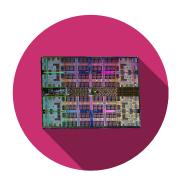




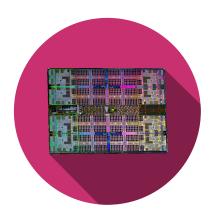
### **Computer Architecture**

## Performance Per

Information and Communication Systems program



Silvan Zahno <u>silvan.zahno@hevs.ch</u>



**Benchmarks** 

### **Benchmarks**



Judges the relative performance of a CPU

#### **Key terms**

- MIPS
- MFLOPS
- MHz
- FPS
- Render Time
- Dropped Frames

### **Benchmarks**

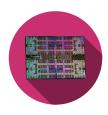


Judges the relative performance of a CPU

#### **Key terms**

- MIPS Million Instruction per Second
- MFLOPS Million Floating Point Operation per Second
- MHz Frequency
- FPS Frame per second
- Render Time Time to render 2D/3D scene
- Dropped Frames number of frames lost in streaming

### Spectrum of Benchmarks



Complexity ∞ Cost Benchmarking

# Synthetic

Artificial programs than don't do any real useful work **Example:** Dhrystone

Benchmark

#### Micro Benchmark

Programs that target measurement of a specific component of feature

**Example:** STREAM to measure memory bandwidth

#### Kernel Benchmark

Extracted portion of a key algorithm used in an application **Example:** Geekbench

#### Application Benchmark

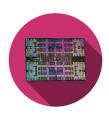
Complete and real programs that solve a problem to produce useful results **Example:** SPEC CPU

#### **Use Case**

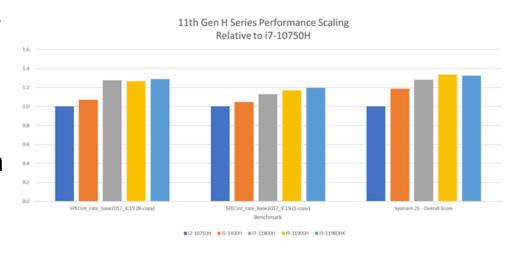
Real world end user application **Example:** Browsing

Representativeness to Real World Performance

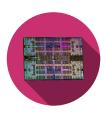
#### SPEC Benchmark SPEC CPU 2017



- Standard Performance EvaluationCorporation
- Measures integer and floating point operation performance
- Contains 10 integer and 13 floating point operations
- Compute intensive, concentrates on CPU and memory



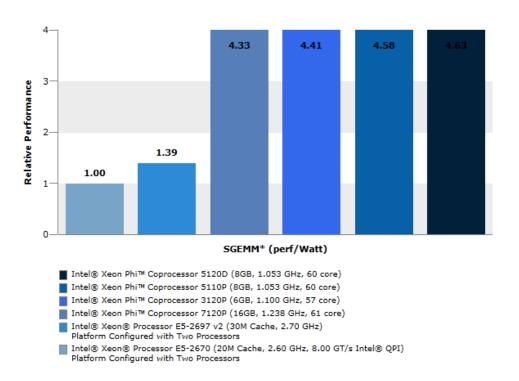
### Linpack



92

#### Performance per Watt

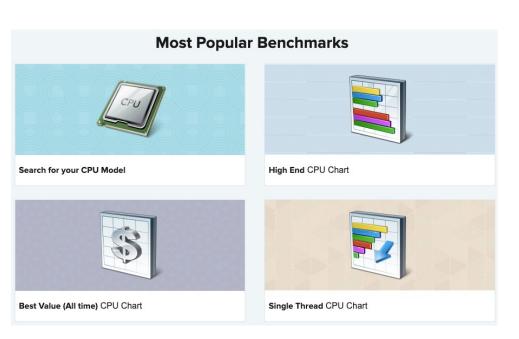
- Performances of double precision vector and matrix operations
- Ofen used by HPC communicate to measure FLOPS of a processor



