

# Design for Yield Using Statistical Design

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**PASEMI**  
Power to Perform™

# Outline

- **About P.A.Semi**
- **Process Variability**
- **Statistical Models**
- **Circuit Examples**
- **Statistical Timing**
- **PVT Margin**
- **Test Structures**
- **CAD Challenges**
- **Summary**

# About P.A. Semi

- **Santa Clara-based fabless processor company**
  - **Power Architecture™ Licensee**
    - **Design our own Power Architecture processors**
    - **Only 3<sup>rd</sup> company after IBM and Freescale**
  - **Noted industry veterans combine in 150-strong organization**
  - **Venture backed by Bessemer, Venrock, and Highland Capital**
  - **Currently engaged with over 100 customers across different market segments**
- **Strategically partnered with IBM**
- **Breakthrough processor solution focused on low power @ high performance**
  - **Scalable 64-Bit Power multicore architecture**
  - **Redefines high performance (2GHz) at ultra low power (4W)**
  - **39 patents filed and 11 more patents in progress towards filing**

# Target Markets



Compute Server Blades



Digital Entertainment



Embedded Boards

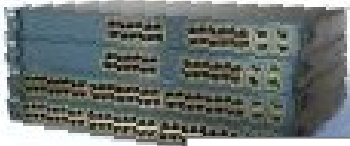


Routers



Game Players

**Critical Requirements**  
Power Efficiency  
High Performance  
Cost Efficiency  
Throughput Efficiency  
Open source OS/Tools etc



Switches

Imaging Systems



Storage Systems



Wireless Basestations



# The Challenge

**Power  
Management**



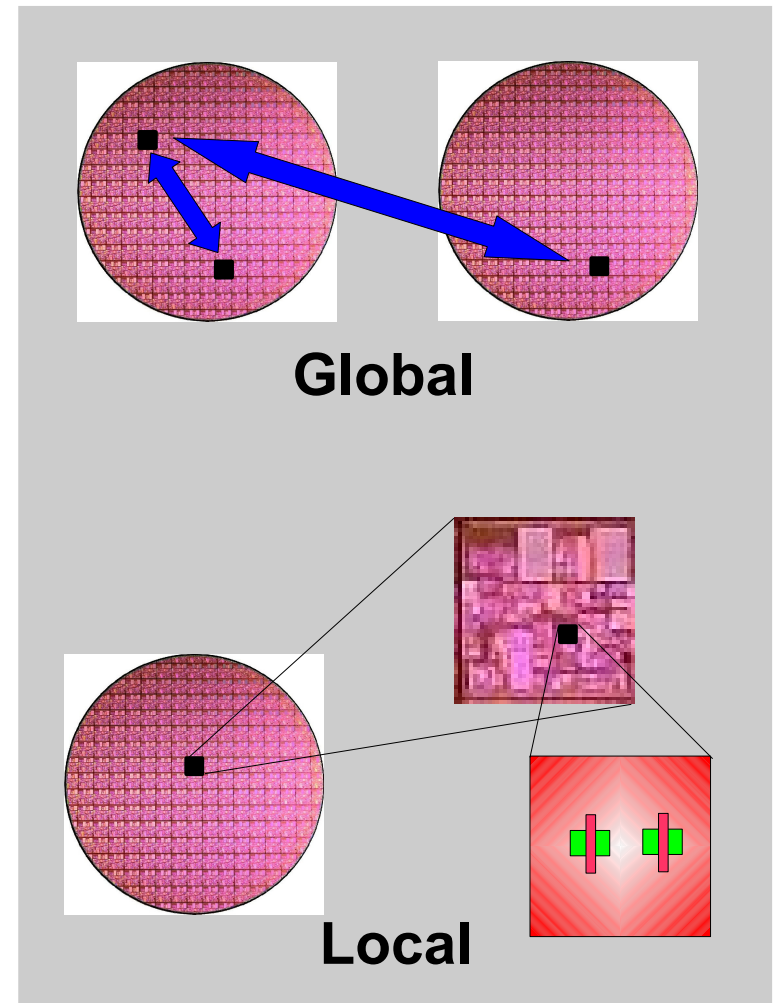
**Process  
Variability**

# Process Variability

- Three main reasons why process variability has become so important:
  - Moore's law:
    - Exponential growth in device integration
    - Billions of devices per die in 65nm and beyond
  - Shrinking devices:
    - Gate oxides approaching a few Angstroms
    - Fewer dopants under the gate ( $\sim 10^2$ )
  - Ultra low VDD:
    - VDD scaling  $< 1V$  to manage power.
    - $V_t$  not scaling, limited by leakage.
    - Less headroom, more sensitivity to  $\Delta V_t$ .

