Computer Architecture

2007-2008

Organization (www.liacs.nl/ca)

People

- Lecturer: Lex Wolters
- Assignment leader: Harmen van der Spek
- Assistant: Van Thieu Vu
- Student assistants: Eyal Halm & Joris Huizer

Lectures (3 EC)

- Wednesday 11.15-13.00h till Dec 5th (except Oct 3rd)
- Book: Hennessy & Patterson, fourth edition!
- Exam: date unknown yet



Assignment (4 EC)

- Parts 1 (10%), 2a (30%), 2b (30%), 3 (30%): strict deadlines
- Assistance (room 306):
 - » Wed 13.45-15.30h (scheduled): this afternoon Intro part 1
 - » Mon, Tue, Thu 15.30-16.30h

Lecture 1 - Introduction

Slides are used during lectures by David Patterson, Berkeley, spring 2006

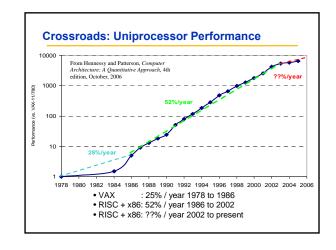
Outline

- · Computer Science at a Crossroads
- Computer Architecture v. Instruction Set Arch.
- What Computer Architecture brings to table

Break

Crossroads: Conventional Wisdom in Comp. Arch

- Old Conventional Wisdom: Power is free, Transistors expensive
- New Conventional Wisdom: "Power wall" Power expensive, Xtors free (can put more on chip than can afford to turn on)
- Old CW: Sufficiently increasing Instruction Level Parallelism via compilers, innovation (Out-of-order, speculation, VLIW, ...)
- New CW: "ILP wall" law of diminishing returns on more HW for ILP
- Old CW: Multiplies are slow, Memory access is fast
- New CW: "Memory wall" Memory slow, multiplies fast (200 clock cycles to DRAM memory, 4 clocks for multiply)
- Old CW: Uniprocessor performance 2X / 1.5 yrs
- New CW: Power Wall + ILP Wall + Memory Wall = Brick Wall
 - Uniprocessor performance now 2X / 5(?) yrs
- ⇒ Sea change in chip design: multiple "cores" (2X processors per chip / ~ 2 years)
 - » More simpler processors are more power efficient



Sea Change in Chip Design

- Intel 4004 (1971): 4-bit processor, 2312 transistors, 0.4 MHz, 10 micron PMOS, 11 mm² chip
- RISC II (1983): 32-bit, 5 stage pipeline, 40,760 transistors, 3 MHz, 3 micron NMOS, 60 mm² chip
- 125 mm² chip, 0.065 micron CMOS = 2312 RISC II+FPU+Icache+Dcache
 - RISC II shrinks to ~ 0.02 mm² at 65 nm
 - Caches via DRAM or 1 transistor SRAM?





Processor is the new transistor?

Déjà vu all over again?

- Multiprocessors imminent in 1970s, '80s, '90s, ...
- "... today's processors ... are nearing an impasse as technologies approach the speed of light.."

David Mitchell, The Transputer: The Time Is Now (1989)

- · Transputer was premature
 - ⇒ Custom multiprocessors strove to lead uniprocessors
 - ⇒ Procrastination rewarded: 2X seq. perf. / 1.5 years
- "We are dedicating all of our future product development to multicore designs. ... This is a sea change in computing"

Paul Otellini, President, Intel (2004)

- Difference is all microprocessor companies switch to multiprocessors (AMD, Intel, IBM, Sun; all new Apples 2 CPUs)
- ⇒ Procrastination penalized: 2X sequential perf. / 5 yrs
 ⇒ Biggest programming challenge: 1 to 2 CPUs

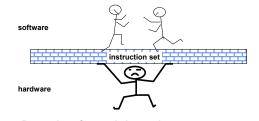
Problems with Sea Change

- Algorithms, Programming Languages, Compilers, Operating Systems, Architectures, Libraries, ... not ready to supply Thread Level Parallelism or Data Level Parallelism for 1000 CPUs / chip
- Architectures not ready for 1000 CPUs / chip Unlike Instruction Level Parallelism, cannot be solved by just by computer architects and compiler writers alone, but also cannot be solved without participation of computer architects
- The 4th edition of the textbook 'Computer Architecture: A Quantitative Approach' explores shift from Instruction Level Parallelism to Thread Level Parallelism / Data Level Parallelism

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Instruction Set Architecture: Critical Interface



- · Properties of a good abstraction
 - Lasts through many generations (portability)
 - Used in many different ways (generality)
 - Provides convenient functionality to higher levels
 - Permits an efficient implementation at lower levels

Example: MIPS

r31

Programmable storage 232 x bytes 31 x 32-bit GPRs (R0=0)

32 x 32-bit FP regs (paired DP) HI, LO, PC

Data types ? Format ? Addressing Modes?

