# CS 110 Computer Architecture 

## Dependability and RAID

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Slides based on UC Berkley's CS61C

## Review Last Lecture

- I/O gives computers their 5 senses
- I/O speed range is $100-$ million to one
- Polling vs. Interrupts
- DMA to avoid wasting CPU time on data transfers
- Disks for persistent storage, replaced by flash


## Great Idea \#6:

## Dependability via Redundancy

- Redundancy so that a failing piece doesn't make the whole system fail



## Great Idea \#6:

## Dependability via Redundancy

- Applies to everything from datacenters to memory
- Redundant datacenters so that can lose 1 datacenter but Internet service stays online
- Redundant routes so can lose nodes but Internet doesn't fail
- Redundant disks so that can lose 1 disk but not lose data (Redundant Arrays of Independent Disks/RAID)
- Redundant memory bits of so that can lose 1 bit but no data (Error Correcting Code/ECC Memory)



## Dependability

Service accomplishment Service delivered as specified

Restoration


- Fault: failure of a component
- May or may not lead to system failure


## Dependability via Redundancy:

 Time vs. Space- Spatial Redundancy - replicated data or check information or hardware to handle hard and soft (transient) failures
- Temporal Redundancy - redundancy in time (retry) to handle soft (transient) failures


## Dependability Measures

- Reliability: Mean Time To Failure (MTTF)
- Service interruption: Mean Time To Repair (MTTR)
- Mean time between failures (MTBF)
$-\mathrm{MTBF}=\mathrm{MTTF}+\mathrm{MTTR}$
- Availability = MTTF / (MTTF + MTTR)
- Improving Availability
- Increase MTTF: More reliable hardware/software + Fault Tolerance
- Reduce MTTR: improved tools and processes for diagnosis and repair


## Understanding MTTF

## Understanding MTTF



## Availability Measures

- Availability = MTTF / (MTTF + MTTR) as \%
- MTTF, MTBF usually measured in hours
- Since hope rarely down, shorthand is "number of 9s of availability per year"
- 1 nine: $90 \%$ => 36 days of repair/year
- 2 nines: $99 \%=>3.6$ days of repair/year
- 3 nines: $99.9 \%$ => 526 minutes of repair/year
- 4 nines: $99.99 \%$ => 53 minutes of repair/year
- 5 nines: $99.999 \%$ => 5 minutes of repair/year


## Reliability Measures

- Another is average number of failures per year: Annualized Failure Rate (AFR)
- E.g., 1000 disks with 100,000 hour MTTF
-365 days * 24 hours $=8760$ hours
- (1000 disks * 8760 hrs/year) / 100,000 = 87.6 failed disks per year on average
$-87.6 / 1000=8.76 \%$ annual failure rate
- Google’s 2007 study* found that actual AFRs for individual drives ranged from 1.7\% for first year drives to over 8.6\% for three-year old drives
*research.google.com/archive/disk_failures.pdf


## Dependability Design Principle

- Design Principle: No single points of failure - "Chain is only as strong as its weakest link"
- Dependability Corollary of Amdahl's Law
- Doesn't matter how dependable you make one portion of system
- Dependability limited by part you do not improve


## Error Detection/ Correction Codes

- Memory systems generate errors (accidentally flipped-bits)
- DRAMs store very little charge per bit
- "Soft" errors occur occasionally when cells are struck by alpha particles or other environmental upsets
- "Hard" errors can occur when chips permanently fail
- Problem gets worse as memories get denser and larger
- Memories protected against failures with EDC/ECC
- Extra bits are added to each data-word
- Used to detect and/or correct faults in the memory system
- Each data word value mapped to unique code word
- A fault changes valid code word to invalid one, which can be detected


## Block Code Principles

- Hamming distance = difference in \# of bits
- $p=011 \underline{0} 11, q=0 \underline{0} 1111$, Ham. distance $(p, q)=2$
- $p=011011$, $q=110001$, distance $(p, q)=$ ?
- Can think of extra bits as creating a code with the data
- What if minimum distance between members of code is 2 and get a 1-bit error?


