# Order-Invariant Real Number Summation

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P. E. Small et al., Proc. IEEE IPDPS, p. 152 ('16) https://aiichironakano.github.io/cs596/Small-OrderInvariantSum-IPDPS16.pdf

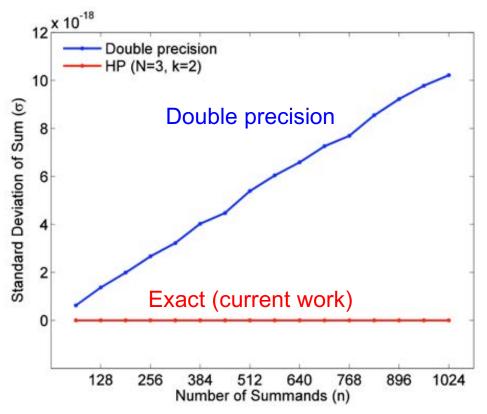




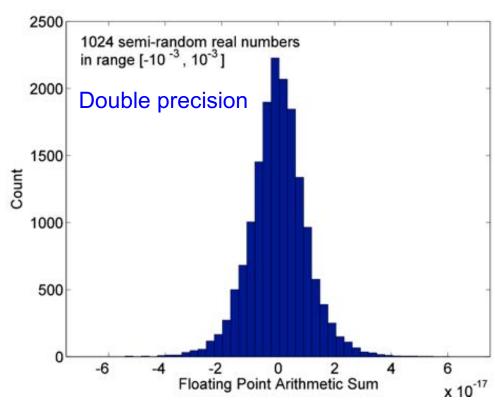
### Reproducibility Challenge

• Rounding (truncation) error makes floating-point addition non-associative

$$(a+b) + c \neq a + (b+c)$$



Standard deviation of sum with random summation orders



Distribution of sum with random summation orders

 Finding: Sum becomes a random walk across the space of possible rounding error

## Solution: High-Precision (HP) Method

- Propose an extension of the order-invariant, higher-precision intermediate-sum method by Hallberg & Adcroft [Par. Comput. 40, 140 ('14)]
- The proposed variation represents a real number r using a set of N 64-bit unsigned integers,  $a_i$  ( $i \in [0, N-1]$ )

$$r = \sum_{i=0}^{N-1} a_i 2^{64(N-k-i-1)}$$

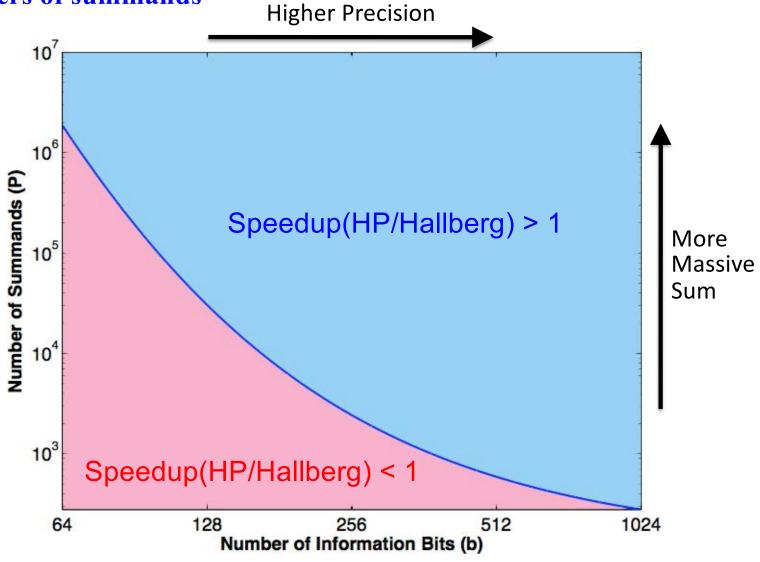
$$= \overbrace{a_0 2^{64(N-k-1)} + \dots + a_{N-k-1}}^{N-k} + \overbrace{a_{N-k} 2^{-64} + \dots + a_{N-1} 2^{-64k}}^{k}$$

- k is the number of 64-bit unsigned integers assigned to represent the fractional portion of r ( $0 \le k \le N$ ), whereas N-k integers represent the whole-number component
- Negative number is represented by two's complement in integer representation, using only 1 bit

If you are the first to find the problem, the simplest solution suffices to prove the concept

#### **Performance Projection**

 HP sum is faster than Hallberg sum for higher precision & larger numbers of summands



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