

## ESE532: System-on-a-Chip Architecture

Day 27: December 4, 2019  
Defect Tolerance



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## Today

- Reliability Challenges
- Defect Tolerance
  - Memories
  - Interconnect
  - FPGA
- FPGA Variation and Energy
  - (time permitting)

2

## Message

- At small feature sizes, not viable to demand perfect fabrication of billions of transistors on a chip
- Modern ICs are like snowflakes
  - Everyone is different, changes over time
- Reconfiguration allows repair
  - Finer grain → higher defect rates
  - Tolerate variation → lower energy

3

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## Intel Xeon Phi Offerings

Part #	Cores
7290F	72
7250F	68
7230F	64

<http://www.intel.com/content/www/us/en/products/processors/xeon-phi/xeon-phi-processors.html>

4

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## Intel Xeon Phi Offerings

Part #	Cores
7290F	72
7250F	68
7230F	64

Is Intel producing 3 separate chips?

5

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## Preclass 1 and Intel Xeon Phi Offerings

Part #	Cores
7290F	72
7250F	68
7230F	64

Cost ratio between 72 and 64 processor  
assuming fixed mm<sup>2</sup> per core?

6

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## Intel Xeon Phi Pricing

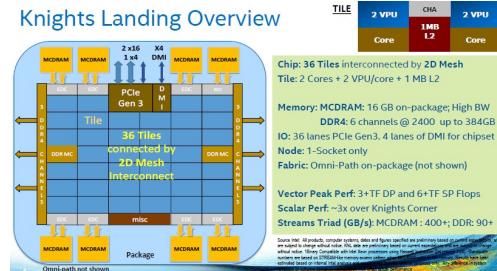
CHOOSE YOUR OPTIMIZATION POINT							
	CORES	GHZ	MEMORY	FABRIC	DDR4	POWER <sup>2</sup>	RECOMMENDED CUSTOMER PRICING
7290 <sup>1</sup> Best Performance/Node	72	1.5	16GB 7.2 GT/s	Yes	384GB 2400 MHz	245W	\$6254
7250 Best Performance/Watt	68	1.4	16GB 7.2 GT/s	Yes	384GB 2400 MHz	215W	\$4876
7230 Best Memory Bandwidth/Core	64	1.3	16GB 7.2 GT/s	Yes	384GB 2400 MHz	215W	\$3710
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7

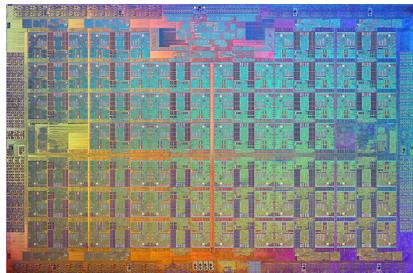
## Intel Knights Landing

### Knights Landing Overview



https://www.nextplatform.com/2016/06/20/intel-knights-landing-yields-big-bang-buck-jump/  
[Intel, Micro 2016]

## Knights Landing Xeon Phi



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[Intel, Micro 2016]

9

## What's happening?

- Fabricated chip has 76 cores
- Not expect all to work
- Selling based on functional cores
  - 72, 68, 64
- Charge premium for high core counts
  - Don't yield as often, people pay more
- **Do see design to accommodate defects**

https://www.nextplatform.com/2016/08/22/intel-tweaking-xeon-phi-deep-learning/

[Intel, Micro 2016]

10

## Warmup Discussion

- Where else do we guard against defects today?
  - Where do we accept imperfection today?

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11

## Motivation: Probabilities

- Given:
  - N objects
  - $P_g$  yield probability
- **What's the probability for yield of composite system of N items? [Preclass 2]**
  - Assume iid (independent, identically distributed) faults
  - $P(N \text{ items good}) = (P_g)^N$

