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Fast and accurate floating-point division on ST231

Algorithm, implementation, and automatic generation and validation

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CNRS



Context and objectives

Context

- FLIP software library
 - → http://flip.gforge.inria.fr/
 - → support for floating-point arithmetic on integer processors
- low latency implementation of binary floating-point division
 - → targets a VLIW integer processor of the ST200 family
- no support of subnormal numbers
 - \rightarrow input/output: ± 0 , $\pm \infty$, NaN or *normal* number

Objectives

- faster software implementation (compared to FLIP 0.3)
 - → expose instruction-level parallelism via bivariate polynomial evaluation
- correctly rounded
 - → rounding-to-nearest even

IEEE 754 specification

Let (x, y) be two binary floating-point data:

$$x/y = (-1)^{s_r} \cdot |x|/|y|,$$

with $s_r = s_x \text{ XOR } s_y$.

x / y		y			
		+0	normal	$+\infty$	NaN
x	+0	qNaN	+0	+0	qNaN
	normal	$+\infty$	$RN_p(x / y)$	+0	qNaN
	$+\infty$	$+\infty$	$+\infty$	qNaN	qNaN
	NaN	qNaN	qNaN	qNaN	qNaN

Special values for $\mathsf{RN}_p(|x|/|y|)$.

 \Rightarrow since $RN_p(-r) = -RN_p(r)$, for non special inputs:

$$\mathsf{RN}_p(x/y) = (-1)^{s_r} \cdot \mathsf{RN}_p(|x|/|y|).$$

Notation and assumptions

- ▶ Input (x, y): two positive normal numbers
 - \rightarrow precision p, extremal exponents (e_{min} , e_{max})

$$x = (-1)^{s_x} \cdot m_x \cdot 2^{e_x} \quad \text{with} \quad \begin{cases} s_x \in \{0,1\} \\ m_x = 1.m_{x,1} \dots m_{x,p-1} \in [1,2) \\ e_x \in \{e_{\min}, \dots, e_{\max}\} \end{cases}$$

- ► Computation: k-bit unsigned integers
 - \rightarrow register size k
- ► Example for binary32 format: $(k, p, e_{max}) = (32, 24, 127)$

Outline of the talk

Division via polynomial evaluation

Generation of an efficient evaluation program

Validation of the generated evaluation program

Experimental results

Concluding remarks

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Division algorithm flowchart

▶ Definition

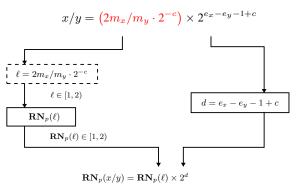
$$c = \begin{cases} 1 & \text{if } m_x \ge m_y, \\ 0 & \text{if } m_x < m_y. \end{cases}$$

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Range reduction

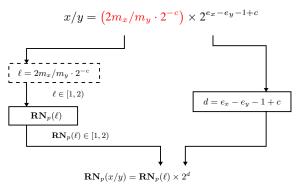


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- Iterative methods (restoring, non-restoring, ...)
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 - previous implementation of division (FLIP 0.3)
- Polynomial-based methods
 - Agarwal, Gustavson and Schmookler (1999)
 - → univariate polynomial evaluation
 - Our approach
 - → single bivariate polynomial evaluation

Truncated one-sided approximation

- See for example, Ercegovac and Lang (2004)
- 3 steps
 - 1. compute $v = (01.v_1 \dots v_{k-2})$ such that

$$-2^{-p} \le \ell - v < 0$$
 that is implied by $|(\ell + 2^{-p-1}) - v| < 2^{-p-1}$

2. truncate v after p fraction bits: $w = (01.v_1 \dots v_p 0 \dots 0)$





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How to compute the one-sided approximation v ?

1. Consider $\ell + 2^{-p-1}$ as the exact result of the function

$$F(s,t)=s/(1+t)+2^{-p-1},$$
 at the points $s^*=2^{1-c}m_x$ and $t^*=m_y-1$:
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How to ensure that
$$|(\ell + 2^{-p-1}) - v| < 2^{-p-1}$$
 ?