#### PassMark

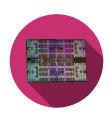
#### Multitude of Benchmarks

- CPU <a href="https://www.cpubenchmark.net">https://www.cpubenchmark.net</a>
- Video Cards <a href="https://www.videocardbenchmark.net">https://www.videocardbenchmark.net</a>
- Hard Drive <u>https://www.harddrivebenchmark.net</u>
- Memory <a href="https://www.memorybenchmark.net">https://www.memorybenchmark.net</a>
- PC <a href="https://www.pcbenchmarks.net">https://www.pcbenchmarks.net</a>
- Database <u>https://www.databasebenchmarks.net</u>



PassMark software

### Aspects of Computer Performance



#### Time

- Response time / latency / execution time
  - Time between start and completion of event / task / program (n seconds)

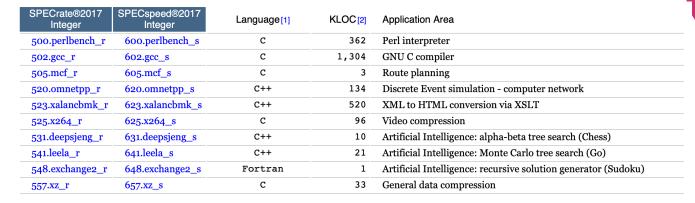
#### **Other Aspects**

Availability, scalability, performance per watt

### **Benchmark Suites**

Benchmark	Organization	Description	Comment
Dhrystone	Open Source	Synthetic benchmark measure compute- intensice integer performance	No longer representative of modern workloads
CoreMark	EEMBC	Popular benchmark to measurecompute- intensive integer performance	Result published through EEMBS, continuation of Dhrystone
SPEC CPU	SPEC OSG CPU	Application benchmarks that comprise of open-source real world applications.	Most popular for measuring CPU perfornamce
STREAM	Open Source	Suite of microbenchmarks to measure sustained memory bandwidth	Measure of memory latency and bandwidth
Geekbench 5	Primate labs	Kernel benchmarks that measure CPU Integer, Floating Point and Memory performance	Used in industry, but with some limitation on the representation of realworld scenarios
PassMark	PassMark Software	Kernel benchmarks that measure CPU Integer, Floating Point and Memory performance Per	Used in industry, but with some limitation on the representation of realworld scenarios

#### **SPEC Benchmarks**



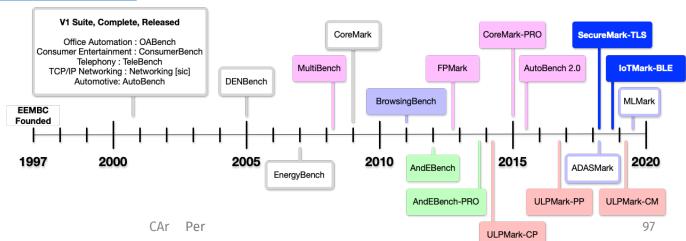
SPECrate®2017 Floating Point	SPECspeed®2017 Floating Point	Language[1]	KLOC [2]	Application Area
503.bwaves_r	603.bwaves_s	Fortran	1	Explosion modeling
507.cactuBSSN_r	607.cactuBSSN_s	C++, C, Fortran	257	Physics: relativity
508.namd_r		C++	8	Molecular dynamics
510.parest_r		C++	427	Biomedical imaging: optical tomography with finite elements
511.povray_r		C++, C	170	Ray tracing
519.lbm_r	619.lbm_s	С	1	Fluid dynamics
521.wrf_r	621.wrf_s	Fortran, C	991	Weather forecasting
526.blender_r		C++, C	1,577	3D rendering and animation
527.cam4_r	627.cam4_s	Fortran, C	407	Atmosphere modeling
	628.pop2_s	Fortran, C	338	Wide-scale ocean modeling (climate level)
538.imagick_r	638.imagick_s	С	259	Image manipulation
544.nab_r	644.nab_s	С	24	Molecular dynamics
549.fotonik3d_r	649.fotonik3d_s	Fortran	14	Computational Electromagnetics
554.roms_r	654.roms_s	Fortran	210	Regional ocean modeling
		[1] For multi-language ber	nchmarks, the f	irst one listed determines library and link options (details ♂ )