## Parity: Simple Error-Detection Coding

- Each data value, before it is written to memory is "tagged" with an extra bit to force the stored word to have even parity:

- Minimum Hamming distance of parity code is 2
- A non-zero parity check indicates an error occurred:
- 2 errors (on different bits) are not detected
- nor any even number of errors, just odd numbers of errors are detected


## Parity Example

- Data 01010101
- 4 ones, even parity now
- Write to memory: 010101010 to keep parity even
- Data 01010111
- 5 ones, odd parity now
- Write to memory: 010101111 to make parity even
- Read from memory 010101010
- 4 ones => even parity, so no error
- Read from memory 110101010
- 5 ones => odd parity, so error
- What if error in parity bit?


## Suppose Want to Correct 1 Error?

- Richard Hamming came up with simple to understand mapping to allow Error Correction at minimum distance of 3
- Single error correction, double error detection
- Called "Hamming ECC"
- Worked weekends on relay computer with unreliable card reader, frustrated with manual restarting
- Got interested in error correction; published 1950
- R. W. Hamming, "Error Detecting and Correcting Codes," The Bell System Technical Journal, Vol. XXVI, No 2 (April 1950) pp 147-160.


## Detecting/Correcting Code Concept

Space of possible bit patterns $\left(2^{N}\right)$


Sparse population of code words ( $2^{\mathrm{M}} \ll 2^{\mathrm{N}}$ )

- with identifiable signature
- Detection: bit pattern fails codeword check
- Correction: map to nearest valid code word


## Hamming Distance: 8 code words



Hamming Distance 2: Detection Detect Single Bit Errors


- No 1 bit error goes to another valid codeword
- $1 / 2$ codewords are valid


## Hamming Distance 3: Correction

Correct Single Bit Errors, Detect Double Bit Errors


- No 2 bit error goes to another valid codeword; 1 bit error near - 1/4 codewords are valid


## Administrivia

- Final Exam
- Tuesday, June 26, 2017, 9:00-11:00
- Location: Teaching Center 301 + 302
- THREE cheat sheets (MT1, MT2, post-MT2)
- Hand-written by you, English, A4
- Project 4 published
- HW 7 published


## Hamming Error Correction Code

- Use of extra parity bits to allow the position identification of a single error

1. Mark all bit positions that are powers of 2 as parity bits (positions 1, 2, 4, 8, 16, ...)

- Start numbering bits at 1 at left (not at 0 on right)

2. All other bit positions are data bits
(positions 3, 5, 6, 7, 9, 10, 11, 12, 13, 14, 15, ...)
3. Each data bit is covered by 2 or more parity bits

## Hamming ECC

4. The position of parity bit determines sequence of data bits that it checks

- Bit $1\left(0001_{2}\right)$ : checks bits ( $1,3,5,7,9,11, \ldots$ )
- Bits with least significant bit of address $=1$
- Bit $2\left(0010_{2}\right)$ : checks bits ( $2,3,6,7,10,11,14,15, \ldots$ ) - Bits with $2^{\text {nd }}$ least significant bit of address $=1$
- Bit $4\left(0100_{2}\right)$ : checks bits ( $4-7,12-15,20-23, \ldots$ ) - Bits with $3^{\text {rd }}$ least significant bit of address $=1$
- Bit $8\left(1000_{2}\right)$ : checks bits ( $8-15,24-31,40-47, \ldots$ )
- Bits with $4^{\text {th }}$ least significant bit of address $=1$


## Graphic of Hamming Code

| Bit position |  | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |  | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Encoded data bits |  | p1 | p2 | d1 | p4 | d2 | d3 | d4 | p |  | 5 | d6 | d7 | d8 | d9 | d10 |  |
| Parity bit coverage | p1 | X |  | X |  | X |  | X |  |  | x |  | X |  | X |  |  |
|  | p2 |  | X | X |  |  | $x$ | x |  |  |  | X | X |  |  | x |  |
|  | p4 |  |  |  | X | X | X | x |  |  |  |  |  | x | x | x |  |
|  | p8 |  |  |  |  |  |  |  |  |  | X | X | X | X | X | X |  |

- http://en.wikipedia.org/wiki/Hamming code


## Hamming ECC

5. Set parity bits to create even parity for each group

- A byte of data: 10011010
- Create the coded word, leaving spaces for the parity bits:
-__1_001_1010
000000000111
123456789012
- Calculate the parity bits


