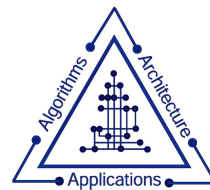


# Repealing Amdahl's Law

(And maybe replace it with something better?)

Danny Hillis

Applied Invention



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Back in the 1980's,  
most supercomputers looked like this:

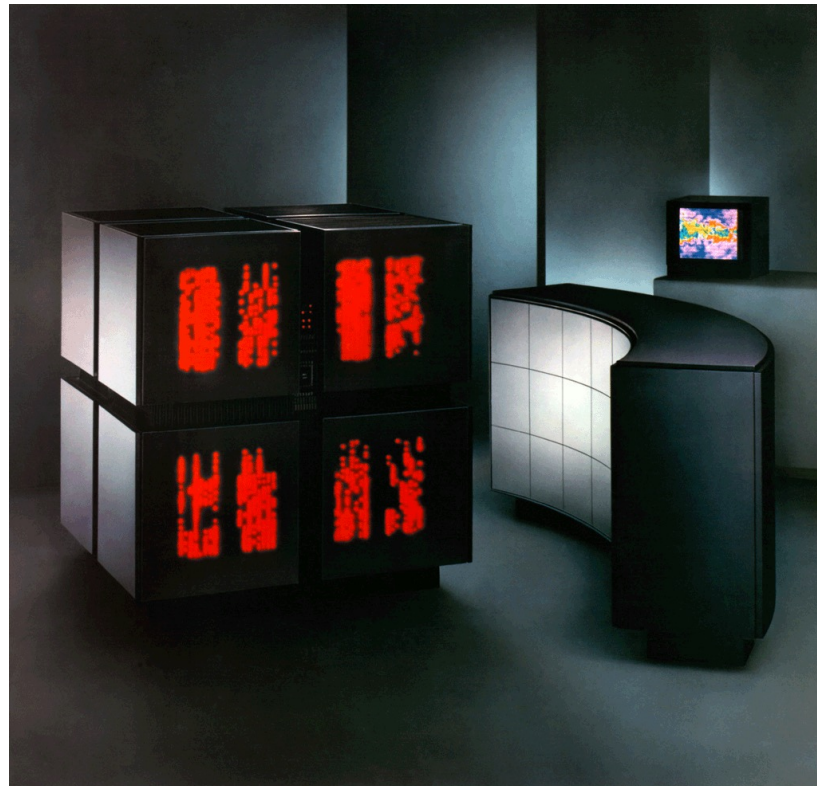


# Supercomputers were super because they had such fast clock speeds

- Clock speed of Cray X-MP was 104 MHz
- Most supercomputers had 1 to 4 CPUs
- Most supercomputer users believed that more CPUs would lead to diminishing returns
- Massively parallel computing was not considered useful for most supercomputing tasks



I was trying to convince people to switch to supercomputers that looked like this:



# Connection Machines

- Many processors connected by a fast communication network
  - CM-1 SIMD, 64,536 1-bit CPUs
  - CM-2 SIMD, 64,536 1-bit CPUs + 1024 64-bit FPUs
  - CM-5 MIMD, 1024 64-bit CPUs + 1024 64-bit FPUs
- Hardware for map/reduce to support "data parallel" programming

Side comment: The distinction between SIMD and MIMD is not so important as it may seem, since each can emulate the other in proportional time



I had a tough time convincing the customers

“If you were plowing a field, which would you rather use:  
two strong oxen or 1024 chickens?”