#### **EEMBC Benchmarks**

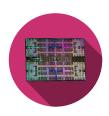


#### Benchmarks can be grouped into the following categories:

- <u>Ultra-Low Power and Internet of Things</u>
- Heterogeneous Compute
- Single-core Processor Performance
- Multi-core Processor Performance
- Phone and Tablet



#### How to Measure Execution time?

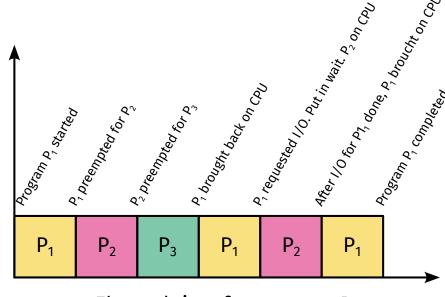


#### Wall-clock time

- Elapsed time
  - Disk Access, I/O, OS overhead, ...

Multiprogrammed CPI works on other process when current process stalled for I/O

CPU-time = time CPU is computing



Elapsed time for program P<sub>1</sub>

#### Benchmark

#### Exercise





Which of the following statements are correct?

- 1. The wall clock time is the total elapsed time, including I/O, Operating system overhead etc.?
- 2. Multi-threading improves the throughput of a process
- 3. The CPU time does not include the I/O time
- 4. Multi-threading improves the execution time of a process

#### Benchmark

#### Exercise





### Which of the following statements are correct?

- 1. The wall clock time is the total elapsed time, including I/O, Operating system overhead etc.?
- 2. Multi-threading improves the throughput of a process
- 3. The CPU time does not include the I/O time
- 4. Multi-threading improves the execution time of a process

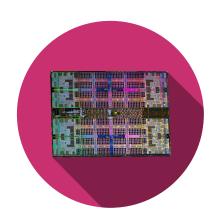
#### Benchmark

### Quick and Dirty

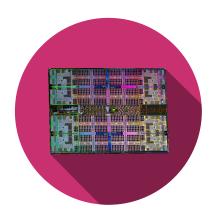


For quickly benchmark your application or functions you can use hyperfine. A rust base CLI Program

```
► hyperfine --warmup 3 'fd -e jpg -uu' 'find -iname "*.jpg"'
```



Mini-Labo "Debug"





- With 1 program it is clear which computer is faster
- With >1 programs, it depends

How do you aggregate their performance?



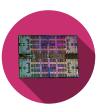
- With 1 program it is clear which computer is faster
- With >1 programs, it depends

How do you aggregate their performance?

$$ArithmeticMean = AM = \frac{1}{n} \sum_{i=1}^{n} Time_{i}$$

#### Exercise



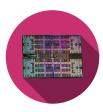


	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20

- 1. Which CPU is the fastest for  $P_1$ ?
- 2. Which CPU is the fastest for P<sub>2</sub>?
- 3. Which CPU is the fastest?

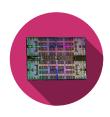
#### Exercise





	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20
Total (sec)			
Arithmetic Mean			

- 1. Which CPU is the fastest for  $P_1$ ?
- 2. Which CPU is the fastest for P<sub>2</sub>?
- 3. Which CPU is the fastest?



