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Redundancy, point position, accuracy

- Hardware or Software implementation

- Optimization

- Speed
- Circuit area
- Power consumption

# Works

- Shift-and-add algorithms
    - Divgen and the division
    - E-method
  - Function evaluation
    - Small operators
    - Generation of optimized evaluation operators
- |                              |  |
|------------------------------|--|
| SPIE 2005                    |  |
| SympA 2005                   |  |
| FTFC 2005                    |  |
| ASAP 2005 (Best Paper Award) |  |
| SPIE 2006                    |  |
| SiPS 2006                    |  |
| SympA 2006                   |  |
| TSI 2008                     |  |

# Works

## In this talk

- Shift-and-add algorithms

Divgen and the division  
E-method

SPIE 2005

SympA 2005

FTFC 2005

- Function evaluation

Small operators

ASAP 2005 (Best Paper Award)

SPIE 2006

SiPS 2006

SympA 2006

TSI 2008

Generation of optimized  
evaluation operators

# Shift-and-Add Algorithms

## Description

Algorithms producing one result digit per iteration.  
Most significant digit first

The same computation at each iteration:

- A current state (partial remainder)
- Choosing a new result digit (selection function)
- Calculating a new state (addition(s))

## Example

The paper-and-pencil division

$$\begin{array}{r} 192 \\ \times 17 \\ \hline 1344 \end{array}$$

## Example

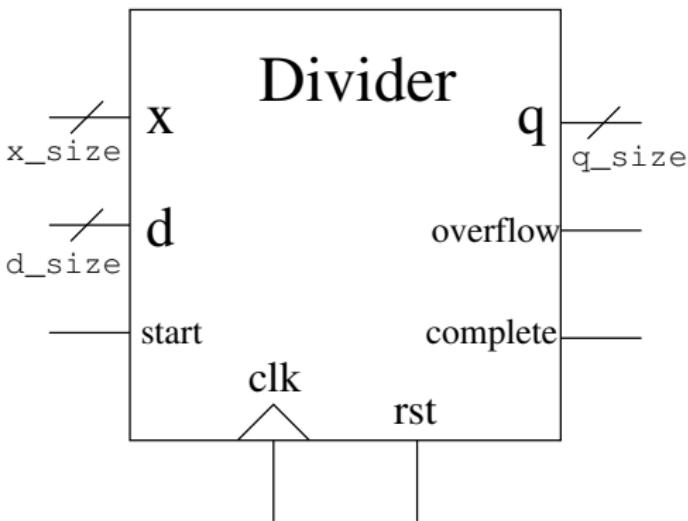
## The paper-and-pencil division

$$\begin{array}{r} 192 \\ \underline{- 17} \\ 22 \\ \underline{- 17} \\ 5 \end{array} \quad \left| \begin{array}{r} 17 \\ \underline{11} \end{array} \right.$$

# Divgen

## Hardware Divider Generator

$$x = d \times q + rem$$



## Divgen

```
1 x_representation unsigned
2 d_representation unsigned
3 q_representation unsigned
4 x_size 9
5 d_size 6
6 q_size 7
7 algorithm SRT
8 q_radix 4
9 q_max_digit 3
10 partial_remainder_representation 2s_complement
11 step_adder RCA
12 #guard_bits 0
13 SRT_table_folding no
14 gray_encoding no
15 SRT_table_fig n&b
```

Divgen configuration file example.

- A C++ program (more than 5000 lines) under GPL license
- A divider hardware operator description generator
- From a simple specification to a VHDL optimized and synthesizable description

## Supported algorithms:

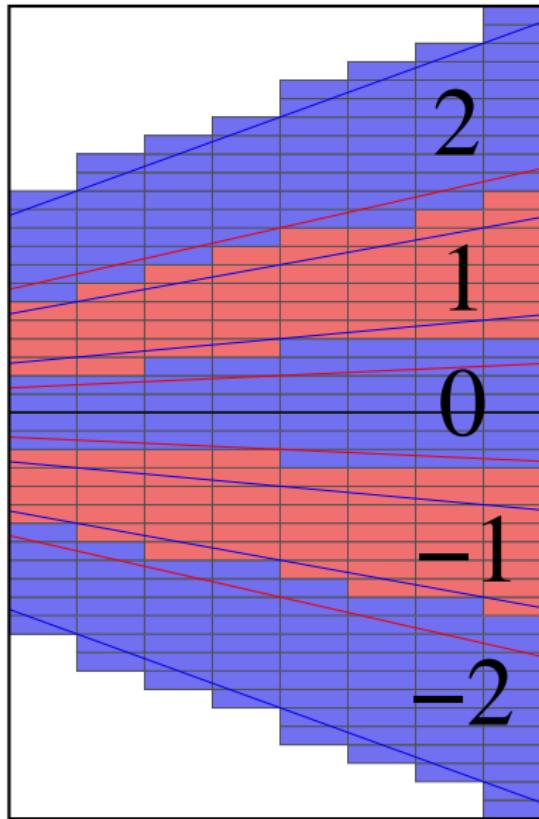
- Restoring
- Nonrestoring
- SRT (a lot of options and parameters)