Arithmetic logical

Add, AddU, Sub, SubU, And, Or, Xor, Nor, SLT, SLTU, Addl, AddlU, SLTI, SLTIU, Andl, Orl, Xorl, LUI SLL, SRL, SRA, SLLV, SRLV, SRAV

Memory Access

LB. LBU, LH. LHU, LW. LWL,LWR SB, SH, SW, SWL, SWR

Control J, JAL, JR, JALR

32-bit instructions on word boundary BEq, BNE, BLEZ,BGTZ,BLTZ,BGEZ,BLTZAL,BGEZAL

Instruction Set Architecture

- "... the attributes of a [computing] system as seen by the programmer, *i.e.* the conceptual structure and functional behavior, as distinct from the organization of the data flows and controls the logic design, and the physical implementation.'
 - Amdahl, Blaauw, and Brooks, 1964

SOFTWARE

- -- Organization of Programmable Storage
- -- Data Types & Data Structures: Encodings & Representations
- -- Instruction Formats
- -- Instruction (or Operation Code) Set
- -- Modes of Addressing and Accessing Data Items and Instructions
- -- Exceptional Conditions

ISA vs. Computer Architecture

- · Old definition of computer architecture = instruction set design
 - Other aspects of computer design called implementation
 - Insinuates implementation is uninteresting or less challenging
- Our view is computer architecture >> ISA
- · Architect's job much more than instruction set design; technical hurdles today more challenging than those in instruction set design
- · Since instruction set design not where action is, some conclude computer architecture (using old definition) is not where action is
 - We disagree on conclusion
 - Agree that ISA not where action is (ISA in appendix B)

Comp. Arch. is an Integrated Approach

- · What really matters is the functioning of the complete system
 - hardware, runtime system, compiler, operating system, and application
 - In networking, this is called the "End to End argument"
- · Computer architecture is not just about transistors, individual instructions, or particular implementations
 - E.g., Original RISC projects replaced complex instructions with a compiler + simple instructions

Computer Architecture is Design and Analysis Architecture is an iterative process: Searching the space of possible designs At all levels of computer systems Creativity Good Ideas Bad Ideas Mediocre Ideas

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What Computer Architecture brings to Table

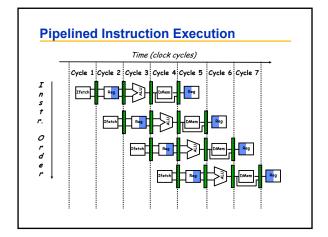
- Other fields often borrow ideas from architecture
- **Quantitative Principles of Design**
 - 1. Take Advantage of Parallelism 2. Principle of Locality
 - 3. Focus on the Common Case
 - 4. Amdahl's Law
 - 5. The Processor Performance Equation
- Careful, quantitative comparisons
 - Define, quantity, and summarize relative performance
 - Define and quantity relative cost
 - Define and quantity dependability
 - Define and quantity power
- Culture of anticipating and exploiting advances in technology
- Culture of well-defined interfaces that are carefully implemented and thoroughly checked

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1) Take Advantage of Parallelism

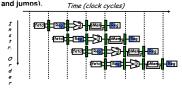
- · Increasing throughput of server computer via multiple processors or multiple disks
- · Detailed HW design
 - Carry lookahead adders uses parallelism to speed up computing sums from linear to logarithmic in number of bits per operand
 - Multiple memory banks searched in parallel in set-associative caches
- Pipelining: overlap instruction execution to reduce the total time to complete an instruction sequence.
 - Not every instruction depends on immediate predecessor ⇒ executing instructions completely/partially in parallel possible

 - Classic 5-stage pipeline:
 1) Instruction Fetch (lfetch),
 2) Register Read (Reg),
 3) Execute (ALU),
 4) Data Memory Access (Dmem),
 5) Register Write (Reg)