Sufficient error bounds

Since by triangular inequality

$$|(\ell + 2^{-p-1}) - v| \le \mu \cdot \epsilon_{\text{approx}} + \epsilon_{\text{eval}}$$

with

$$\mu = \max\{s^*\} = \max\{2^{1-c}m_x\} = (4 - 2^{3-p})$$

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One has to ensure

$$\mu \cdot \epsilon_{\text{approx}} + \epsilon_{\text{eval}} < 2^{-p-1}$$

Sufficient conditions can be obtained

$$\epsilon_{\text{approx}} < 2^{-p-1}/\mu \quad \text{and} \quad \epsilon_{\text{eval}} < 2^{-p-1} - \mu \cdot \epsilon_{\text{approx}}$$

Implementation steps

- 1. determine the minimal degree δ for the polynomial approximant a
- 2. compute the polynomial approximant a such that

$$\epsilon_{\mathsf{approx}} < 2^{-p-1}/\mu$$

3. find an efficient evaluation program \mathcal{P} such that

$$\epsilon_{\text{eval}} < 2^{-p-1} - \mu \cdot \epsilon_{\text{approx}}$$

- 4. validate the evaluation program
- ⇒ implemented using Sollya (steps 1 and 2) and Gappa (step 4)

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Automatic generation of an efficient evaluation program

- ▶ Evaluation program P = main part of the full software implementation
 - → dominates the cost
- By efficient, one means an evaluation program that
 - → reduces the evaluation latency
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Which evaluation program to evaluate the polynomial P(s,t)?

Example for the binary32 implementation: (k, p) = (32, 24)

$$P(s,t) = 2^{-p-1} + s \cdot \sum_{i=0}^{10} a_i t^i$$

- ▶ Horner's scheme: $(3+1) \times 11 = 44$ cycles
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We can do much better.

- But how to explore the solution space and choose an efficient evaluation program?
 - → interest of automatic generation

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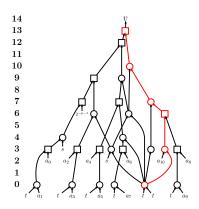
- 2. generate automatically a set of evaluation trees, with height $\leq \tau$
- \Rightarrow if no tree satisfies τ then increase τ and restart
- Number of evaluation trees = extremely large → several filters

$$P(s,t) = 2^{-p-1} + s \cdot \sum_{i=0}^{10} a_i t^i$$

- first target latency $\tau = 13$
 - → no tree found

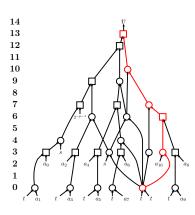
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- first target latency $\tau = 13$
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- second target latency $\tau = 14$
 - → obtained in about 10 sec.
- distribute the multiplication by s
 - → otherwise: 18 cycles
- too difficult to find such tree by hand



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- ▶ Label evaluation trees by appropriate arithmetic operator: + or −
- If the sign of an intermediate value changes when the input varies then the evaluation tree is rejected
 - ⇒ implementation with certified interval arithmetic (MPFI)

Practical scheduling checking

- Schedule the evaluation trees on a simplified model of a real target architecture
 - → operator costs, nb. issues, constraints on operators
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Practical scheduling checking

- Schedule the evaluation trees on a simplified model of a real target architecture
 - → operator costs, nb. issues, constraints on operators
 - → no syllables constraint
- Check if no increase of latency in practice compared to the latency on unbounded parallelism
 - ⇒ if practical latency > theoretical latency then the evaluation tree is rejected
 - ⇒ implementation using naive list scheduling algorithm is enough

Outline of the talk

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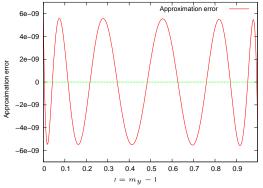
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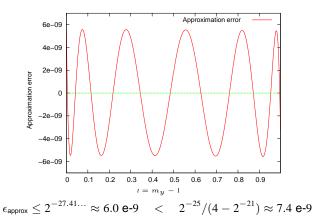
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ightharpoonup Approximation of 1/(1+t) by truncated Remez' polynomial of degree 10



$$\epsilon_{\text{approx}} \leq 2^{-27.41...} \approx 6.0 \; \text{e-9} \quad < \quad 2^{-25}/(4-2^{-21}) \approx 7.4 \; \text{e-9}$$

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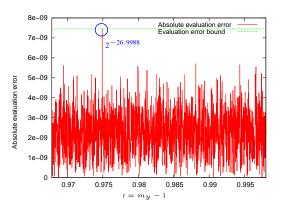


▶ Deduction of the evaluation error bound from ϵ_{approx}

$$\epsilon_{\text{eval}} < 2^{-25} - (4 - 2^{-21}) \cdot 2^{-27.41...} \approx 2^{-26.9999...} \approx 7.4 \text{ e-9}.$$

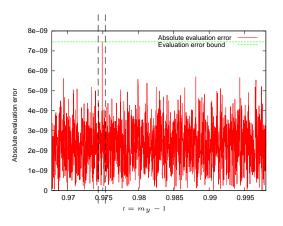
- Case 1: m_x ≥ m_y → condition satisfied
- ▶ Case 2: $m_x < m_y \rightarrow$ condition not satisfied

ie. $s^* = 3.935581684112548828125$ and $t^* = 0.97490441799163818359375$



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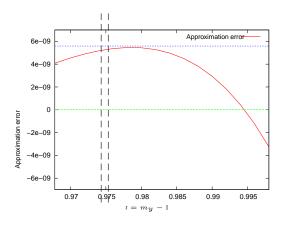
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- determine an interval *I* around this point
- 2. compute ϵ_{approx} over \mathcal{I}
- 3. determine an evaluation error bound η
- 4. check if $\epsilon_{\text{eval}} < \eta$?