## Hamming ECC

- Position 1 checks bits 1,3,5,7,9,11 (bold): ? _ 1_001_1010. set position 1 to a _: __1_001_1010
- Position 2 checks bits 2,3,6,7,10,11 (bold): 0 ? 1_001_1010. set position 2 to a _: $0 \_1 \_001 \_1010$
- Position 4 checks bits 4,5,6,7,12 (bold): 011 ? 001 _ 1010 . set position 4 to a _: 011 _001_1010
- Position 8 checks bits $8,9,10,11,12$ :

0111001 ? 1010 . set position 8 to a _:
0111001 _ 1010

## Hamming ECC

- Position 1 checks bits 1,3,5,7,9,11:

$$
\begin{aligned}
& \text { ? _1_001_1010. set position } 1 \text { to a } 0 \text { : } \\
& 0_{-1}^{-1} 001 \text { _ } 1010
\end{aligned}
$$

- Position 2 checks bits 2,3,6,7,10,11:

0 ? 1_001_1010. set position 2 to a 1:
011 _ 001 _1 1010

- Position 4 checks bits $4,5,6,7,12$ :

011 ? 001 _ 1010 . set position 4 to a 1:
0111001 _ 1010

- Position 8 checks bits $8,9,10,11,12$ :

0111001 ? 1010 . set position 8 to a 0:
011100101010

## Hamming ECC

- Final code word: $\underline{011100101010}$
- Data word: 10011010


## Hamming ECC Error Check

- Suppose receive 011100101110

$$
\begin{array}{llllllllllll} 
& 0 & 1 & 1 & 1 & 0 & 0 & 1 & 0 & 1 & 1 & 1
\end{array} 0
$$

Bit position bits
px pe dx pf de dx dy ps dy de dy dB da d10 d11


## Hamming ECC Error Check

- Suppose receive 011100101110


## Hamming ECC Error Check

- Suppose receive

$$
\begin{aligned}
& \text { 011100101110 } \\
& \begin{array}{lllllll}
0 & 1 & 0 & 1 & 1 & 1 & V
\end{array} \\
& \begin{array}{llll}
11 & 01 & 11 & \mathrm{X} \text {-Parity } 2
\end{array} \text { in error } \\
& 10010 \text { V } \\
& 01110 \text { X-Parity } 8 \text { in error }
\end{aligned}
$$

- Implies position 8+2=10 is in error

011100101110

## Hamming ECC Error Correct

- Flip the incorrect bit ... 011100101010


## Hamming ECC Error Correct

- Suppose receive

$$
\begin{array}{rrrr}
\underline{01} 1100101010 \\
\underline{0} 1 & 0 & 1 & 1 \\
\underline{1} 1 & 01 & 01 & \sqrt{ } \\
\underline{1} 001 & 0 & V \\
& \underline{V} 1010 & \sqrt{ }
\end{array}
$$

## Hamming Error Correcting Code

- Overhead involved in single error-correction code
- Let $p$ be total number of parity bits and $d$ number of data bits in $p+d$ bit word
- If $p$ error correction bits are to point to error bit ( $p+d$ cases) + indicate that no error exists (1 case), we need:

$$
2^{p}>=p+d+1
$$

thus $p>=\log (p+d+1)$
for large $d, p$ approaches $\log (d)$

- 8 bits data $=>d=8,2^{p}=p+8+1=>p=4$
- 16 data => 5 parity,

32 data $=>6$ parity, 64 data $=>7$ parity

## Hamming Single-Error Correction, Double-Error Detection (SEC/DED)

- Adding extra parity bit covering the entire word provides double error detection as well as single error correction
$\begin{array}{llllllll}1 & 2 & 3 & 4 & 5 & 6 & 7 & 8\end{array}$
$\begin{array}{llllllll}p_{1} & p_{2} & d_{1} & p_{3} & d_{2} & d_{3} & d_{4} & p_{4}\end{array}$
- Hamming parity bits $H$ ( $p_{1} p_{2} p_{3}$ ) are computed (even parity as usual) plus the even parity over the entire word, $p_{4}$ :
$H=0 p_{4}=0$, no error
$H \neq 0 p_{4}=1$, correctable single error (odd parity if 1 error =>
$\mathrm{p}_{4}=1$ )
$H \neq 0 p_{4}=0$, double error occurred (even parity if 2 errors=>
n-nl
Typical modern codes in DRAM memory systems: 64-bit data blocks ( 8 bytes) with 72-bit code words ( 9 bytes).