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12

## Probabilities

- $P_{\text{all\_good}}(N) = (P_g)^N$

- $P=0.999999$

N	$P_{\text{all\_good}}(N)$
$10^4$	
$10^5$	
$10^6$	
$10^7$	

13

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## Probabilities

- $P_{\text{all\_good}}(N) = (P_g)^N$

- $P=0.999999$

N	$P_{\text{all\_good}}(N)$
$10^4$	0.99
$10^5$	0.90
$10^6$	0.37
$10^7$	0.000045

14

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## Simple Implications

- As N gets large

- must either increase reliability
- ...or start tolerating failures

- N

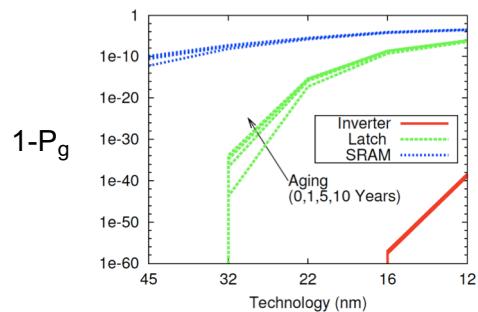
- memory bits
- disk sectors
- wires
- transmitted data bits
- processors
- transistors
- molecules

As devices get **smaller**, failure rates increase  
chemists think  $P=0.95$  is good  
As devices get **faster**, failure rate increases

15

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## Failure Rate Increases



[Nassif / DATE 2010]

16

## Quality Required for Perfection?

- How high must  $P_g$  be to achieve 90% yield on a collection of  $10^{11}$  devices?

[preclass 4]

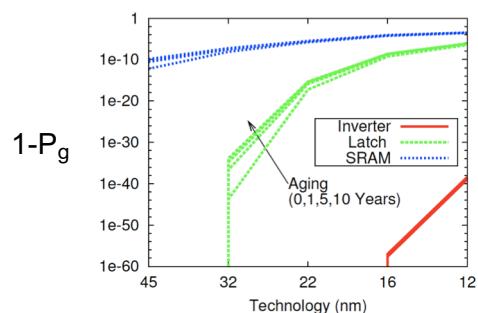
$$(P_g)^{10^{11}} > 0.9$$

$$P_g > 1 - 10^{-12}$$

17

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## Failure Rate Increases

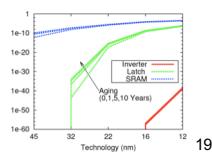


[Nassif / DATE 2010]

18

## Challenge

- Feature size scales down ( $S$ )
- Capacity (area)  $\rightarrow$  increases ( $1/S^2$ )
  - $N$  increase
- Reliability per device goes down
  - $P_g$  decrease
- $P(N \text{ items good}) = (P_g)^N$



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## Defining Problems

20

## Three Problems

1. **Defects:** Manufacturing imperfection
  - Occur before operation; persistent
    - Shorts, breaks, bad contact
2. **Transient Faults:**
  - Occur during operation; transient
    - node X value flips: crosstalk, ionizing particles, bad timing, tunneling, thermal noise
3. **Lifetime “wear” defects**
  - Parts become bad during operational lifetime
    - Fatigue, electromigration, burnout....
    - ...slower
    - NBTI, Hot Carrier Injection

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21

## In a Nut-shell...

Shekhar Bokar  
Intel Fellow  
Micro37 (Dec.2004)



- 100 BT integration capacity
- 20 BT unusable (variations)
- 10 BT will fail over time
- Intermittent failures

Yet, deliver high performance in the power & cost envelope

44

## First Step to Recover

Admit you have a problem  
(observe that there is a failure)

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23

## Detection

- How do we determine if something wrong?
  - Some things easy
    - ....won't start
  - Others tricky
    - ...one **and** gate computes False & True  $\rightarrow$  True
- Observability
  - can see effect of problem
  - some way of telling if defect/fault present

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24

## Detection

- Coding
  - space of legal values << space of all values
  - should only see legal
  - e.g. parity, ECC (Error Correcting Codes)
- Explicit test (defects, recurring faults)
  - ATPG = Automatic Test Pattern Generation
  - Signature/BIST=Built-In Self-Test
  - POST = Power On Self-Test
- Direct/special access
  - test ports, scan paths

25

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## Coping with defects/faults?

- **Key idea:** **redundancy**
- Detection:
  - Use redundancy to detect error
- Mitigating: use redundant hardware
  - Use spare elements in place of faulty elements (defects)
  - Compute multiple times so can discard faulty result (faults)

26

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## Defect Tolerance

27

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## Three Problems

1. **Defects:** Manufacturing imperfection
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28

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## Two Models

- Disk Drives (defect map)
- Memory Chips (perfect chip)

29

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## Disk Drives

- Expose defects to software
  - software model expects defects
    - Create table of good (bad) sectors
  - manages by masking out in software
    - (at the OS level)
    - Never allocate a bad sector to a task or file
  - yielded capacity varies