Find a splitting of the input interval into n subinterval(s) $\mathcal{T}^{(i)}$, and check that

$$\mu \cdot \epsilon_{\text{approx}}^{(i)} + \epsilon_{\text{eval}}^{(i)} < 2^{-p-1}$$

on each subinterval.

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- Implementation of the splitting by dichotomy
 - ▶ for each T(i)
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 - \Rightarrow if this bound is not satisfied, $\mathcal{T}^{(i)}$ is split up into 2 subintervals
 - ▶ implemented using Sollya (steps 1 and 2) and Gappa (step 3)
- ▶ Example of binary32 implementation
 - → launched on a 64 processor grid
 - \rightarrow 36127 subintervals found in several hours (\approx 5h.)

* Does the condition

$$\mu \cdot \epsilon_{\text{approx}}^{(i)} + \epsilon_{\text{eval}}^{(i)} < 2^{-p-1}$$

hold for $i \in \{1, \ldots, n\}$?

Depth	Subintervals	$\epsilon_{approx}^{(\cdot)}(a) \leq$	$\epsilon_{eval}^{(\cdot)}(\mathcal{P}) <$	*
1	$I_{1,1} = [2^{-23}, 1 - 2^{-23}]$	$\theta_1 \approx 2^{-27.41}$	$\eta_1 \approx 2^{-26.99}$	no
2	$I_{2,1} = [2^{-23}, 0.5 - 2^{-23}]$ $I_{2,2} = [0.5, 1 - 2^{-23}]$	$\theta_2 \approx 2^{-27.41}$ $\theta_1 \approx 2^{-27.41}$	$ \eta_2 \approx 2^{-26.99} $ $ \eta_1 \approx 2^{-26.99} $	yes no
j	$\begin{aligned} &\mathbf{l}_{j,1} = [2^{-23}, 0.5 - 2^{-23}] \\ &\mathbf{l}_{j,2} = [0.5, 0.75 - 2^{-23}] \\ &\mathbf{l}_{j,19309} = [0.921875, 0.92578113079071044921875] \\ &\mathbf{l}_{j,19533} = [0.97490406036376953125, 0.97490441799163818359375] \end{aligned}$	$\theta_2 \approx 2^{-27.41}$ $\theta_1 \approx 2^{-27.41}$ $\theta_3 \approx 2^{-27.44}$ $\theta_4 \approx 2^{-27.49}$	$ \eta_2 \approx 2^{-26.99} $ $ \eta_1 \approx 2^{-26.99} $ $ \eta_3 \approx 2^{-26.90} $ $ \eta_4 \approx 2^{-26.77} $	yes yes yes yes

Splitting steps when $m_x < m_y$.

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Validation and performance evaluation

- Validation of the complete code:
 - → the Extremal Rounding Tests Set (D.W. Matula)
 - → TestFloat package
 - → exhaustive tests on mantissa (with fixed result exponent)
- Performances evaluation on ST231 architecture
 - → 4-issue VLIW integer processor of ST200 family
 - → at most 2 mul. per cycle
 - → latencies: addition = 1 cycle, multiplication = 3 cycles

Experimental results

Performances on ST231

	Nb. of instructions	Latency (# cycles)	IPC	Code size (bytes)
rounding to nearest	86	27	3.18	416

- speed-up by a factor of about 1.78 in rounding to nearest compared to the previous implementation (48 cycles)
 - optimized implementation
 - efficient ST200 compiler (st200cc)
- ▶ high IPC value: confirms the parallel nature of our approach

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Contributions

- New approach for the implementation of binary floating-point division
 - → bivariate polynomial-based algorithm
 - → automatic generation and validation of efficient evaluation program
 - → implementation targeted ST231 VLIW integer processor
- Speed-up by a factor of about 1.78 in rounding to nearest compared to the previous implementation

Since then

- Extension to subnormal numbers support
 - → implementation in 31 cycles: 4 extra cycles
- Implementation of other functions

	Latency (# cycles)	IPC	Code size (bytes)	Speed-up
square root	21	2.47	276	2.38
reciprocal	22	2.59	336	1.75
reciprocal square root	29	2.24	368	2.27