- What if the program not run equally often?
- Two approaches:
  - Weighted execution time
  - Normalize execution times to a reference machine and take the average

### Weighted Execution Time



- Program  $P_i$  has a weight  $Weight_i$ 
  - Indicates execution frequency
  - weights add up to 1
- Program  $P_i$  takes time  $Time_i$
- Weighted arithmetic mean:

$$WeightedArithmeticMean = WAM = \sum_{i=1}^{N} Weight_i * Time_i$$

### Weighted Execution Time - Example



	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20
Arithmetic mean	500.5	55	20

- 1. Which CPU is the fastest with  $w_1$ =0.8 and  $w_2$  = 0.2
- 2. Which CPU is the fastest with  $w_1$ =0.9 and  $w_2$  = 0.1



### Weighted Execution Time - Example

	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20
Arithmetic mean	500.5	55	20
Weighted mean ( $w_1$ =0.8, $w_2$ =0.2)			
Weighted mean ( $w_1$ =0.9, $w_2$ =0.1)			

1. Which CPU is the fastest with  $w_1$ =0.8 and  $w_2$  = 0.2

2. Which CPU is the fastest with  $w_1$ =0.9 and  $w_2$  = 0.1

### Weighted Execution Time - Exercise





We want to buy a new computer. It will mostly run programs  $P_1$  and  $P_2$ .

- 1. When is CPU A the best buy?
- 2. When is CPU B the best buy?
- 3. When is CPU C the best buy?

	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	100
Program P <sub>2</sub> (sec)	100	10	1

#### Normalized Execution Time



Normalize the execution time to a reference computer

$$ExecutionTimeRatio = \frac{ExecutionTime_{reference}}{ExecutionTime_{new}}$$

Used by SPEC Benchmarks, called SPECRatio





### • Normalized Execution Time - Example

	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20

	Normalized to A			Nor	malized t	о В
	CPU A	CPU B	CPU C	CPU A	CPU B	CPU C
ETR P <sub>1</sub>						
ETR P <sub>2</sub>						

### Normalized Execution Time - Example



 Do NOT use arithmetic mean to average normalized execution times!!

	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20

	Normalized to A			Nor	malized t	о В
	CPU A	CPU B	CPU C	CPU A	CPU B	CPU C
ETR P <sub>1</sub>	1	0.1	0.05	10	1	0.5
ETR P <sub>2</sub>	1	10	50	0.1	1	5.0
Arithmetic mean	1	5.05	25.025	5.05	1	2.75

#### Geometric Mean

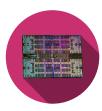


- Independent of reference
- No physical meaning

Geometric Mean = 
$$GM = \int_{i=1}^{n} ExecutionTimeRatio_i$$

## Geometric Mean - Example





n	n	Tuo anti an Tima Dati a
$GM = \int$	$\begin{bmatrix} \\ i=1 \end{bmatrix}$	$Execution Time Ratio_i$
V		•

	CPU A	CPU B	CPU C
Program P <sub>1</sub> (sec)	1	10	20
Program P <sub>2</sub> (sec)	1000	100	20

	Normalized to A		Normalized to B			
	CPU A	CPU B	CPU C	CPU A	CPU B	CPU C
ETR P <sub>1</sub>	1	0.1	0.05	10	1	0.5
ETR P <sub>2</sub>	1	10	50	0.1	1	5.0
Geometric mean						



$$T = IC * CPI * CT = \frac{IC * CPI}{f}$$

- T = Execution time
- $IC = N_{instr} = \#$  Instructions executed (Instruction Count)
- CPI = Cycles Per Instruction
- $CT = t_{cycle} =$ Cycle Time = duration of clock cycle
- $f = \text{clock frequency} = \frac{1}{t_{cycle}}$

### Improving Performance



$$T = IC * CPI * CT = \frac{IC * CPI}{f}$$

- Factors are interdependent => Trade-offs
  - Cost
  - Power
  - Performance

Reduce	How	Side effect
$IC / N_{instr}$	Increase capability / complexity of instructions	$CPI / t_{cycle}$ increases
CPI	Simple instructions required fewer cycles	<i>IC / N<sub>instr</sub></i> increases
$CT / t_{cycle}$	Less work per cycle	CPI increases

### Calculating Execution Time





A program executes 5 Million instruction with a given instruction mix:

Instruction	Frequency	$CPI_{instr}$
ALU	50%	3
Load	20%	5
Store	10%	4
Branch	20%	3

- The CPU has a frequency of 2GHz
- 1. What is the execution time?