30

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## Memory Chips

- Provide model in **hardware** of perfect chip
- Model of perfect memory at capacity X
- Use redundancy in hardware to provide perfect model
- Yielded capacity fixed
  - discard part if not achieve

31

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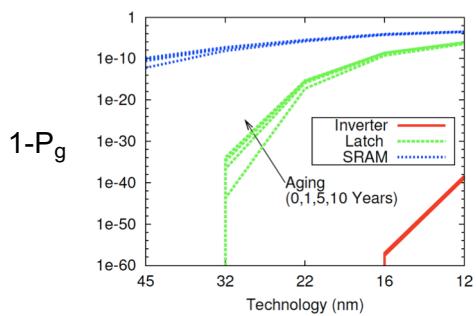
## Example: Memory

- Correct memory:
  - N slots
  - each slot reliably stores last value written
- Millions, billions, etc. of bits...
  - have to get them all right?

32

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## Failure Rate Increases



[Nassif / DATE 2010]

33

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## Memory Defect Tolerance

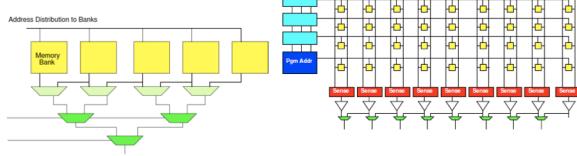
- Idea:
  - few bits may fail
  - provide more raw bits
  - configure so yield what looks like a perfect memory of specified size

34

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## Memory Techniques

- Row Redundancy
- Column Redundancy
- Bank Redundancy



35

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## Yield M of N

- Preclass 5: Probability of yielding 3 of 5 things?
  - Symbolic?
  - Numerical for  $P_g=0.9$ ?

36

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## Yield M of N

- $P(M \text{ of } N) = P(\text{yield } N)$
- +  $(N \text{ choose } N-1) P(\text{exactly } N-1)$
- +  $(N \text{ choose } N-2) P(\text{exactly } N-2) \dots$
- +  $(N \text{ choose } N-M) P(\text{exactly } N-M) \dots$
- [think binomial coefficients]

37

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## M of 5 example

$$\begin{aligned} & 1^*P^5 + 5^*P^4(1-P)^1 + 10P^3(1-P)^2 + 10P^2(1-P)^3 + 5P^1(1-P)^4 + 1^*(1-P)^5 \end{aligned}$$

- Consider  $P=0.9$

$- 1^*P^5$	0.59	$M=5 \quad P(\text{sys})=0.59$
$- 5^*P^4(1-P)^1$	0.33	$M=4 \quad P(\text{sys})=0.92$
$- 10P^3(1-P)^2$	0.07	$M=3 \quad P(\text{sys})=0.99$
$- 10P^2(1-P)^3$	0.008	Can achieve higher system yield than individual components!
$- 5P^1(1-P)^4$	0.00045	
$- 1^*(1-P)^5$	0.00001	

38

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## Possible Yield of 76 cores@ P=0.9

Processors	Yield	Prob Exact	Prob at least
	76	0.001	0.001
	75	0.004	0.005
	74	0.016	0.020
	73	0.041	0.061
	72	0.079	0.140
	71	0.119	0.259
	70	0.148	0.407
	69	0.156	0.562
	68	0.141	0.704
	67	0.112	0.816
	66	0.079	0.895
	65	0.050	0.945
	64	0.028	0.973

39

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## Possible Yield of 76 cores@ P=0.9

Processors	Yield	Prob at least
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	68	0.704
	67	0.816
	66	0.895
	65	0.945
	64	0.973

Out of 100 chips,  
how many?

Sell with 72:  
Sell with 68:  
Sell with 64:  
Discard:

40

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## Intel Xeon Phi Pricing

CHOOSE YOUR OPTIMIZATION POINT							
	CORES	GHZ	MEMORY	FABRIC	DORA	POWER <sup>1</sup>	RECOMMENDED CUSTOMER PRICING
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<b>7210</b> Best Value	64	1.3	16GB 6.4 GT/s	Yes	384GB 2133 MHz	215W	\$2438

Available beginning in September. <sup>1</sup>Plus 15% for integrated fabric.

Pricing shown is for parts without integrated fabric. All additional \$275 for integrated fabric versions of these parts. Integrated fabric parts available in October.