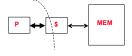
Limits to pipelining

- Hazards prevent next instruction from executing during its designated clock cycle
 - Structural hazards: attempt to use the same hardware to do two different things at once
 - <u>Data hazards</u>: Instruction depends on result of prior instruction still in the pipeline
 - Control hazards: Caused by delay between the fetching of instructions and decisions about changes in control flow (branches and jumns). Time (clock cycles)



2) The Principle of Locality

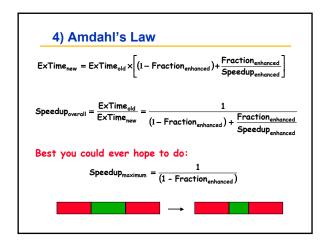
- . The Principle of Locality:
 - Program access a relatively small portion of the address space at any instant of time.
- Two Different Types of Locality:
 - Temporal Locality (Locality in Time): If an item is referenced, it will tend to be referenced again soon (e.g., loops, reuse)
 - Spatial Locality (Locality in Space): If an item is referenced, items whose addresses are close by tend to be referenced soon (e.g., straight-line code, array access)
- · Last 30 years, HW relied on locality for memory perf.



Levels of the Memory Hierarchy Capacity Access Time Cost CPU Registers 100s Bytes 300 - 500 ps (0.3-0.5 ns) Registers prog./compiler 1-8 bytes Instr. Operands faster L1 Cache L1 and L2 Cache 10s-100s K Bytes ~1 ns - ~10 ns \$1000s/ GByte cache cntl 32-64 bytes Blocks L2 Cache cache cntl 64-128 bytes Blocks Memory OS 4K-8K bytes Pages Disk Files Larger Таре

3) Focus on the Common Case

- · Common sense guides computer design
- Since its engineering, common sense is valuable
- In making a design trade-off, favor the frequent case over the infrequent case
 - E.g., Instruction fetch and decode unit used more frequently than multiplier, so optimize it 1st
 - E.g., If database server has 50 disks / processor, storage dependability dominates system dependability, so optimize it 1st
- Frequent case is often simpler and can be done faster than the infrequent case
 - E.g., overflow is rare when adding 2 numbers, so improve performance by optimizing more common case of no overflow
- May slow down overflow, but overall performance improved by optimizing for the normal case
- What is frequent case and how much performance improved by making case faster => Amdahl's Law

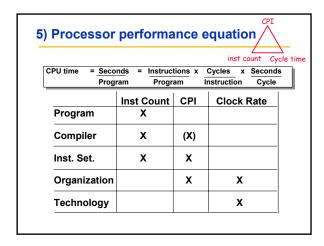


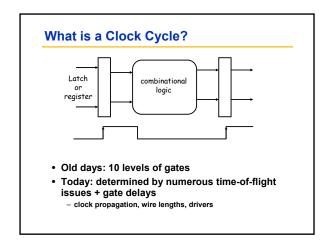
Amdahl's Law example

- New CPU 10X faster
- I/O bound server, so 60% time waiting for I/O

$$Speedup_{overall} = \frac{1}{(1 - Fraction_{enhanced}) + \frac{Fraction_{enhanced}}{Speedup_{enhanced}}}$$
$$= \frac{1}{(1 - 0.4) + \frac{0.4}{10}} = \frac{1}{0.64} = 1.56$$

 Apparently, its human nature to be attracted by 10X faster, vs. keeping in perspective its just 1.6X faster





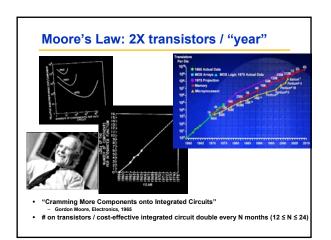
Break

Outline

- Technology Trends: Culture of tracking, anticipating and exploiting advances in technology
- · Careful, quantitative comparisons:
 - 1. Define, quantity, and summarize relative performance

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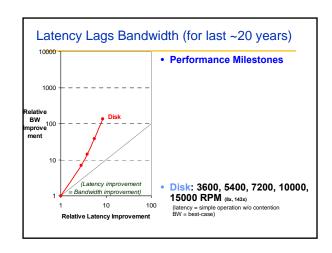
- 2. Define and quantity relative cost
- 3. Define and quantity dependability
- 4. Define and quantity power