Hamming Single $\quad$ Hamming Distance $=4$ Error Correction + Double Error Detection


## What if More Than 2-Bit Errors?

- Network transmissions, disks, distributed storage common failure mode is bursts of bit errors, not just one or two bit errors
- Contiguous sequence of $B$ bits in which first, last and any number of intermediate bits are in error
- Caused by impulse noise or by fading in wireless
- Effect is greater at higher data rates


## Cyclic Redundancy Check

Simple example: Parity Check Block

| Data | 10011010 |  | 10011010 |
| :---: | :---: | :---: | :---: |
|  | 01101100 |  | 01101100 |
|  | 11110000 |  | 11110000 |
|  | ---00101101- | --------- | -00000000 |
|  | 11011100 |  | 11011100 |
|  | 00111100 |  | 00111100 |
|  | 11111100 |  | 11111100 |
| $\downarrow$ | 00001100 |  | 00001100 |
|  | $\downarrow \downarrow$ 仡 |  |  |
| Check | k 00111011 |  | 00111011 |
|  | 00000000 | 0 = Check! | 00101101 |

## Cyclic Redundancy Check

- Parity codes not powerful enough to detect long runs of errors (also known as burst errors)
- Better Alternative: Reed-Solomon Codes
- Used widely in CDs, DVDs, Magnetic Disks
- RS $(255,223)$ with 8-bit symbols: each codeword contains 255 code word bytes ( 223 bytes are data and 32 bytes are parity)

- For this code: $\mathrm{n}=255, \mathrm{k}=223, \mathrm{~s}=8,2 \mathrm{t}=32, \mathrm{t}=16$
- Decoder can correct any errors in up to 16 bytes anywhere in the codeword


## Cyclic Redundancy Check

```
    14 data bits 3 check bits 17 bits total
11010011101100 000 <--- input right padded by 3 bits
1011 <--- divisor
01100011101100 000 <--- result
    1011 <--- divisor
00111011101100 000
    1 0 1 1
00010111101100 000
    1 0 1 1
00000001101100 000 <--- skip leading zeros
    1 0 1 1
00000000110100 000
    1 0 1 1
00000000011000 000
    1011
00000000001110 000
    1 0 1 1
00000000000101 000
    101 1
00000000000000 100 <--- remainder
```

3 bit CRC using the polynomial $x^{3}+x+1$
(divide by 1011 to get remainder)

## Cyclic Redundancy Check

- For block of $k$ bits, transmitter generates an $n-k$ bit frame check sequence
- Transmits $n$ bits exactly divisible by some number
- Receiver divides frame by that number
- If no remainder, assume no error
- Easy to calculate division for some binary numbers with shift register
- Disks detect and correct blocks of 512 bytes with called Reed Solomon codes $\approx$ CRC


## (In More Depth: Code Types)

- Linear Codes:

Code is generated by G and in null-space of H

- Hamming Codes: Design the H matrix
$-\mathrm{d}=3 \Rightarrow$ Columns nonzero, Distinct
- $d=4 \Rightarrow$ Columns nonzero, Distinct, Odd-weight
- Reed-solomon codes:
- Based on polynomials in GF(2) (I.e. k-bit symbols)
- Data as coefficients, code space as values of polynomial:
- $P(x)=a_{0}+a_{1} x^{1}+\ldots a_{k-1} x^{k-1}$
- Coded: P(0),P(1),P(2)....,P(n-1)
- Can recover polynomial as long as get any $k$ of $n$
- Alternatively: as long as no more than n-k coded symbols erased, can recover data.
- Side note: Multiplication by constant in GF( $2^{\mathrm{k}}$ ) can be represented by k×k matrix: a•x
- Decompose unknown vector into $k$ bits: $x=x_{0}+2 x_{1}+\ldots+2^{k-1} x_{k-1}$
- Each column is result of multiplying a by $2^{i}$


## Hamming ECC on your own

- Test if these Hamming-code words are correct. If one is incorrect, indicate the correct code word. Also, indicate what the original data was.
- 110101100011
- 111110001100
- 000010001010


## Evolution of the Disk Drive




IBM RAMAC 305, 1956

IBM 3390K, 1986


Apple SCSI, 1986

## Arrays of Small Disks

Can smaller disks be used to close gap in performance between disks and CPUs?