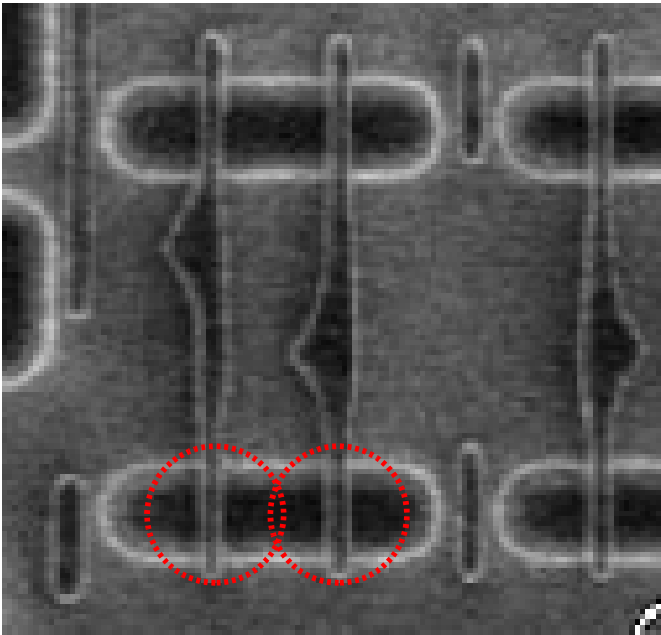
# Process Variation

- **Global:** die-to-die, wfr-to-wfr, and lot-to-lot variations caused by changes in:
  - Tox
  - Xtor W & L
  - N/PWELL doping
  - N/PMOS flatband voltage
  - Stress-induced effects
- **Local:** within-the-die variations caused by:
  - Xtor W & L mismatch
  - Vt mismatch
  - ACLV

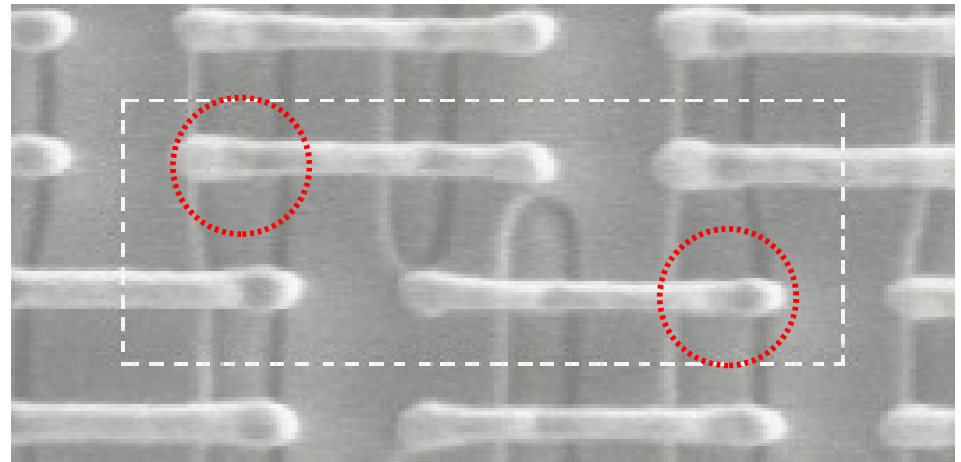


# Width and Length Mismatch

- Caused by variations in the lithographic process
- Width and Length variations are uncorrelated
- Small transistors more sensitive to W/L changes