41

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## Repairable Area

- Not all area in a RAM is repairable
  - memory bits spare-able
  - io, power, ground, control not redundant

42

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## Repairable Area

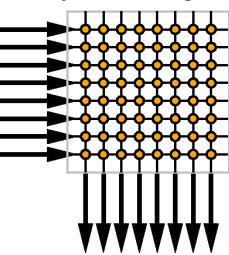
- $P(\text{yield}) = P(\text{non-repair}) * P(\text{repair})$
- $P(\text{non-repair}) = P^{\text{Nnr}}$ 
  - $N_{\text{nr}} << N_{\text{total}}$
  - $P > P_{\text{repair}}$ 
    - e.g. use coarser feature size
    - Differential reliability
- $P(\text{repair}) \sim P(\text{yield M of N})$

43

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## Consider a Crossbar

- Allows us to connect any of  $N$  things to each other
  - E.g.
    - $N$  processors
    - $N$  memories
    - $N/2$  processors +  $N/2$  memories

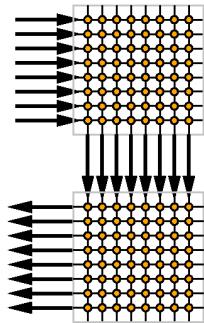


44

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## Crossbar Buses and Defects

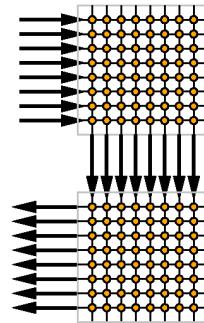
- Two crossbar multibus
- Wires may fail
- Switches may fail
- How tolerate
  - Wire failures between crossbars?
  - Switch failures?



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## Crossbar Buses and Defects

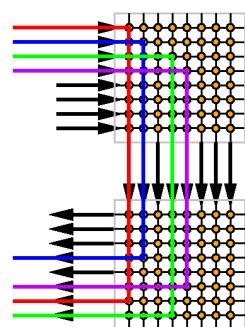
- Two crossbars
- Wires may fail
- Switches may fail
- Provide more wires
  - Any wire fault avoidable
    - $M \text{ choose } N$



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## Crossbar Buses and Defects

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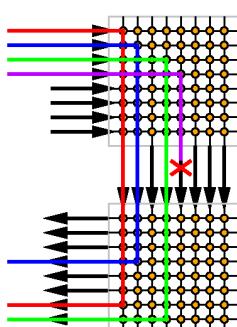


47

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## Crossbar Buses and Faults

- Two crossbars
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- Switches may fail
- Provide more wires
  - Any wire fault avoidable
    - $M \text{ choose } N$

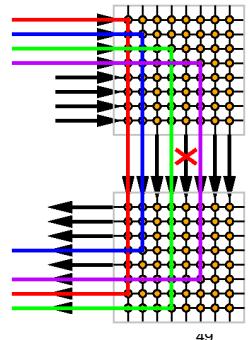


48

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## Crossbar Buses and Faults

- Two crossbars
- Wires may fail
- Switches may fail
- Provide more wires
  - Any wire fault avoidable
    - M choose N
    - Same idea

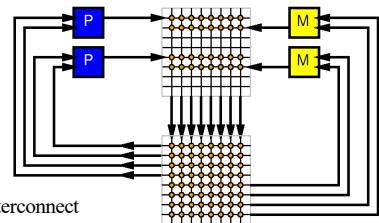


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49

## Simple System

- P Processors
- M Memories
- Wires

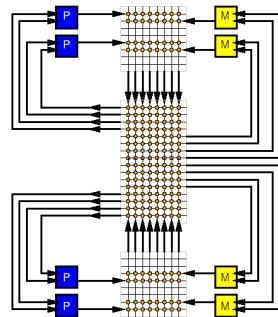


Memory, Compute, Interconnect

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## Simple System w/ Spares

- P Processors
- M Memories
- Wires
- Provide spare
  - Processors
  - Memories
  - Wires

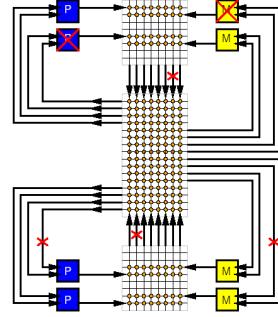


51

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## Simple System w/ Defects

- P Processors
- M Memories
- Wires
- Provide spare
  - Processors
  - Memories
  - Wires
- ...and defects