Conventional:
4 disk designs $\leftrightarrows$

$$
3.5^{\prime \prime} \quad 5.25^{\prime \prime}
$$



## Low End $\longrightarrow$ High End

Disk Array:
1 disk design
$3.5^{\prime \prime}$


Replace Small Number of Large Disks with Large Number of Small Disks! (1988 Disks)

|  | IBM 3390K | IBM 3.5" 0061 | x70 |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Capacity | 20 GBytes | 320 MBytes | 23 GBytes |  |
| Volume | $97 \mathrm{cu} . \mathrm{ft}$. | $0.1 \mathrm{cu} . \mathrm{ft}$. | $11 \mathrm{cu} . \mathrm{ft}$. | 9 x |
| Power | 3 KW | 11 W | 1 KW | 3 x |
| Data Rate | $15 \mathrm{MB} / \mathrm{s}$ | $1.5 \mathrm{MB} / \mathrm{s}$ | $120 \mathrm{MB} / \mathrm{s}$ | 8 x |
| I/O Rate | $600 \mathrm{I} / \mathrm{Os} / \mathrm{s}$ | $55 \mathrm{I} / \mathrm{Os} / \mathrm{s}$ | $3900 \mathrm{IOs} / \mathrm{s}$ | 6 X |
| MTTF | 250 KHrs | 50 KHrs | ??? Hrs |  |
| Cost | $\$ 250 \mathrm{~K}$ | $\$ 2 \mathrm{~K}$ | \$150K |  |

Disk Arrays have potential for large data and I/O rates, high MB per cu. ft., high MB per KW, but what about reliability?

## RAID: Redundant Arrays of (Inexpensive) Disks

- Files are "striped" across multiple disks
- Redundancy yields high data availability
- Availability: service still provided to user, even if some components failed
- Disks will still fail
- Contents reconstructed from data redundantly stored in the array
=> Capacity penalty to store redundant info
=> Bandwidth penalty to update redundant info


## Redundant Arrays of Inexpensive Disks RAID 1: Disk Mirroring/Shadowing



- Each disk is fully duplicated onto its "mirror"

Very high availability can be achieved

- Bandwidth sacrifice on write:

Logical write = two physical writes
Reads may be optimized

- Most expensive solution: $100 \%$ capacity overhead


## Redundant Array of Inexpensive Disks

 RAID 3: Parjty Disk| 10010011 |
| :--- |
| 11001101 |
| 10010011 |
| $\ldots$ |

logical record

Striped physical records

P contains sum of other disks per stripe mod 2 ("parity")
If disk fails, subtract
$P$ from sum of other
disks to find missing information

Redundant Arrays of Inexpensive Disks RAID 4: High I/O Rate Parity


## Inspiration for RAID 5

- RAID 4 works well for small reads
- Small writes (write to one disk):
- Option 1: read other data disks, create new sum and write to Parity Disk
- Option 2: since P has old sum, compare old data to new data, add the difference to $P$
- Small writes are limited by Parity Disk: Write to D0, D5 both also write to P disk



## RAID 5: High I/O Rate Interleaved Parity



## Problems of Disk Arrays: Small Writes

RAID-5: Small Write Algorithm
1 Logical Write = 2 Physical Reads $\mathbf{+ 2}$ Physical Writes


## And, in Conclusion, ...

- Great Idea: Redundancy to Get Dependability
- Spatial (extra hardware) and Temporal (retry if error)
- Reliability: MTTF \& Annualized Failure Rate (AFR)
- Availability: \% uptime (MTTF-MTTR/MTTF)
- Memory
- Hamming distance 2: Parity for Single Error Detect
- Hamming distance 3: Single Error Correction Code + encode bit position of error
- Treat disks like memory, except you know when a disk has failed-erasure makes parity an Error Correcting Code
- RAID-2, $-3,-4,-5$ : Interleaved data and parity