**65nm CMOS NAND cell**



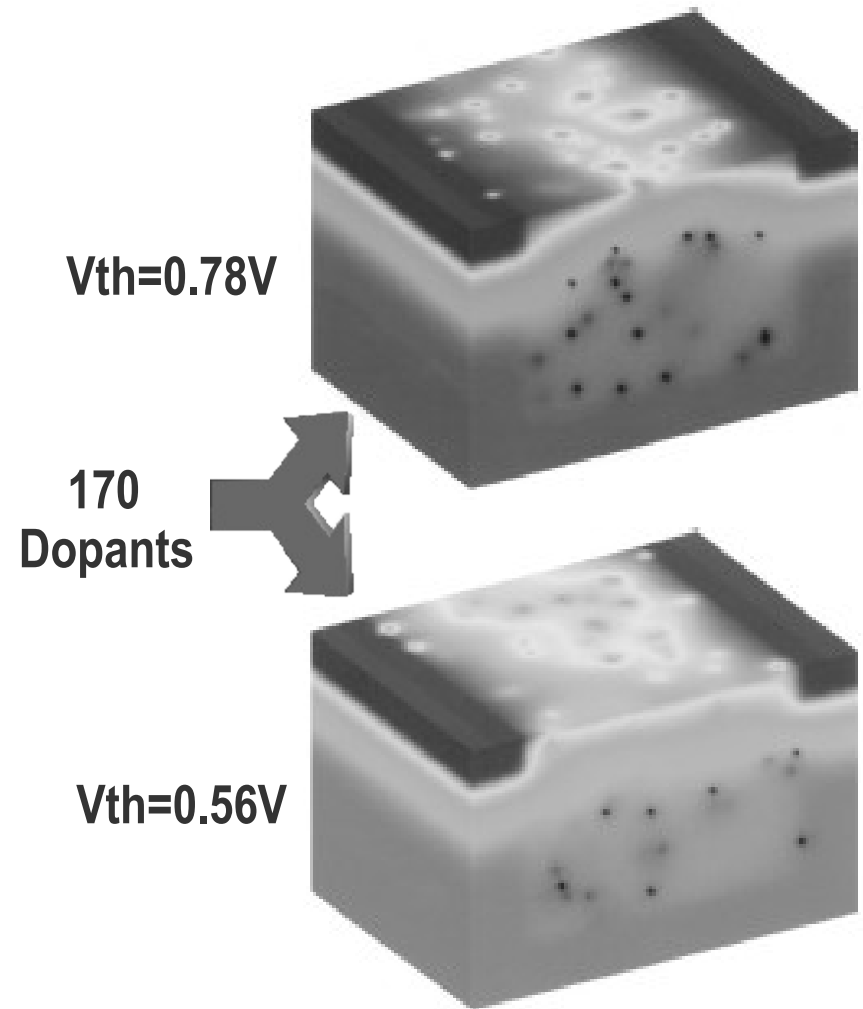
**Intel 65nm 6T SRAM cell**



# Vth Mismatch

- Random fluctuations due to relatively small number of dopants in the channel
- Vth variance is inversely proportional to transistor area
- Pelgrom's Law:

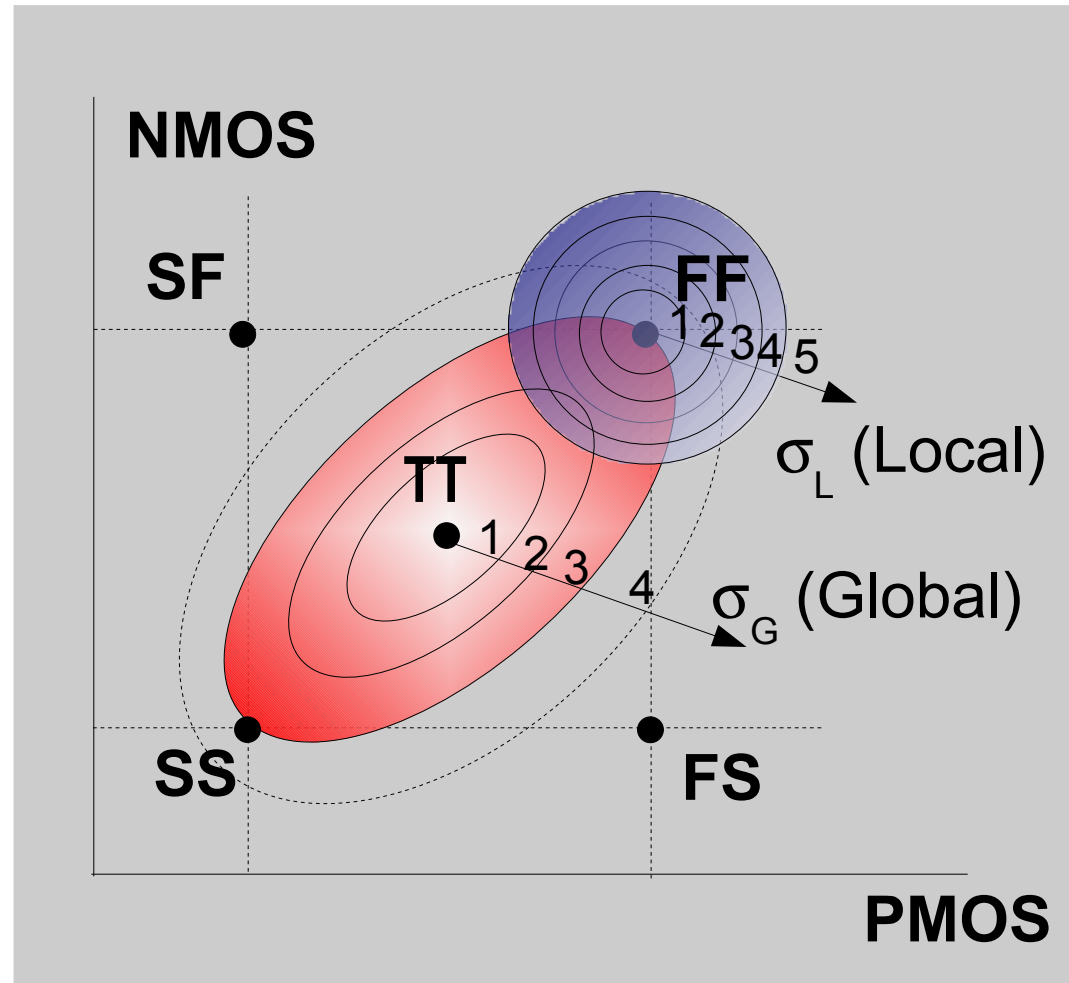
$$\sigma(V_{th}) = K / \sqrt{W \times L}$$



Source: Asenov A. "Random Dopant Induced Threshold Voltage Lowering and Fluctuations in Sub-0.1 um MOSFET's: A 3-D 'Atomistic' Simulation Study" IEEE Trans. On Electron Devices, Vol 45, No 12, Dec 1998