## Validation of the operators

- Selection table verification
- Intermediate widths

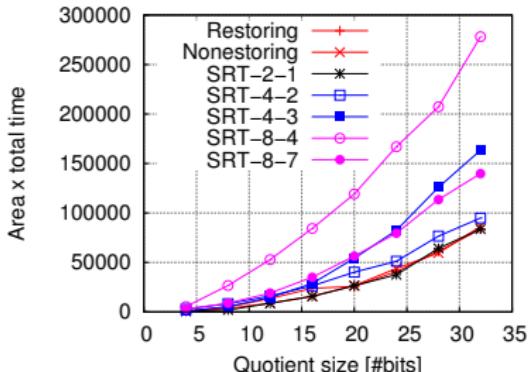
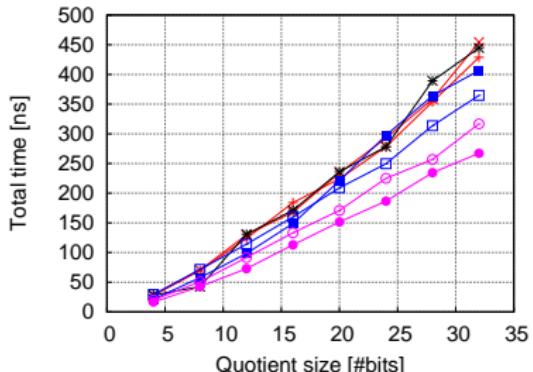
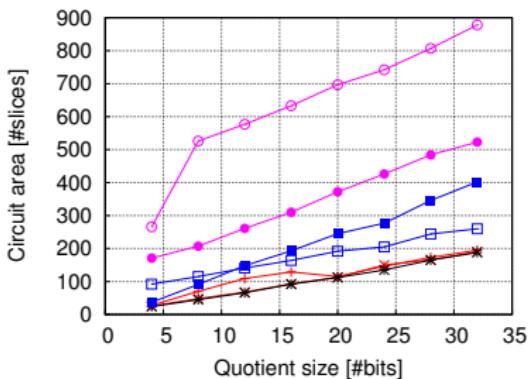
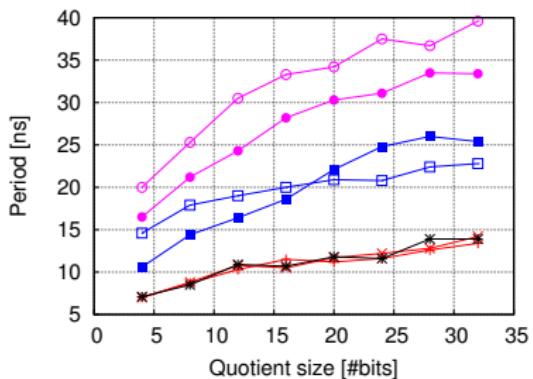
Divgen

Selection table  
example



Divgen

# Some comparisons



**E-method**

# E-Method

by M.D. Ercegovac in the 70's

## E-method

Goal: evaluating rational fractions (polynomials) using a shift-and-add algorithm

$$\left( \begin{array}{ccccccc} 1 & -x & 0 & & \cdots & & 0 \\ q_1 & 1 & -x & 0 & & \cdots & 0 \\ q_2 & 0 & 1 & -x & 0 & & \cdots & 0 \\ \ddots & \ddots & \ddots & \ddots & \ddots & & \vdots & \\ & \ddots & \ddots & \ddots & \ddots & & 0 & \\ \vdots & \vdots & & \ddots & \ddots & \ddots & 0 & \\ q_n & 0 & & \cdots & & & 1 & -x \\ & & & & & & 0 & 1 \end{array} \right) \left( \begin{array}{c} y_0 \\ y_1 \\ y_2 \\ \vdots \\ \vdots \\ y_{n-1} \\ y_n \end{array} \right) = \left( \begin{array}{c} p_0 \\ p_1 \\ p_2 \\ \vdots \\ \vdots \\ p_{n-1} \\ p_n \end{array} \right)$$

$$y_0 = \frac{P(x)}{Q(x)} = \frac{\sum_{i=0}^n p_i \cdot x^i}{1 + \sum_{i=1}^n q_i \cdot x^i} \simeq f(x)$$