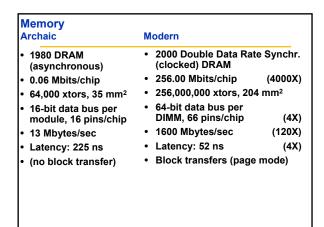


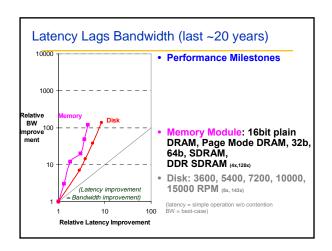
Tracking Technology Performance Trends

- · Drill down into 4 technologies:
 - Disks
 - Memory
 - NetworkProcessors
- Compare ~1980 Archaic vs. ~2000 Modern
- Performance Milestones in each technology
- Compare for Bandwidth vs. Latency improvements in performance over time
- · Bandwidth: number of events per unit time
 - E.g., Mbits / second over network, Mbytes / second from disk
- · Latency: elapsed time for a single event
 - E.g., one-way network delay in microseconds, average disk access time in milliseconds

Archaic	Modern
• CDC Wren I, 1983	• Seagate 373453, 2003
• 3600 RPM	• 15000 RPM (4X
0.03 GBytes capacity	• 73.4 GBytes (2500X
 Tracks/Inch: 800 	 Tracks/Inch: 64000 (80X)
 Bits/Inch: 9550 	• Bits/Inch: 533,000 (60X
Three 5.25" platters	 Four 2.5" platters (in 3.5" form factor)
 Bandwidth: 0.6 MBytes/sec 	Bandwidth: 86 MBytes/sec (140X)
 Latency: 48.3 ms 	• Latency: 5.7 ms (8X
Cache: none	Cache: 8 MBytes

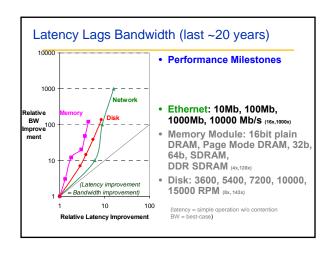




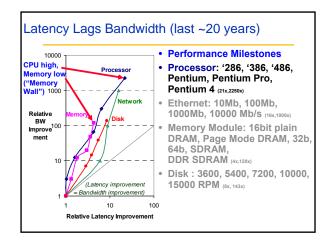


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LANs Archaic Modern • Ethernet 802.3 • Ethernet 802.3ae Year of Standard: 1978 Year of Standard: 2003 10.000 Mbits/s 10 Mbits/s (1000X) link speed link speed · Latency: 3000 μsec Latency: 190 μsec (15X) · Shared media · Switched media · Coaxial cable · Category 5 copper wire "Cat 5" is 4 twisted pairs in bundle Coaxial Cable: Plastic Covering Braided outer conductor / Insulator Copper core Copper, 1mm thick, twisted to avoid antenna effect



CPUs Archaic Modern 2001 Intel Pentium 4 • 1982 Intel 80286 (120X) • 12.5 MHz • 1500 MHz (2250X) 2 MIPS (peak) 4500 MIPS (peak) Latency 320 ns Latency 15 ns (20X) • 134,000 xtors, 47 mm² 42,000,000 xtors, 217 mm² 16-bit data bus, 68 pins 64-bit data bus, 423 pins Microcode interpreter, 3-way superscalar, separate FPU chip Dynamic translate to RISC, Superpipelined (22 stage), (no caches) Out-of-Order execution On-chip 8KB Data caches, 96KB Instr. Trace cache, 256KB L2 cache



Rule of Thumb for Latency Lagging BW

- In the time that bandwidth doubles, latency improves by no more than a factor of 1.2 to 1.4 (and capacity improves faster than bandwidth)
- Stated alternatively:
 Bandwidth improves by more than the square of the improvement in Latency

1. Moore's Law helps BW more than latency Faster transistors, more transistors, more pins help Bandwidth (300X) MPU Transistors: 0.130 vs. 42 M xtors **DRAM Transistors:** 0.064 vs. 256 M xtors (4000X) MPU Pins: 68 vs. 423 pins (6X) **DRAM Pins:** 16 vs. 66 pins (4X) Smaller, faster transistors but communicate over (relatively) longer lines: limits latency » Feature size: 1.5 to 3 vs. 0.18 micron (8X.17X) MPU Die Size: 35 vs. 204 mm² (ratio sqrt ⇒ 2X) DRAM Die Size: 47 vs. 217 mm² (ratio sqrt ⇒ 2X)

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6 Reasons Latency Lags Bandwidth

6 Reasons Latency Lags Bandwidth (cont'd)

2. Distance limits latency

- Size of DRAM block \Rightarrow long bit and word lines ⇒ most of DRAM access time
- Speed of light and computers on network
- 1. & 2. explains linear latency vs. square BW?

