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Better. This used to work, but not any more: processors have pretty much levelled off at around the 3-5GHz mark and don't seem to be getting faster

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In reality, No. 1 is best, then No. 2, lastly No. 3

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- it takes one person ten months to build one house

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Why is the last so implausible?

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When there are 100 people running about they will get in each others' way; fight over limited resources like bricks; some will have to sit and twiddle their thumbs while they wait for others to finish: you can't plumb a bathroom until the bathroom has been built

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Sometimes adding more people will make it go *slower* as they get in each others' way

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In reality, we won't get a perfect speedup like this, due to resource contention issues, but we can get pretty close

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This scales much better

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The second is *data parallelism*

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Two very different ways of getting more in a given amount of time

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Often a parallel version of a small problem will be *slower* than the sequential version

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The overheads can easily be larger than the problem itself

This is the reality of parallel computing

Often a parallel version of a small problem will be *slower* than the sequential version

Only when the problem is made large enough to overcome the overheads will it become faster than doing it sequentially

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= cost of computation + cost of management of parallelism

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Ideally, we want the cost of management of parallelism to be minimal

But, if you are not careful, or the problem is such that this is inevitable, we can find that the cost of management of parallelism can dominate

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Parallel programming is *much* harder

If you think you understand parallel programming, you definitely don't

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You have all the issues of sequential programs **plus** lots more

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And they are issues that many programmers have difficulty even understanding

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And they are issues that many programmers have difficulty even understanding

Particularly as they have been trained to program for sequential machines and have habits and assumptions that are simply invalid for parallel machines

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Have I convinced you that parallel programming is difficult yet?

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Well, it's worse than you can imagine!

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Concurrency is about structure, parallelism is about execution

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And “parallel” when we are explicitly talking about stuff running at the same time on multiple pieces of hardware

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*Concurrency is about dealing with lots of things at once. Parallelism is about doing lots of things at once.*

Rob Pike

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The idea here is that when some code would block, e.g., waiting for some I/O, rather than the processor sitting and waiting doing nothing, the code should direct the processor to execute some other task

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The idea here is that when some code would block, e.g., waiting for some I/O, rather than the processor sitting and waiting doing nothing, the code should direct the processor to execute some other task

Later, when the I/O is ready, the processor can come back to where it was and continue from there

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The code makes its own decision on what to do: moving between different parts of code, ensuring the processor is always actively working

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As we know, any call to the OS entails a large amount of CPU overhead, which we avoid here

These are major points of async programming: avoid OS overheads and keep the processor busy

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Programming async code is very complicated and shares many features with programming parallel code

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Modern programming languages are starting to support async programming natively, e.g., JavaScript, Swift, C++, Rust, Python and more

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Programming async code is very complicated and shares many features with programming parallel code

Modern programming languages are starting to support async programming natively, e.g., JavaScript, Swift, C++, Rust, Python and more

Constructs in the languages hide varying amounts of the gory details of choosing and switching between tasks

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Async is for *waiting* in parallel

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**Exercise** Reflect on how you might use **both** async and parallel programming in one program

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Serial and sequential mean the same thing

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Moore's Law

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It is an **observation** on how the components in integrated circuits were shrinking over time as engineering advances were made:

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It is an **observation** on how the components in integrated circuits were shrinking over time as engineering advances were made:

### **Moore's Law (1965):**

*the number of transistors in a chip doubles every two years*

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- it's not a "law" in any real sense, but an *observation* on how chips progress
- Moore did not say *speed* doubles, as often mis-quoted
- some variants say "18 months" instead of "two years", but the history of this statement is complex
- it is somewhat self-fulfilling, as engineers tend to use it as a target for the development of each next generation of chips

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## Moore's Law

There is some economics in there, too: the profit margins on silicon wafers mean that it is better to have fewer larger chips than lots of smaller chips

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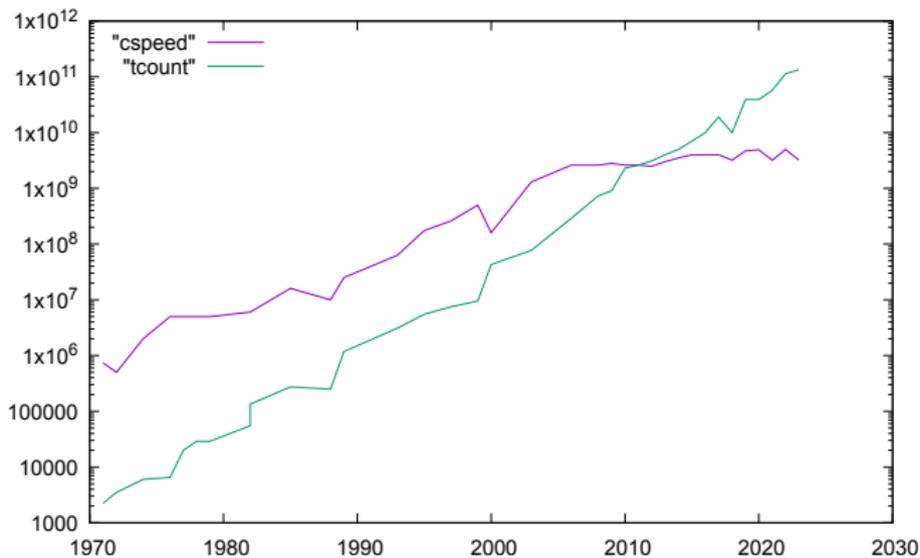
## Moore's Law

There is some economics in there, too: the profit margins on silicon wafers mean that it is better to have fewer larger chips than lots of smaller chips

So CPUs tend to keep to the same area, meaning a CPU will have more and more transistors, not that we have more smaller CPUs

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## Moore's Law



Log of speed and transistor count against date of Intel processors

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We can see why people thought that Moore's Law was about speed: for a long time both transistor count and speed went up exponentially

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CPUs stay the same physical size

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Engineer:

What are we going to do with those extra transistors?

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How are we going to convince people to buy the new CPUs?

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Chips with more than one CPU on them

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Dual and quad core is everywhere; 64 core processors are around; 128 cores are arriving soon (PC-style architecture)

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So now chips in new PCs are all multicore

Dual and quad core is everywhere; 64 core processors are around; 128 cores are arriving soon (PC-style architecture)

Many cores is great, but we are going to have to find out how to make best use of them

But simply having two CPUs generally won't make our program go twice as fast: overheads like interference and communication between parts of the computation is going to be a problem

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To repeat: all this hardware is all wonderful except for one point

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*This computational power is only useful if we can write the software to exploit it*

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Software is far behind hardware and has a lot to do to catch up

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Your phone might have eight cores, but it is likely very little software it runs is capable of using all their power simultaneously

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We are still in the dark regarding parallel software

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## A Brief Aside

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Giving a problematic gap between speed of processors and speed of memory (both in bandwidth and latency)

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We shall see memory is a big bottleneck in parallel systems

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Moore himself thinks perhaps it will last until 2025

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And — looking at Intel's products the last few years — it might currently be taking 5 years to double transistor counts

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## Moore's Law

**Exercise** Some current top end chips have over 100 billion transistors, and 7000 cores. If Moore's Law continued, how many transistors and cores would they have in 10 years? In 20 years?

**Exercise** Read about Moore's Second Law (aka Rock's Law)

# Background

## Moore's Law

*Software is getting slower more rapidly than hardware is becoming faster*

Wirth's Law

*Software efficiency halves every 18 months, compensating Moore's law*

David May

*The speed of software halves every 18 months*

Gates' Law

*What Intel giveth, Microsoft taketh away*

Anon