## E-method

## High Radix

Line  $i$  at iteration  $j$ :

$$w_i[j] = \beta \times (w_i[j-1] - d_0[j-1] \cdot q_i - d_i[j-1] + d_{i+1}[j-1] \cdot x)$$
$$d_i[j] = Sel(w_i[j])$$

## E-method

## High Radix

Line  $i$  at iteration  $j$ :

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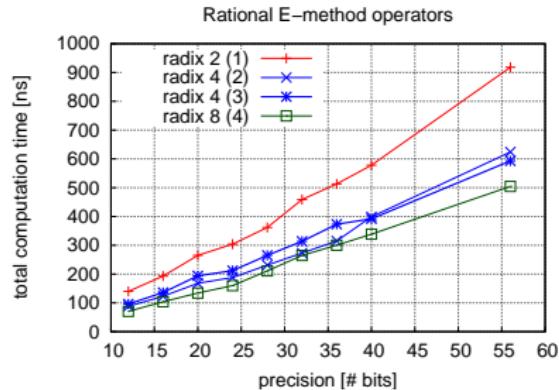
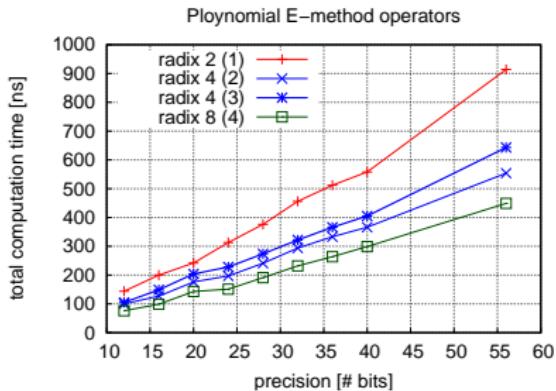
If  $\beta$  is high then there is less iterations but choosing  $d_i$  is more difficult.

Computing the E-method with a high radix is interesting anyway.

## E-method

## High Radix

## Results



High radices give better total computation times.

## E-method

## Activity Reduction

$$w_i[j] = \beta \times (w_i[j-1] - d_0[j-1] \cdot q_i - d_i[j-1] + d_{i+1}[j-1] \cdot x)$$

We have to choose a digit ( $d_i$ ).

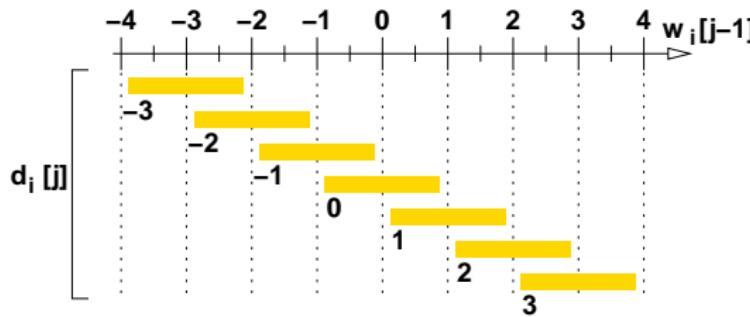
## E-method

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$$w_i[j] = \beta \times (w_i[j-1] - d_0[j-1] \cdot q_i - d_i[j-1] + d_{i+1}[j-1] \cdot x)$$

We have to choose a digit ( $d_i$ ).

When using a redundant representation it is possible to choose several values.