3. Bandwidth easier to sell ("bigger=better")

- E.g., 10 Gbits/s Ethernet ("10 Gig") vs. 10 μsec latency Ethernet
- 4400 MB/s DIMM ("PC4400") vs. 50 ns latency
- Even if just marketing, customers now trained
- Since bandwidth sells, more resources thrown at bandwidth, which further tips the balance

6 Reasons Latency Lags Bandwidth (cont'd)

4. Latency helps BW, but not vice versa

- Spinning disk faster improves both bandwidth and rotational latency
 - 3600 RPM ⇒ 15000 RPM = 4.2X
 - Average rotational latency: 8.3 ms \Rightarrow 2.0 ms
 - Things being equal, also helps BW by 4.2X

- Higher linear density helps disk BW (and capacity), but not disk Latency
 - » 9,550 BPI ⇒ 533,000 BPI ⇒ 60X in BW

6 Reasons Latency Lags Bandwidth (cont'd)

5. Bandwidth hurts latency

- Queues help Bandwidth, hurt Latency (Queuing Theory)
- Adding chips to widen a memory module increases Bandwidth but higher fan-out on address lines may increase Latency

6. Operating System overhead hurts Latency more than Bandwidth

Long messages amortize overhead; overhead bigger part of short messages

Summary of Technology Trends

- For disk, LAN, memory, and microprocessor, bandwidth improves by square of latency improvement
 - In the time that bandwidth doubles, latency improves by no more than 1.2X to 1.4X
- Lag probably even larger in real systems, as bandwidth gains multiplied by replicated components
 - Multiple processors in a cluster or even in a chip
 - Multiple disks in a disk array
 - Multiple memory modules in a large memory
- Simultaneous communication in switched LAN
- HW and SW developers should innovate assuming Latency Lags Bandwidth
 - If everything improves at the same rate, then nothing really changes
 - When rates vary, require real innovation

Outline

- Technology Trends: Culture of tracking, anticipating and exploiting advances in technology
- Careful, quantitative comparisons:
 - 1. Define and quantity cost
 - 2. Define and quantity power
 - 3. Define and quantity dependability
 - 4. Define, quantity, and summarize relative performance

Define and quantify cost (1/3)

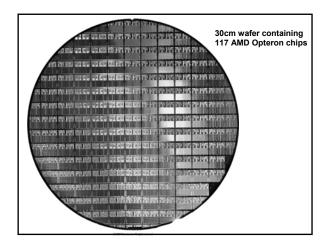
Three factors lower cost:

- 1. Learning curve manufacturing costs decrease over time, measured by change in yield

 - % manufactured devices that survives the testing procedure
- 2. Volume doubling volume cuts cost 10%
 - Decrease time to get down the learning curve
 - Increases purchasing and manufacturing efficiency
 Amortizes development costs over more devices
- 3. Commodities reduce costs by reducing margins
 - Products sold by multiple vendors in large volumes that essentially identical
 - E.g. keyboards, monitors, DRAMs, disks, PCs

Most of computer cost in Integrated Circuits (ICs)

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Define and quantify cost: ICs (2/3)

$$IC cost = \frac{Die cost + Testing cost + Packaging cost}{Final test yiels}$$

$$Die cost = \frac{Wafer cost}{Dies per wafer \times Die yield}$$

Dies per wafer =
$$\frac{\pi \times (\text{Wafer diameter}/2)^2}{\text{Die area}} - \frac{\pi \times \text{Wafer diameter}}{\sqrt{2} \times \text{Die area}}$$

Die yield = Wafer yield
$$\times \left(1 + \frac{\text{Defect density} \times \text{Die area}}{\alpha}\right)^{-\alpha}$$

In 2006: α = 4.0 Defect density = 0.4/cm² 30cm wafer ≈ \$5k–\$6k

For cost effective dies: cost ≈ f(die_area²)

Define and quantify cost: cost vs. price (3/3)

- Margin = price product sells cost to manufacture
- Margins pay for a research and development (R&D), marketing, sales, manufacturing equipment maintenance, building rental, cost of financing, pretax profits, and taxes.
- Most companies spend 4% (commodity PC business) to 12% (high-end server business) of income on R&D, which includes all engineering.