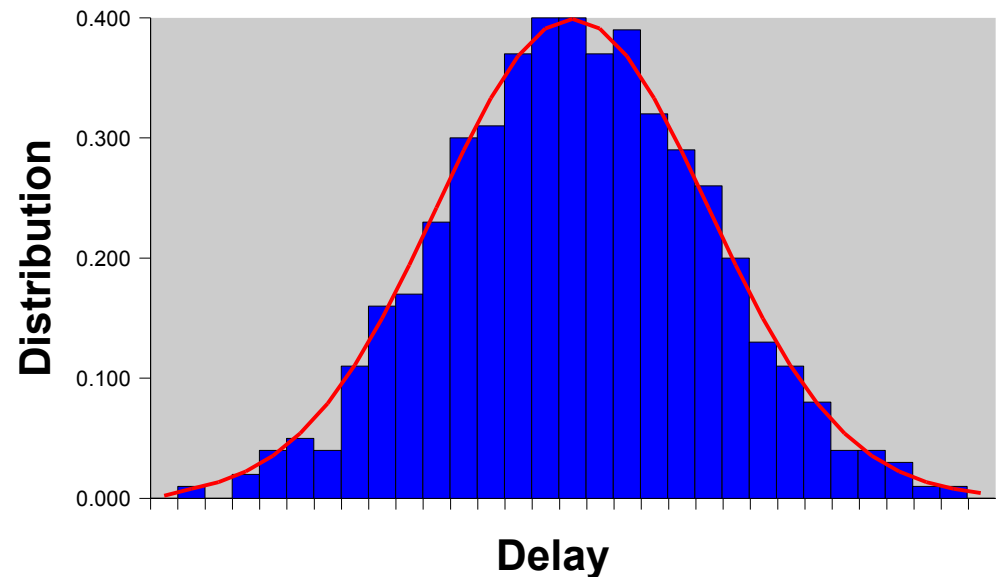
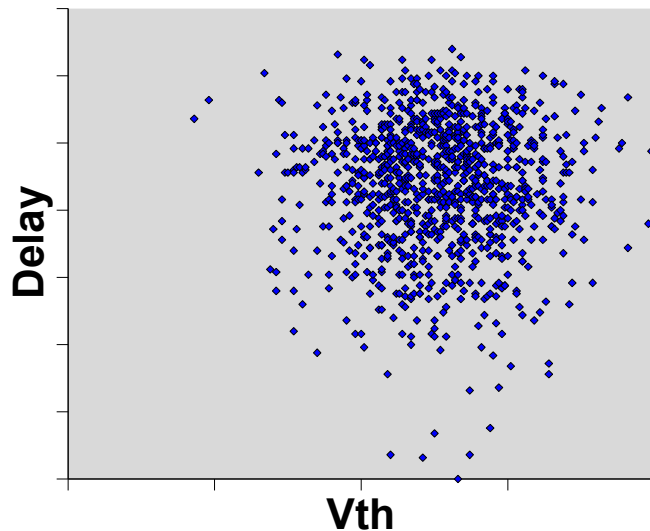
# Statistical Models

- Provided by most foundries
- More realistic than corner models.
- Cover the full design space.
- Foundries typically offer a  $3\sigma$  process.
- The number of local sigma is determined by the designer.



# Monte Carlo

- Monte Carlo involves simulating a circuit over a wide range of randomly chosen devices parameters
- The result is a distribution plot of design constraints, e.g., delay or noise margin
- Typically tens of thousands simulations needed, including Vdd and Temp sweeps



# When to use statistical analysis

- Usage limited to process-sensitive circuits:
  - Races
  - Contention
  - Mismatch
- Usage limited to high-usage circuits:
  - SRAM cells
  - Register file cells
  - Flip-flops
  - Sensamps
- Usage limited to highly-critical circuits:
  - Max and min critical paths

# How many Sigmas?

- Failure criteria:

$$(\mu - N \sigma_G - M \sigma_L) > \text{Safe Margin}$$

where:

