

# Performance analysis

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# plan for the day

- **reduction**
- theoretical analysis framework
- performing analysis
- experimental analysis
- conducting experiments

# theoretical analysis framework

seeks to answer the following questions:

- how do we reason about parallel algorithms?
- how can we compare two algorithms and determine which is better?
- how do we measure improvement?

# performance metrics

- execution time ( $T_s$  and  $T_p$ )
- speedup ( $S$ )
- efficiency ( $E$ )
- cost ( $C$ )

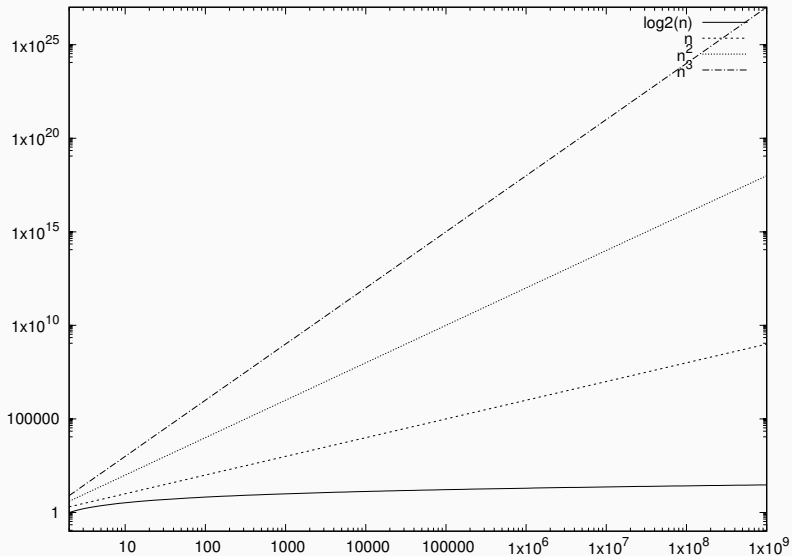
## serial ( $T_s$ )

- time elapsed between beginning and end of execution

## parallel ( $T_p$ )

- time elapsed between beginning of execution and the moment the last processing element finishes execution
- Axy
- Reduction
- Dot-product
- Matrix-vector multiplication
- Matrix-matrix multiplication

# execution time



# speedup

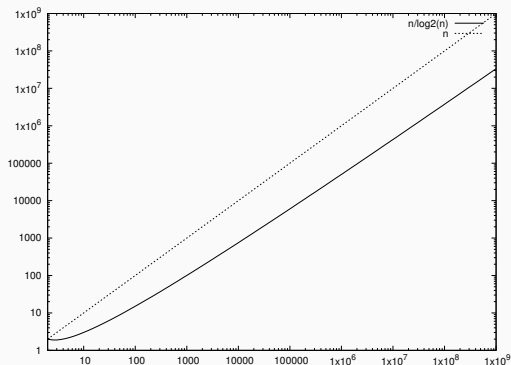
speedup ( $S = T_s/T_p$ )

- the ratio of time taken to solve a problem on a single processing element to the time required to solve the same problem on a parallel computer with  $p$  processing elements

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# Amdahl's law

Speedup is limited by the fraction of a parallel program that is serial.

If  $r$  is the fraction of the code which is serial, then

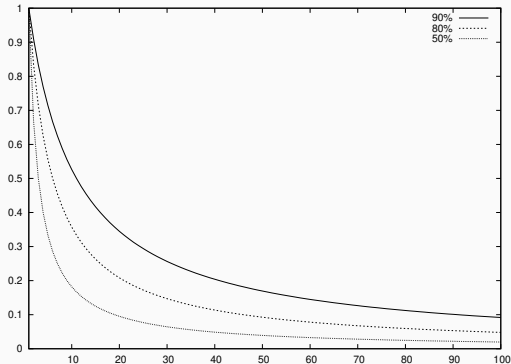
$$S = \frac{T_s}{T_p} = \frac{T_s}{(1-r)T_s/p + rT_s}$$

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In general, we cannot get a speed up better than

$$\frac{1}{r}$$

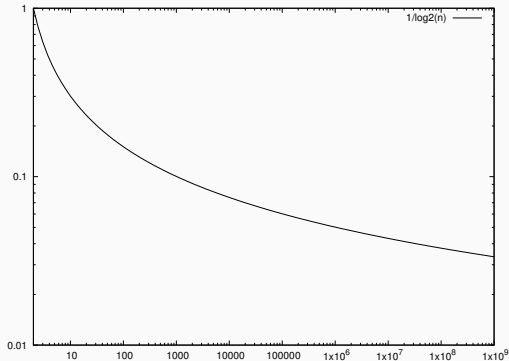
efficiency ( $E = S/p$ )

- the ratio of speedup to the number of processing elements — the fraction of time for which a processing element is usefully employed

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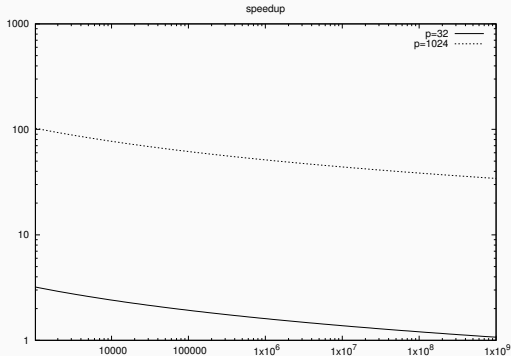
# cost

cost ( $C = pT_p$ )

- the sum of the time spent by all processing elements solving the problem
- *cost-optimal* if  $C = T_s$

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## exercise — axpy

- $T_p = ?$
- $S = ?$
- $E = ?$
- $C = ?$



## exercise — axpy

$p = n$  — cost-optimal

- $T_p = \Theta(n/p)$
- $S = \Theta(\frac{n}{n/p} = p)$
- $E = \Theta(1)$
- $C = \Theta(n)$

## exercise — reduction

$p = n$  — *not cost-optimal*

- $T_p = \Theta(\log n)$
- $S = \Theta(\frac{n}{\log n})$
- $E = \Theta(\frac{1}{\log n})$
- $C = \Theta(n \log n)$

$p > n$  — too many processing elements, use less

$p < n$  — ?

## exercise — reduction

$p = n$  — *not cost-optimal*

- $T_p = \Theta(\log n)$
- $S = \Theta(\frac{n}{\log n})$
- $E = \Theta(\frac{1}{\log n})$
- $C = \Theta(n \log n)$

$p > n$  — too many processing elements, use less

$p < n$  — *not cost-optimal?*

- $T_p = \Theta(\frac{n}{p} + \log p)$
- $S = \Theta(\frac{n}{\frac{n}{p} + \log p})$
- $E = \Theta(\frac{n}{n + \log p})$
- $C = \Theta(n + p \log p)$

## exercise — reduction

$p = n$  — not cost-optimal

- $T_p = \Theta(\log n)$
- $S = \Theta(\frac{n}{\log n})$
- $E = \Theta(\frac{1}{\log n})$
- $C = \Theta(n \log n)$

$p > n$  — too many processing elements, use less

$p < n$  — cost-optimal iff  $n = \Omega(p \log p)$

- $T_p = \Theta(\frac{n}{p} + \log p)$
- $S = \Theta(\frac{n}{\frac{n}{p} + \log p})$
- $E = \Theta(\frac{n}{n + \log p})$
- $C = \Theta(n + p \log p)$



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