### Calculating Execution Time





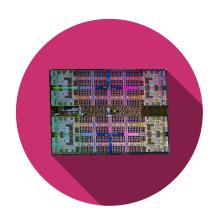
# A program executes 5 Million instruction with a given instruction mix:

$$CPI_{avg} =$$

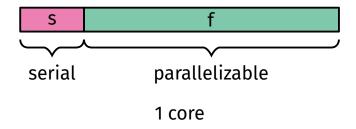
Instruction	Frequency	$CPI_{instr}$
ALU	50%	3
Load	20%	5
Store	10%	4
Branch	20%	3

$$T =$$

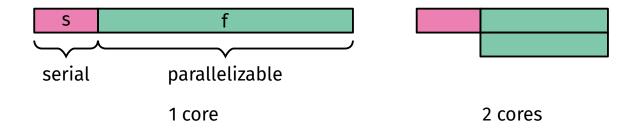
- The CPU has a frequency of 2GHz
- 1. What is the execution time?

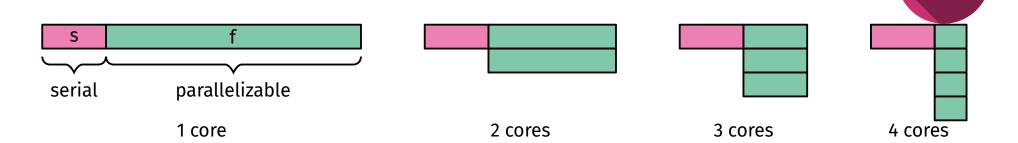


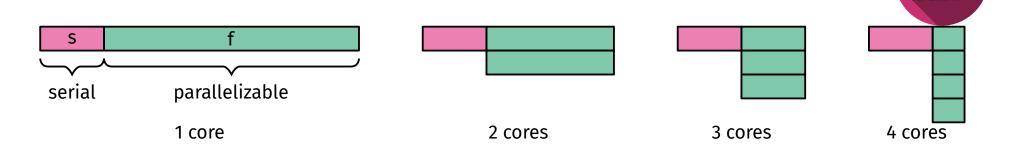






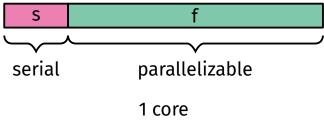


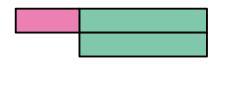




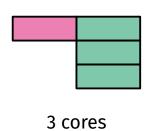
If 50% of the execution time is sequential, the maximum speedup is 2, no matter how many cores you use.