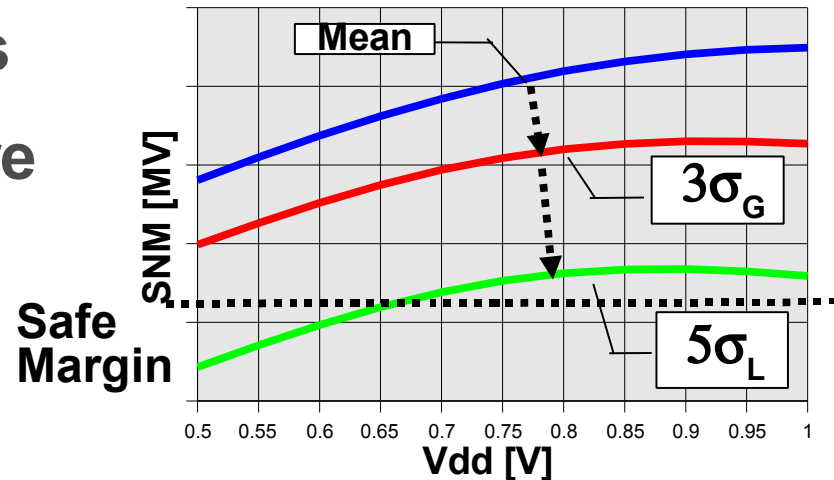
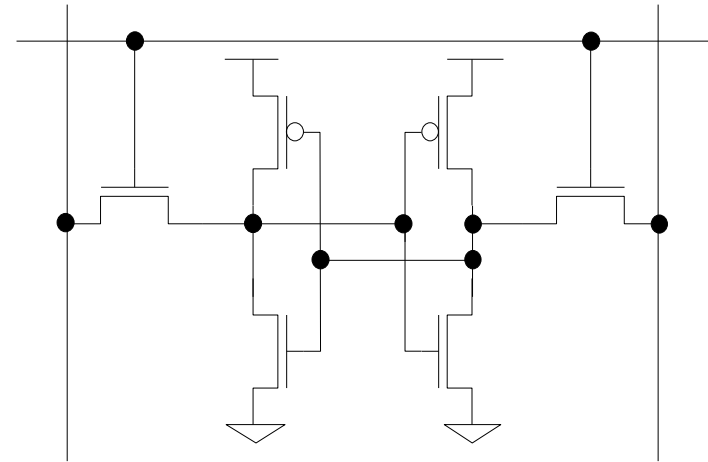
- $\mu$  is the mean
- N is determined by the foundry and is typically 3.
- M is determined by the number of instances of the circuit being analyzed:

# of instances	M
100	2.33
1,000	3.09
10,000	3.72
100,000	4.26
1,000,000	4.75
10,000,000	5.20

- Example: 1MB SRAM needs M=5 sigma for the bit design.

# Example 1: 6T SRAM Cell

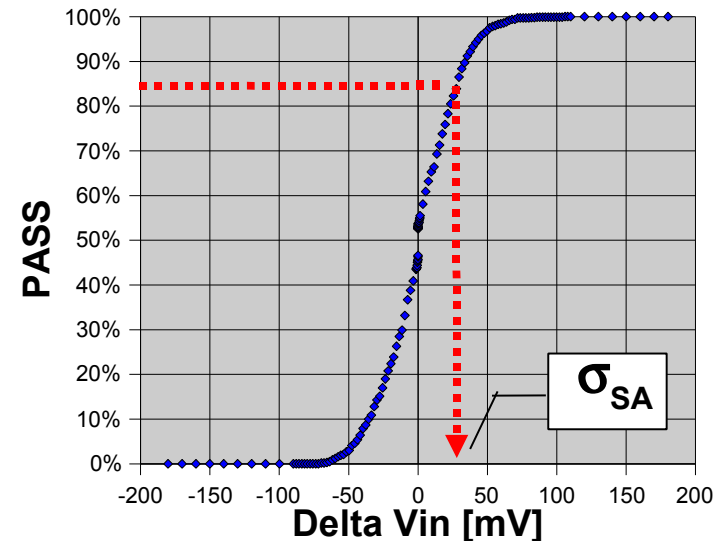
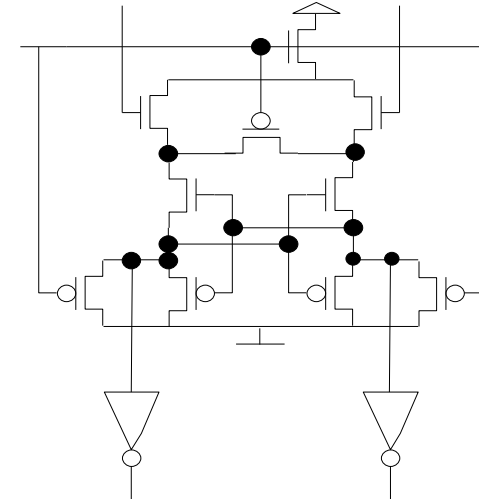
- Find stable VDD window for 6T SRAM cell (1MB)
- Flow:
  - Run Monte Carlo SNM sims
  - Find  $\mu$ ,  $\sigma_G$ , &  $\sigma_L$  across VDD
  - Define safe margin
  - Plot  $3\sigma_G$  and  $5\sigma_L$  curves
  - Find Vdd window where SNM > Safe margin.



# Example 2: Sense Amplifier

- Find min  $V_{DIFF}$  for sensamp
- Flow
  - Run Monte Carlo
  - Plot passing ratio vs.  $\Delta V_{in}$
  - Find  $\mu$  &  $\sigma_L$  for sensamp
  - Find  $\mu$  &  $\sigma_L$  for SRAM Iread
  - Min  $V_{DIFF}$ :

$$V_{DIFF} = \frac{\sigma_{SA}}{\sqrt{(1 - (M \times \sigma_{IREAD} / \mu_{IREAD})^2)}}$$