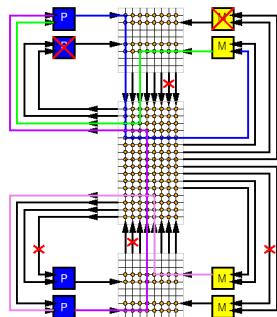


52

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## Simple System Repaired

- P Processors
- M Memories
- Wires
- Provide spare
  - Processors
  - Memories
  - Wires
- Use crossbar to switch together good processor and memories

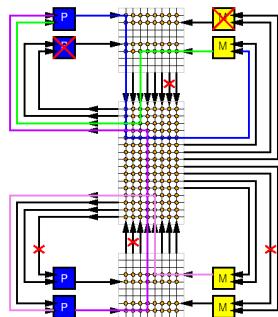


53

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## Simple System Repaired

- What are the costs?
  - Area
  - Energy
  - Delay

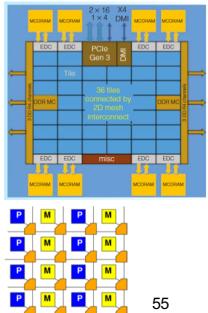


54

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## In Practice

- Crossbars are inefficient
- Use switching networks with
  - Locality
  - Segmentation
- ...but basic idea for sparing is the same



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## FPGAs

56

## Modern FPGA

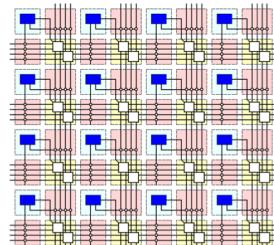
- Has 10,000 to millions of LUTs
- Hundreds to thousands of
  - Memory banks
  - Multipliers
- Reconfigurable interconnect

57

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## ZU3EG (Ultra96)

- 6-LUTs: 70,560
- DSP Blocks: 360
  - 18x27 multiply
  - 48b accumulate
- BRAMs: 216
  - 36Kb
  - Dual port
  - Up to 72b wide (512x72)



58

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## Modern FPGA

- Has 10,000 to millions of gates
  - Hundreds to thousands of
    - Memory banks
    - Multipliers
  - Reconfigurable interconnect
- 
- If a few resources don't work
    - avoid them

59

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## Granularity

- Consider two cases
  - Knight's Bridge with 76 64b processors
  - FPGA with 1 Million 6-LUTs
- 10 defects (bad transistors)
- How much capacity lost?
  - Knight's Bridge?
  - 1M 6-LUT FPGA?

60

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## Observe

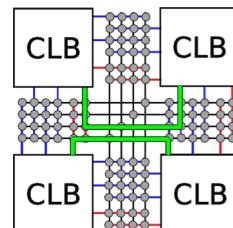
- Finer granularity sparing
  - Lose fewer resources per defect
    - Losing processor vs. losing 6-LUT
    - Losing memory row vs. losing entire memory bank
  - Pay more for reconfiguration
- Finer grained designs
  - Tolerate higher defect rates

61

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## Interconnect Defects

- Route around interconnect defects

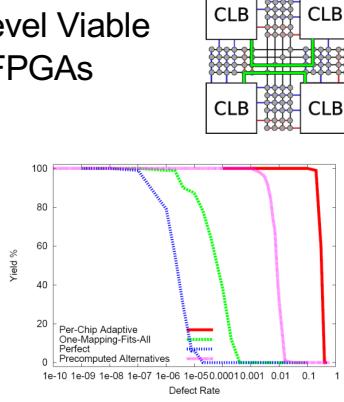


62

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## Defect-Level Viable with FPGAs

- Fine-grained repair
- Avoiding routing defects
  - Tolerates >20% switch defects



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## FPGAs Variation and Energy

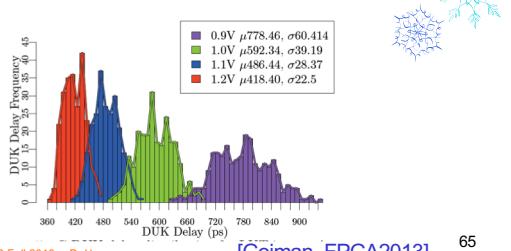
(if time permits)

64

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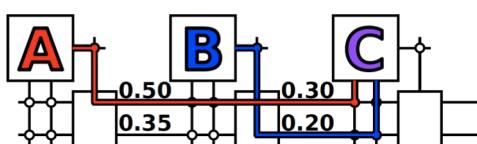
## Variation