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Define and quantity power (1/2)

 For CMOS chips, traditional dominant energy consumption has been in switching transistors, called dynamic power

 $Power_{\textit{dynamic}} = \frac{1}{2} \times Capacitive Load \times Voltage^2 \times Frequency Switched$

- For mobile devices, energy better metric Energy_{dynamic} = CapacitiveLoad×Voltage²
- For a fixed task, slowing clock rate (frequency switched) reduces power, but not energy
- Capacitive load a function of number of transistors connected to output and technology, which determines capacitance of wires and transistors
- Dropping voltage helps both, so went from 5V to 1V
- To save energy & dynamic power, most CPUs now turn off clock of inactive modules (e.g. Fl. Pt. Unit)

Example of quantifying power

 Suppose 15% reduction in voltage results in a 15% reduction in frequency. What is impact on dynamic power?

Power_{dynamic} = $1/2 \times \text{CapacitiveLoad} \times \text{Voltage}^2 \times \text{FrequencySwitched}$ = $1/2 \times .85 \times \text{CapacitiveLoad} \times (.85 \times \text{Voltage})^2 \times \text{FrequencySwitched}$ = $(.85)^3 \times \text{OldPower}_{dynamic}$ = $0.6 \times \text{OldPower}_{dynamic}$

Define and quantity power (2/2)

• Because leakage current flows even when a transistor is off, now *static power* important too

$$Power_{\mathit{static}} = Current_{\mathit{static}} \times Voltage$$

- Leakage current increases in processors with smaller transistor sizes
- Increasing the number of transistors increases power even if they are turned off
- In 2006, goal for leakage is 25% of total power consumption; high performance designs at 40%
- Very low power systems even gate voltage to inactive modules to control loss due to leakage

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- Review
- Technology Trends: Culture of tracking, anticipating and exploiting advances in technology
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Define and quantity dependability (1/3)

- · How decide when a system is operating properly?
- Infrastructure providers now offer Service Level Agreements (SLA) to guarantee that their networking or power service would be dependable
- Systems alternate between 2 states of service with respect to an SLA:
 - Service accomplishment, where the service is delivered as specified in SLA
 - 2. Service interruption, where the delivered service is different from the SLA
- Failure = transition from state 1 to state 2
- Restoration = transition from state 2 to state 1

Define and quantity dependability (2/3)

- Module reliability = measure of continuous service accomplishment (or time to failure).
 Two metrics:
 - 1. Mean Time To Failure (MTTF) measures Reliability
 - 2. Failures In Time (FIT) = 1/MTTF, the rate of failures
- Mean Time To Repair (MTTR) measures Service Interruption
 - Mean Time Between Failures (MTBF) = MTTF+MTTR
- Module availability measures service as alternate between the 2 states of accomplishment and interruption (number between 0 and 1, e.g. 0.9)
 - Module availability = MTTF / (MTTF + MTTR)

Example calculating reliability

- If modules have exponentially distributed lifetimes (age of module does not affect probability of failure), overall failure rate is the sum of failure rates of the modules
- Calculate FIT and MTTF for 10 disks (1M hour MTTF per disk), 1 disk controller (0.5M hour MTTF), and 1 power supply (0.2M hour MTTF):

FailureRat = $10 \times (1/1,000,000) + 1/500,000 + 1/200,000$

- =(10+2+5)/1,000,000
- =17/1,000,000
- =17,000FIT

MTTF=1,000,000,000/17,000

≈ 59,000hours

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Definition: Performance

- Performance is in units of things per sec
 bigger is better
- If we are primarily concerned with response time

 performance(X) = 1

 execution time(X)
- " X is n times faster than Y" means

 $n = \frac{\text{Performance(X)}}{\text{Performance(Y)}} = \frac{\text{Execution_time(Y)}}{\text{Execution_time(X)}}$

Performance: What to measure?