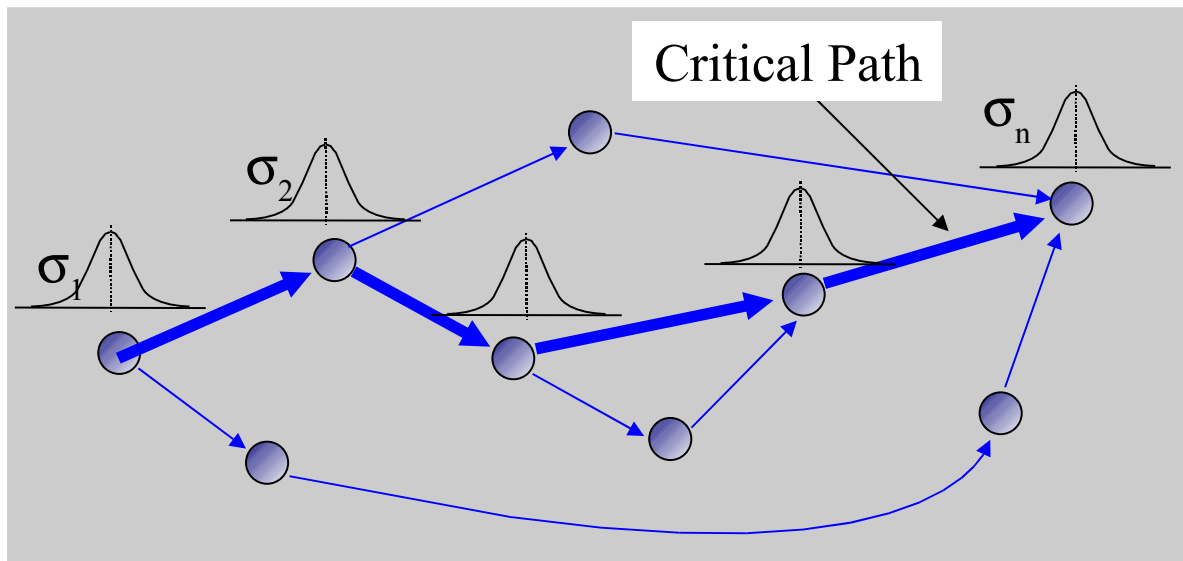
# Other Circuits

- **Other possible applications for statistical circuit design:**
  - Dynamic logic
  - Latches
  - Register files cells
  - Pulsed flops
  - Level shifters
  - Analog circuits
- **Advantages:**
  - All circuits designed to a target sigma
  - Avoid weak links
  - Avoid overdesign



# Statistical Timing

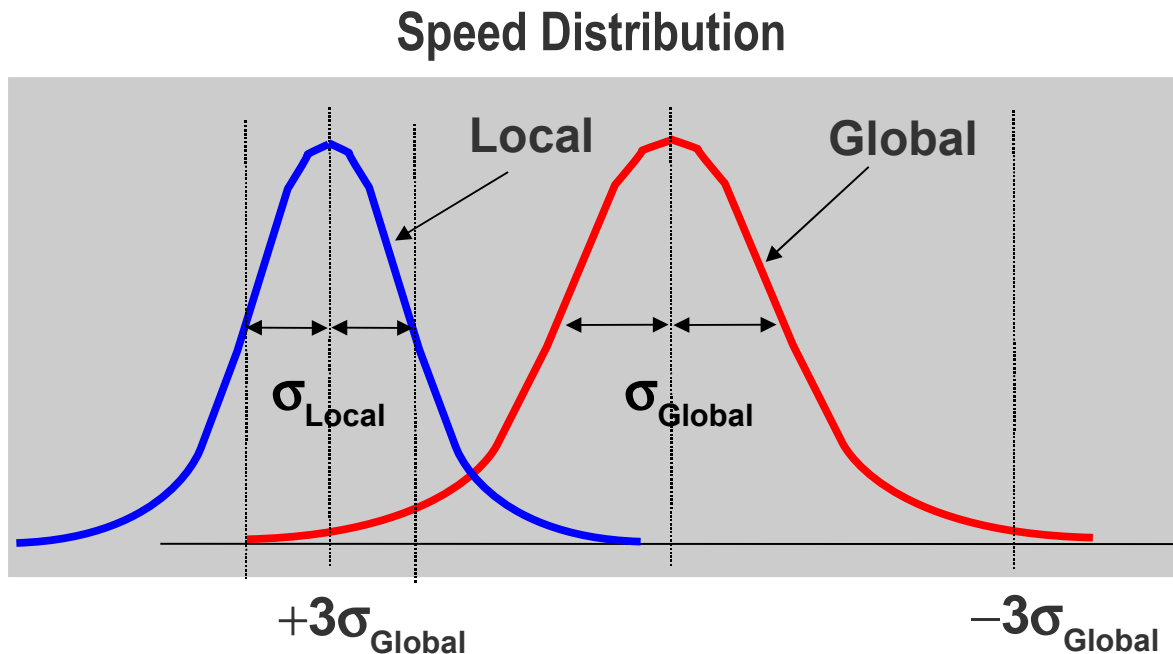
- Each gate has a mean and sigma. Sigmas can be computed using Monte Carlo
- The sigma of a path is determined by adding (i.e., sum-square) the sigmas of individual gates