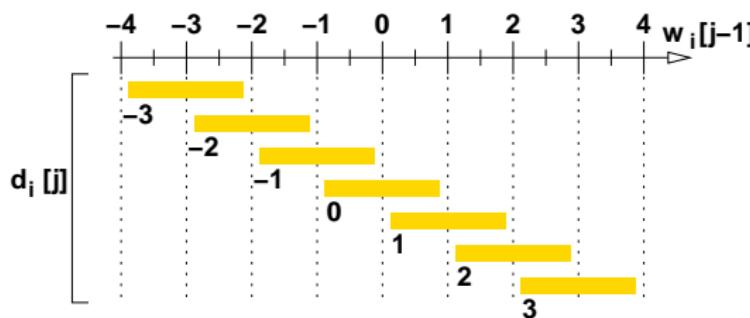
## E-method

## Activity Reduction

$$w_i[j] = \beta \times (w_i[j-1] - d_0[j-1] \cdot q_i - d_i[j-1] + d_{i+1}[j-1] \cdot x)$$

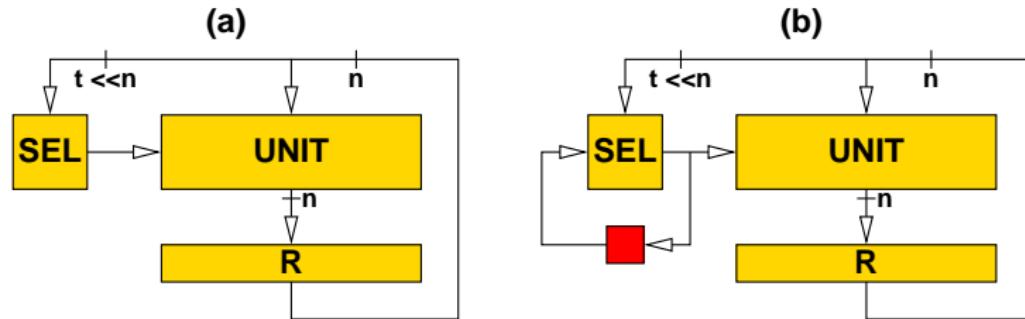
We have to choose a digit ( $d_i$ ).

When using a redundant representation it is possible to choose several values.



Trying to choose the precedent value when possible  
 → Modifying the selection tables

## E-method



Selection function architecture

$$w_i[j] = \beta \times (w_i[j-1] - d_0[j-1] \cdot q_i - d_i[j-1] + d_{i+1}[j-1] \cdot x)$$

## E-method

ooooooooooooooo●

oooooo

Functional bit-level simulations with Maple (degree 4, 16 bits)

		$d_i[j - 1]$						
		-3	-2	-1	0	1	2	3
$d_i[j]$	-3	0.00	0.00	0.00	0.00	0.00	0.00	0.00
	-2	0.01	0.02	0.01	0.02	0.03	0.03	0.01
	-1	0.00	0.01	0.10	0.34	0.25	0.02	0.00
	0	0.00	0.01	0.02	2.60	0.45	0.01	0.00
	1	0.03	0.02	0.26	0.58	0.25	0.00	0.01
	2	0.00	0.01	0.04	0.04	0.02	0.00	0.00
	3	0.00	0.01	0.00	0.00	0.00	0.01	0.00
$d_i[j]$	-3	0.00	0.00	0.00	0.02	0.01	0.00	0.00
	-2	0.00	0.01	0.00	0.01	0.07	0.00	0.00
	-1	0.00	0.00	0.02	0.03	0.02	0.02	0.02
	0	0.02	0.00	0.02	3.00	0.31	0.01	0.07
	1	0.00	0.00	0.00	0.53	0.49	0.01	0.03
	2	0.00	0.00	0.03	0.17	0.03	0.14	0.01
	3	0.00	0.00	0.02	0.08	0.01	0.02	0.01

$$\Sigma_{OD} = 2.25$$

$$\Sigma_{OD} = 1.56$$

-30%

# Function Evaluation

## Introduction

- Many applications: computer science, image processing, signal processing, ...
- Different ways: table-based methods, polynomial approximations
- Different points of view: max error, average error

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- Different ways: table-based methods, polynomial approximations
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Operators for signal processing and multimedia

⇒ Polynomial approximations

## Polynomial Approximations

$$f(x) \simeq p_n \cdot x^n + \dots + p_2 \cdot x^2 + p_1 \cdot x + p_0$$

Multiplications are expensive.

Low-degree polynomials

How to do with few multiplications?