- Seymour Cray



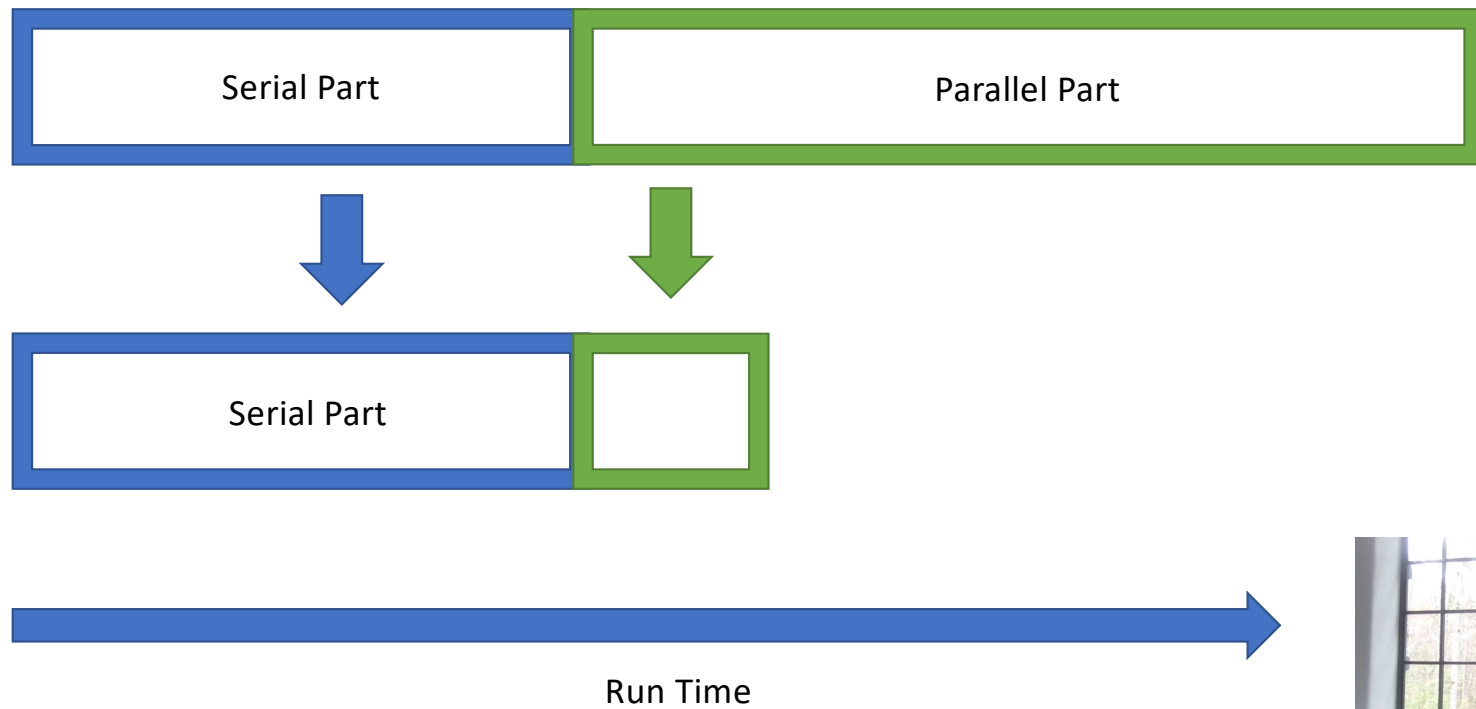
# Customers believed in “Amdahl’s Law”