$$\sigma_{Path} = \sqrt{\sigma_1^2 + \sigma_2^2 + \dots + \sigma_n^2}$$

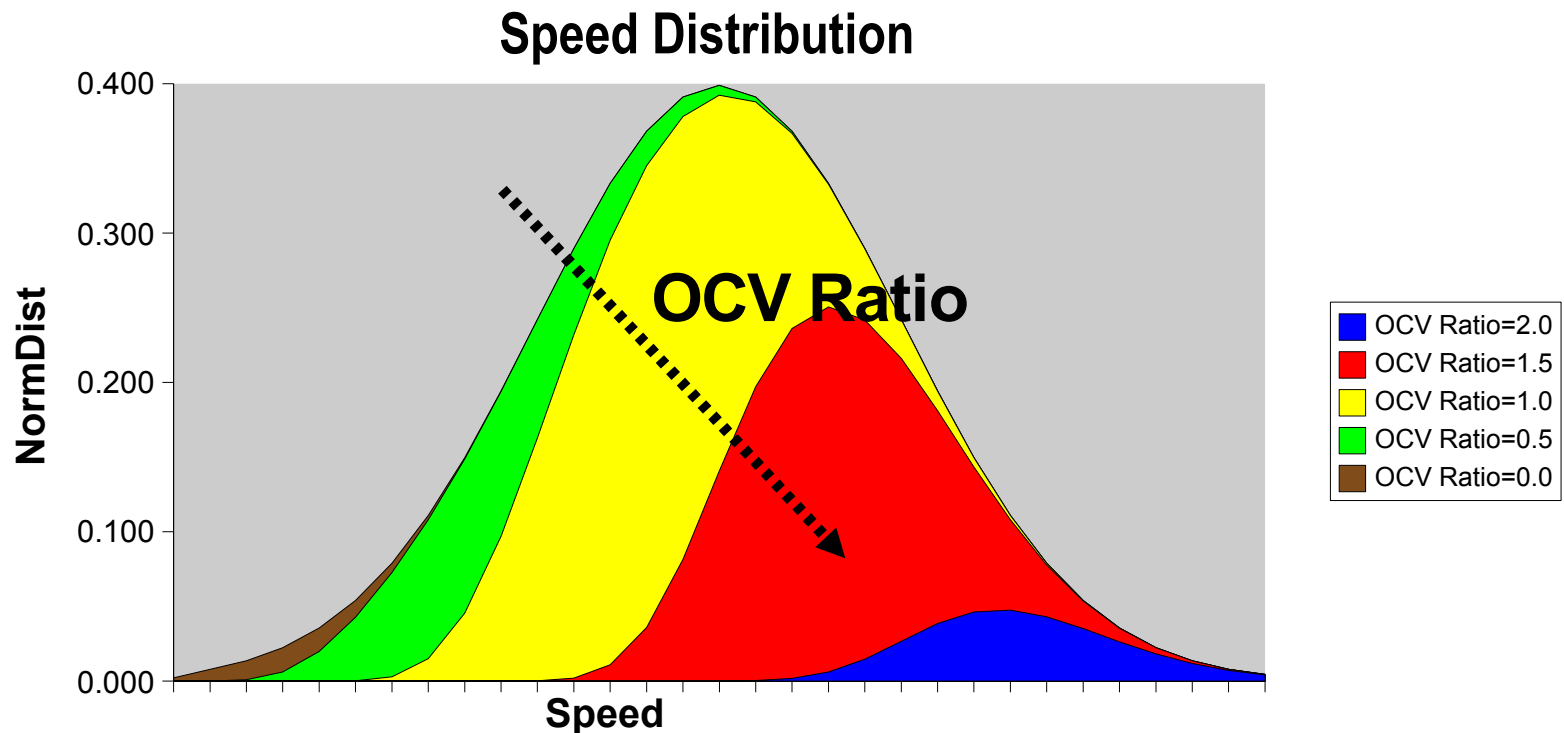
# Speed Distribution

- Each chip has a local distribution on top of the global distribution due to local variations
- Not all parts within a  $[+3\sigma, -3\sigma]$  window will yield above target due to local variations



# OCV Ratio and Yield

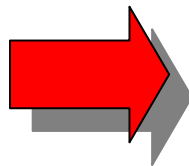
- On-chip Variability (OCV) =  $\sigma_{\text{Local}}$
- OCV Ratio =  $\sigma_{\text{Local}} / \sigma_{\text{Global}}$
- Speed yield strongly dependent on OCV ratio



# Yield Examples

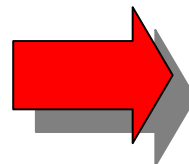
- Speed yield is affected by the shape of the timing histogram:

These three histograms have very different speed yields (OCV Ratio=1.5):



Slack	Hist#1	Hist#2	Hist#3
90ps	10000	1000	1000
60ps	1000	100	100
30ps	100	10	10
0	10	0	5
-30ps	0	0	1
Top Path [ps]	500	470	530
2GHz Yield	37.5%	74.0%	60.8%

These three histograms have the same speed yield (OCV Ratio=0.9):