- · Usually rely on benchmarks vs. real workloads
- To increase predictability, collections of benchmark applications, called benchmark suites, are popular
- · SPECCPU: popular desktop benchmark suite
 - CPU only, split between integer and floating point programs
 - SPECint2000 has 12 integer, SPECfp2000 has 14 integer pgms
 - SPECCPU2006 to be announced Spring 2006
 - SPECSFS (NFS file server) and SPECWeb (WebServer) added as server benchmarks
- Transaction Processing Council measures server performance and cost-performance for databases
 - TPC-C Complex query for Online Transaction Processing
 - TPC-H models ad hoc decision support
 - TPC-W a transactional web benchmark
 - TPC-App application server and web services benchmark

How Summarize Suite Performance (1/5)

- Arithmetic average of execution time of all pgms?

 But they vary by 4X in speed, so some would be more important.
 - But they vary by 4X in speed, so some would be more important than others in arithmetic average
- Could add a weight per program, but how pick a weight?
 - Different companies want different weights for their products
- SPECRatio: Normalize execution times to reference computer, yielding a ratio proportional to

performance =

time on reference computer

time on computer being rated

How Summarize Suite Performance (2/5)

 If program SPECRatio on Computer A is 1.25 times bigger than Computer B, then

$$1.25 = \frac{SPECRatio_{_{A}}}{SPECRatio_{_{B}}} = \frac{ExecutionTime_{_{reference}}}{ExecutionTime_{_{B}}}$$

$$= \frac{ExecutionTime_{_{B}}}{ExecutionTime_{_{B}}} = \frac{Performance_{_{A}}}{Performance_{_{B}}}$$

 Note that when comparing 2 computers as a ratio, execution times on the reference computer drop out, so choice of reference computer is irrelevant

How Summarize Suite Performance (3/5)

 Since ratios, proper mean is geometric mean (SPECRatio unitless, so arithmetic mean meaningless)

$$GeometricMean = \sqrt[n]{\prod_{i=1}^{n} SPECRatio_{i}}$$

- Geometric mean of the ratios is the same as the ratio of the geometric means
- 2. Ratio of geometric means
 - = Geometric mean of performance ratios ⇒ choice of reference computer is irrelevant!

These two points make geometric mean of ratios attractive to summarize performance

How Summarize Suite Performance (4/5)

- Does a single mean well summarize performance of programs in benchmark suite?
- Can decide if mean a good predictor by characterizing variability of distribution using standard deviation
- Like geometric mean, geometric standard deviation is multiplicative rather than arithmetic
- Can simply take the logarithm of SPECRatios, compute the standard mean and standard deviation, and then take the exponent to convert back:

GeometricMean =
$$\exp\left(\frac{1}{n} \times \sum_{i=1}^{n} \ln(SPECRatio_i)\right)$$

 $GeometricStDev = \exp(StDev(\ln(SPECRatio_i)))$

How Summarize Suite Performance (5/5)

- · Standard deviation is more informative if know distribution has a standard form
 - bell-shaped normal distribution, whose data are symmetric around mean
 - lognormal distribution, where logarithms of data not data itself are normally distributed (symmetric) on a logarithmic
- · For a lognormal distribution, we expect that

68% of samples fall in range

 $[mean/gstdev, mean \times gstdev]$

95% of samples fall in range

 $[mean/gstdev^2, mean \times gstdev^2]$

And in conclusion ...

- Computer Architecture >> instruction sets
- Computer Architecture skill sets are different

- 5 Quantitative principles of design Quantitative approach to design Solid interfaces that really work
- Technology tracking and anticipation
- Computer Science at the crossroads from sequential to parallel computing

 - Salvation requires innovation in many fields, including computer architecture
- Tracking and extrapolating technology part of architect's responsibility
- Expect Bandwidth in disks, DRAM, network, and processors to improve by at least as much as the square of the improvement in Latency
- Quantify dynamic and static power
- Capacitance x Voltage² x frequency, Energy vs. power
- Quantify dependability

 Reliability (MTTF, FIT), Availability (99.9...)
- Quantify and summarize performance
- Ratios, Geometric Mean, Multiplicative Standard Deviation

Reading

• This lecture: chapter 1

· Next lecture: appendix A

· Assignment 1: appendix B