## Polynomial Approximations

Partial products array (PPA) for a 5-bit numbers multiplication:

	$x_4$	$x_3$	$x_2$	$x_1$	$x_0$
$\times$	$y_4$	$y_3$	$y_2$	$y_1$	$y_0$
	$x_4y_0$	$x_3y_0$	$x_2y_0$	$x_1y_0$	$x_0y_0$
	$x_4y_1$	$x_3y_1$	$x_2y_1$	$x_1y_1$	$x_0y_1$
	$x_4y_2$	$x_3y_2$	$x_2y_2$	$x_1y_2$	$x_0y_2$
	$x_4y_3$	$x_3y_3$	$x_2y_3$	$x_1y_3$	$x_0y_3$
	$x_4y_4$	$x_3y_4$	$x_2y_4$	$x_1y_4$	$x_0y_4$

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		$x_4y_0$	$x_3y_0$	$x_2y_0$	$x_1y_0$	$x_0y_0$
	<del><math>x_4y_1</math></del>	<del><math>x_3y_1</math></del>	<del><math>x_2y_1</math></del>	<del><math>x_1y_1</math></del>	<del><math>x_0y_1</math></del>	
	$x_4y_2$	$x_3y_2$	$x_2y_2$	$x_1y_2$	$x_0y_2$	
	<del><math>x_4y_3</math></del>	<del><math>x_3y_3</math></del>	<del><math>x_2y_3</math></del>	<del><math>x_1y_3</math></del>	<del><math>x_0y_3</math></del>	
$x_4y_4$	$x_3y_4$	$x_2y_4$	$x_1y_4$	$x_0y_4$		

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	$x_4y_2$	$x_3y_2$	$x_2y_2$	$x_1y_2$	$x_0y_2$	
	<del><math>x_4y_3</math></del>	<del><math>x_3y_3</math></del>	<del><math>x_2y_3</math></del>	<del><math>x_1y_3</math></del>	<del><math>x_0y_3</math></del>	
$x_4y_4$	$x_3y_4$	$x_2y_4$	$x_1y_4$	$x_0y_4$		

$\Rightarrow y_i$  are the polynomial coefficients bits  
 $\Rightarrow$  coefficients with few nonzero digits

## Polynomial Approximations

Constraint:  $p_i$  have no more than 3 nonzero digits.

Problem: the minimax algorithm doesn't work anymore.

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- Approximated powers
- Fine tuning of the coefficients

## Polynomial Approximations

## Results

## Example

sine function on  $[0, \pi/4[$ , 8-bit degree-2 approximation

## Polynomial Approximations

## Results

## Example

sine function on  $[0, \pi/4[$ , 8-bit degree-2 approximation

- Minimax

$$p_{th}(x) = -0.0023098047 + 1.0540785973 \cdot x - 0.1882871881 \cdot x^2$$

Error	Cost
$\epsilon_{th} = 0.23 \times 10^{-2}$	$3 \times, 2 \pm$

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Error	Cost
$\epsilon_{th} = 0.23 \times 10^{-2}$	$3\times, 2\pm$

- Constraints on the coefficients

$$p(x) = -(0.000000001)_2 + (1.000100\bar{1})_2 \cdot x - (0.0011000001)_2 \cdot x^2$$

Avg err.	Max err.	Cost
$0.16 \times 10^{-2}$	$0.43 \times 10^{-2}$	$1\times, 2\pm$

## Polynomial Approximations

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$0.16 \times 10^{-2}$	$0.43 \times 10^{-2}$	$1 \times, 2 \pm$

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$0.69 \times 10^{-2}$	$0.23 \times 10^{-1}$	$7 \pm$

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- Powers approximation

Avg err.	Max err.	Cost
$0.69 \times 10^{-2}$	$0.23 \times 10^{-1}$	$7 \pm$

- Fine tuning

Avg err.	Max err.	Cost
$0.41 \times 10^{-2}$	$0.18 \times 10^{-1}$	$6 \pm$

## Polynomial Approximations

## Synthesis results

Synthesis on Xilinx Virtex-E FPGAs:

Size (bits)	Multipartite		SMSO		Our method	
	Area	Period	Area	Period	Area	Period
8	19	16.6	21	8	27	14.9
12	76	18.0	63	14	50	20.5
16	280	24.8	123	19	71	23.5

Comparison with Multipartite and SMSO methods for  $\sin(x)$  on  $[0, \pi/4[$ .

# Conclusion and Future Prospects

- Conclusion

- Additions to Divgen: new algorithms, other shift-and-add operators,...
- Power consumption estimation for the E-method
- Function evaluation: new method to be included in the generators

# Conclusion and Future Prospects

- Conclusion
  - Additions to Divgen: new algorithms, other shift-and-add operators,...
  - Power consumption estimation for the E-method
  - Function evaluation: new method to be included in the generators
- Future prospects
  - Hardware architectures: optimizations (more than arithmetic only, low power,...)
  - Postdoctoral research in Ares group at INSA Lyon  
Hardware architectures for networks