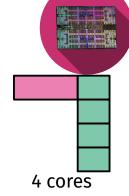
- Gene Amdahl -

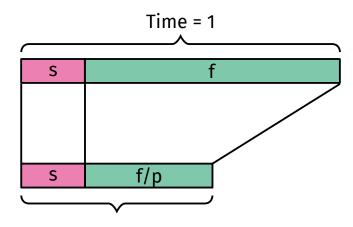




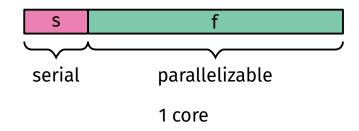
2 cores

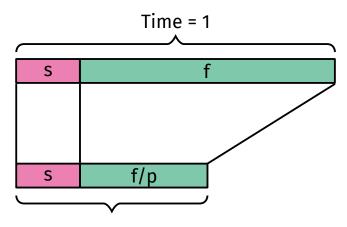




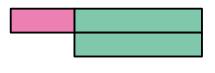


$$Time = s + \frac{f}{p}$$



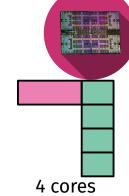


$$Time = s + \frac{f}{p}$$









$$S = \frac{1}{s + \frac{f}{p}} = \frac{1}{1 - f + \frac{f}{p}}$$

$$S = \frac{1}{s + \frac{f}{p}} = \frac{1}{1 - f + \frac{f}{p}}$$

$$S = \text{Speedup}$$

$$s = 1 - f = \text{serial fraction}$$

$$f = 1 - s = \text{parallel fraction}$$

$$p = \# \text{processor cores}$$

# Speedup for Different Parallel Fractions



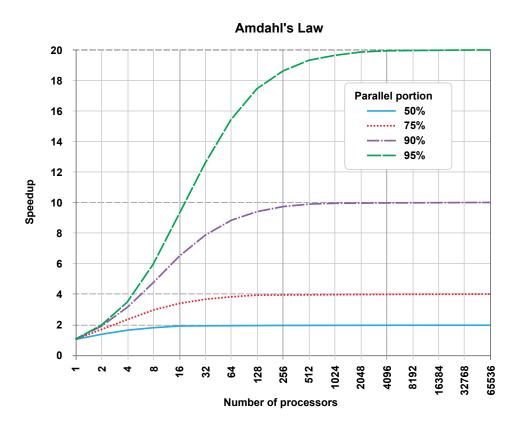
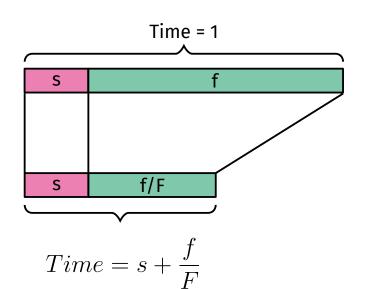


Image Credit: Wikipedia

#### Generalization of Amdahl's Law



- Suppose we can improve fraction f by factor F
- What will be overall improvement?



$$S = \frac{1}{s + \frac{f}{F}} = \frac{1}{1 - f + \frac{f}{F}}$$

$$S =$$
Speedup  
 $s = 1 - f =$ fraction we cannot improve  
 $f = 1 - s =$ fraction we can improve  
 $F =$ improvement  $f$  actor

### Example

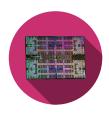




FP instruction improved to run 2x as fast, but only 10% of all executed instructions are FP.

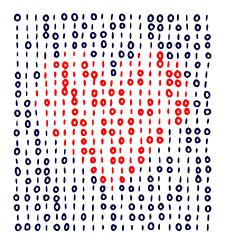
What will be the overall speedup?