For a calculation with parallel portion P and N processors

$$\text{Speedup} = \frac{1}{(1 - P) + \frac{P}{N}}$$



# Gene Amdahl's insight

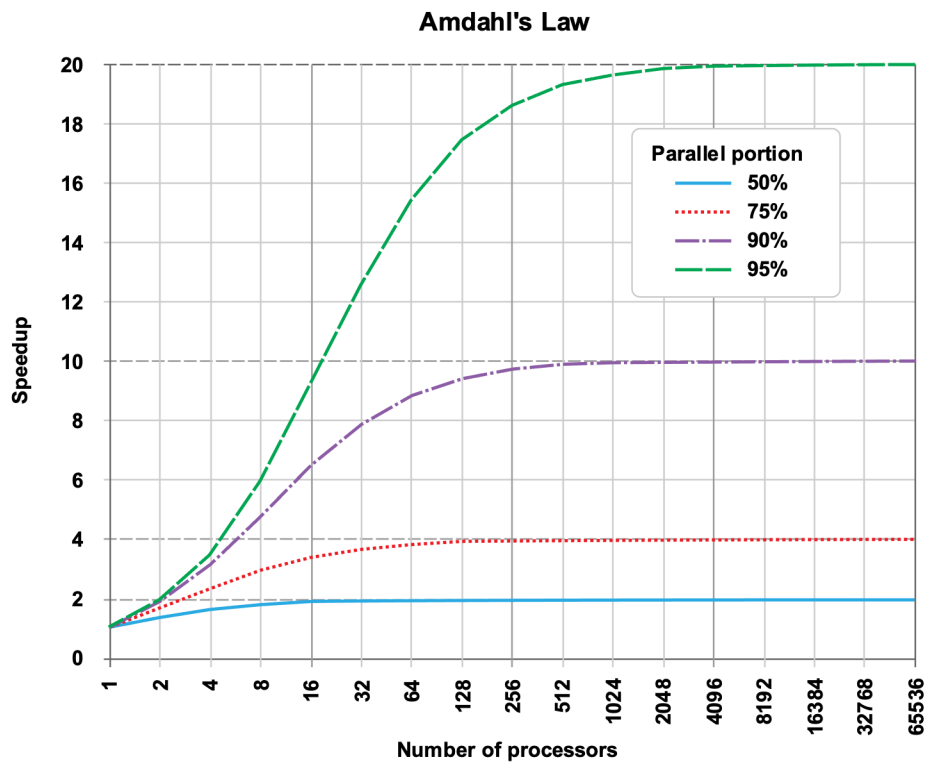


# Amdahl's Example

- Solving a 3-dimensional finite difference model
- Assume a grid of  $N \times N \times N$
- Potential parallelism in volume calculation is order  $N^3$
- Potential parallelism in surface boundary calculation is order  $N^2$
- Potential parallelism in corner case calculations is order 1
- I/O is serial

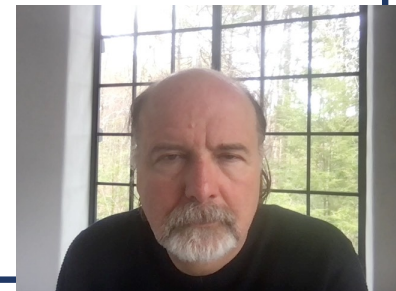


# Seemed like parallelism wouldn't help much



# So, what was wrong with the reasoning?

- Amdahl assumed the portion of the calculation that is potential parallel is fixed
- In reality, faster computers are used to solve bigger problems



# What determines the size of the problem?

- In data processing, the size of of the data that needs to be processed determines the size of the computation
  - The processors are pulled as needed from a cost-optimized pool (cloud)
- In supercomputing, the user wants the best possible result from the available computing resources
  - a bigger computation typically leads to better accuracy, a better optimization, or a better chance finding a solution, so the amount of available computing resources determines the size of the computation



**In supercomputing, the run time is not determined by  
the size of the problem...  
the size of the problem is determined by the run time**



# So, is there a more relevant law?

assumptions:

- The number of processor available  $N$
- The time available is  $T_{\text{available}}$
- The serial part requires time  $T_{\text{serial}}$
- A calculation of size  $k$  can split into  $k$  parallel parts
- Each part can be complete in time  $T_{\text{parallel}}$
- $k \geq N$



# Is it realistic to assume $k \geq N$ ?

- The opportunity for parallelism grows with the amount data or the size of the search space
- Example: Amdahl's  $N \times N \times N$  3D grid
  - scale  $N$  by 100
  - $N^3$  volume scales by  $10^6$
  - Even boundary scales by  $10^4$
- So, yes, the assumption is usually realistic



# Proposed replacement for Amdahl's Law

$$Size \leq \frac{(T_{available} - T_{serial})}{T_{parallel}} N$$

$N$  is number of processors

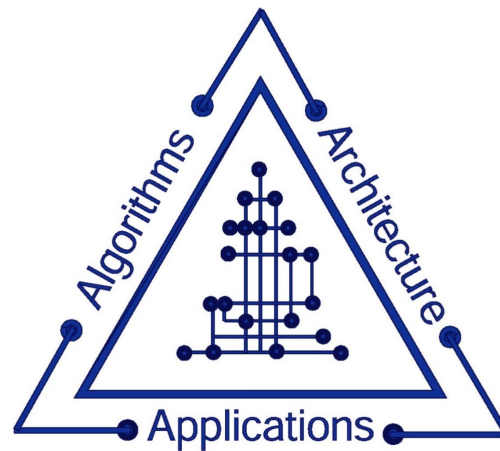
$Size$  is number of parallel parts

$T_{parallel}$  is max time for each of the parallel parts

$T_{serial}$  is time for serial part

Equality can be achieved when  $Size$  is an exact multiple of  $N$





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