- Modern ICs are like Snowflakes
  - Each one is different



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## Variation Challenge

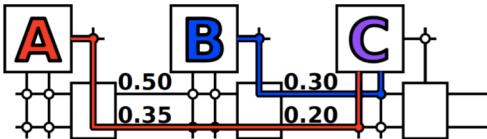


- Use of high  $V_{th}$  resource forces high supply voltage ( $V_{dd}$ ) to meet timing requirement
- Delay:  $CV/I$  and  $I$  goes as  $(V_{dd}-V_{th})^2$

66

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## Component-Specific



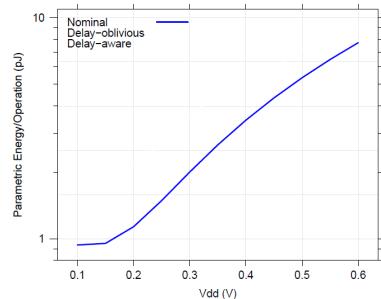
- Use defect idea to avoid high  $V_{th}$  resource
- Allow lower supply voltage ( $V_{dd}$ ) to meet timing requirement
- Delay:  $CV/I$  and  $I$  goes as  $(V_{dd}-V_{th})^2$

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67

## Energy vs $V_{dd}$

- Nominal uses minimum size

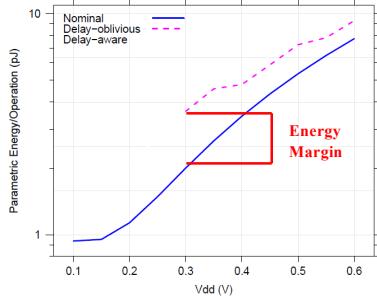


[Mehta, FPGA 2012]

68

## Energy vs $V_{dd}$ (des)

- Nominal uses minimum size
- Oblivious must use larger
  - Higher C, Area



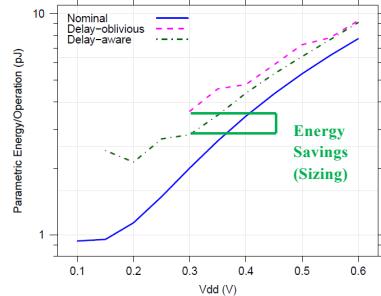
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[Mehta, FPGA 2012]

## Energy vs $V_{dd}$ (des)

- Nominal uses minimum size
- Oblivious must use larger
  - Higher C, Area
- Delay-aware routing reduces energy margins

### 1. Smaller sizes

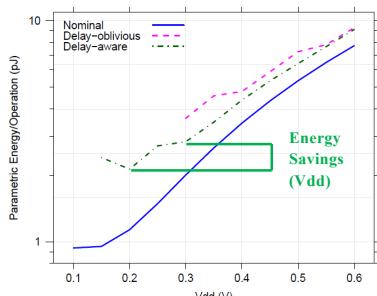


[Mehta, FPGA 2012]

70

## Energy vs $V_{dd}$ (des)

- Nominal uses minimum size
- Delay-aware routing reduces energy margins
  1. Smaller sizes
  2. Lower voltages

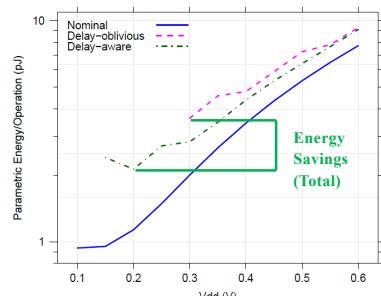


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[Mehta, FPGA 2012]

## Energy vs $V_{dd}$ (des)

- Nominal uses minimum size
- Delay-aware routing reduces energy margins
  1. Smaller sizes
  2. Lower voltages
  3. Less Leakage



[Mehta, FPGA 2012]

72

## Big Ideas

- At small feature sizes, not viable to demand perfect fabrication of billions of transistors on a chip
- Modern ICs are like snowflakes
  - Everyone is different, changes over time
- Reconfiguration allows repair
  - Finer grain → higher defect rates
  - Tolerate variation → lower energy

73

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## Admin

- Project due Friday
  - Reminder turnin
    - Report
    - Code
    - Binaries: Bitstream, elf, decoder
- Wrapup lecture on Monday by Eric
  - This was last lecture from André
  - Plan to return boards, cables, cards
  - Watch piazza for more details

74

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