#### References



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- [7]
  "linpack performance per wat at DuckDuckGo."
  https://duckduckgo.com/?q=linpack+performance+per+wat&t=osx&iar=images&ia=images&iai=http%3A%2F%2Fwww.intel.com%2Fcontent%2Fdam%2Fwww%2Fpublic%2Fus%2Fen%2Fimages%2Fcharts%2Fchart-id-642.png (accessed Jul. 21, 2022).
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WHY ARE THERE MIRRORS ABOVE BEDS WHY HAVE DINOSAURS NO FUR WHY ARE SWISS AFRAID OF DRAGONS RWHY IS THERE A LINE THROUGH HTTPS TOWHY IS THERE A RED LINE THROUGH HTTPS ON TWITTER WHY IS HTTPS IMPORTANT WHY IS SEA SALT BETTER IN QUESTIONS WHY ARE THERE TREES IN THE MIDDLE OF FIELDS WHY AREN'T MY WHY IS THERE NOT A POKEMON MMO ARMS GROWING WHY IS THERE LAUGHING IN TV SHOWS WHY ARE THERE DOORS ON THE FREEWAY -WHY ARE THERE SO MANY SUCHOST-EXE RUNNING WHY AREN'T ANY COUNTRIES IN ANTARCTICA WHY ARE THERE SCARY SOUNDS IN MINECRAFT WHY IS THERE KICKING IN MY STOMACH WHY AREN'T ECONOMISTS RICH WHY ARE THERE TWO SLASHES AFTER HTTP WHY ARE THERE SO MANY CROWS IN ROCHESTER 🖰 WHY DO AMERICANS CALL IT SOCCER & WHY ARE THERE CELEBRITIES WHY IS TO BE OR NOT TO BE FUNNY WHY DO SNAKES EXIST WHY ARE MY EARS RINGING WHY DO CHILDREN GET CANCER 🗢 WHY DO OYSTERS HAVE PEARLS WHY IS 42 THE ANSWER TO EVERYTHING 🕏 WHY ARE DUCKS CALLED DUCKS WHY IS POSEIDON ANGRY WITH ODYSSEUS T WHY CAN'T NOBODY ELSE LIFT THORS HAMMER S WHY DO THEY CALL IT THE CLAP WHY IS THERE ICE IN SPACE WHY IS MARVIN ALWAYS SO SAD WHY ARE KYLE AND CARTMAN FRIENDS WHY IS THERE AN ARROW ON AANG'S HEAD 🔨 UHY ARE THERE ANTS IN MY LAPTO WHY ARE TEXT MESSAGES BLUE WHY ARE THERE MUSTACHES ON CLOTHES WHY IS EARTH TILTED WHY IS THERE AN OWL IN MY BACKYARD WHY WUBA LUBBA DUB DUB MEANING WHY ARE THERE WHY IS SPACE BLACK WHY IS THERE A WHALE AND A POT FALLING **GHOSTS** WHY IS THERE AN OWL OUTSIDE MY WINDOW WHY ARE THERE SO MANY BIRDS IN SWISS WHY IS OUTER SPACE SO COLD WHY IS THERE AN OWL ON THE DOLLAR BILL WHY IS THERE SO LITTLE RAIN IN WALLIS WHY ARE THERE PYRAMIDS ON THE MOON WHY IS NASA SHUTTING DOWN D WHY IS WALLIS WEATHER FORECAST ALWAYS WRONG WHY DO OWLS ATTACK PEOPLE I ARE THERE MALE AND FEMALE BIKES WHY ARE THERE BRIDESMAIDS & WHY ARE THERE TINY SPIDERS IN MY HOUSE WHY DO DYING PEOPLE REACH UP & WHY ARE THERE TINY SPIDERS IN MY HOUSE WHY ARE FPGA'S EVERYWHERE HOW FAST IS LIGHTSPEED WHY DO SPIDERS COME INSIDE WHY ARE THERE HELICOPTERS CIRCLING MY HOUSE TO WHY ARE THERE HUGE SPIDERS IN MY HOUSE IN WHY ARE MY BOOBS ITCHY WHY ARE THERE GODS WHY ARE THERE WHY ARE THERE LOTS OF SPIDERS IN MY HOUSE WHY ARE CIGARETTES LEGAL WHY ARE THERE TWO SPOCKS 🗜 SQUIRRELS WHY ARE THERE DUCKS IN MY POOL 'S WHY ARE THERE SPIDERS IN MY ROOM WHAT IS https://xkcd·com/1256/ WHY IS JESUS WHITE WHY ARE THERE SO MANY SPIDERS IN MY ROOM WHY IS THERE LIQUID IN MY EAR "WHY DO SPYDER BITES ITCH WHY DO THEY SAY T-MINUS WHY DO Q TIPS FEEL GOOD WHY DO PEOPLE DIE EWHY IS DYING SO SCARY WHY ARE THERE OBELISKS # WHY AREN'T MWHY ARE WRESTLERS ALWAYS WET IN T WHY DO KNEES CLICK I THERE GUNS IN





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