Slack	Hist#1	Hist#2	Hist#3
90ps	10000	10000	10000
60ps	1000	1000	1000
30ps	100	350	100
0	10	0	0
-30ps	0	0	1
Top Path [ps]	500	470	530
2GHz Yield	89.8%	89.8%	89.8%

# Margining Races

- Races need to be margined for PVT variations.
- Fixed PVT margin (conventional):

$$D_{21} = D_2 - D_1 + m \times (D_1 + D_2 + D_{21})$$

- Fixed PVT sigma:

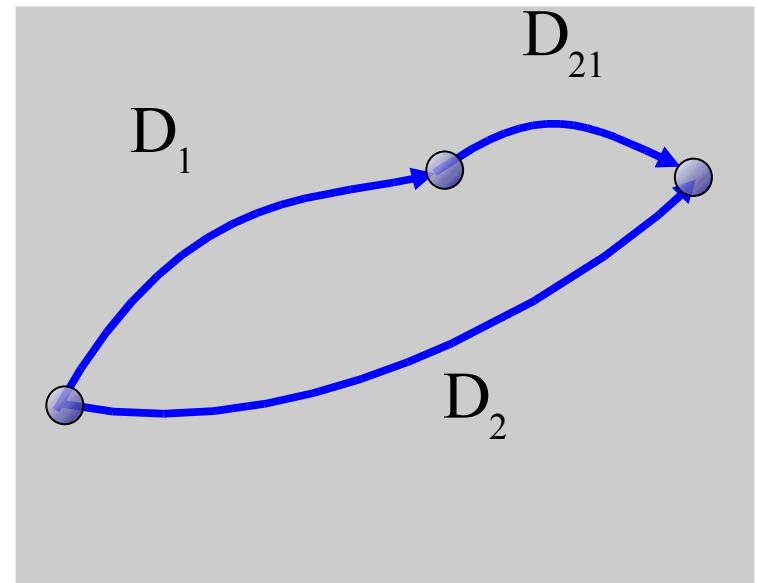
$$D_{21} = D_2 - D_1 + M \sigma \sqrt{(D_1 + D_2 + D_{21})}$$

- Drawbacks of fixed margin:

- Pessimistic for long delays
- Optimistic for short delays

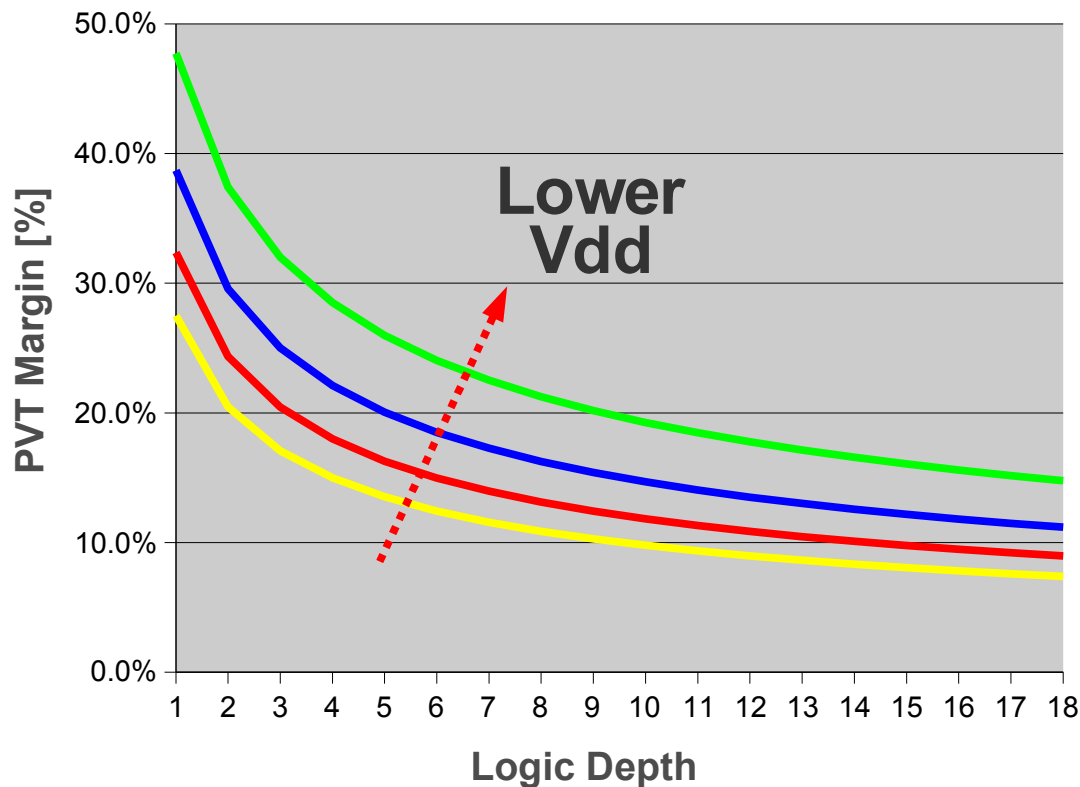
- Advantages of fixed sigma:

- Accurate (pseudo-statistical)
- M can be tuned for a specific design



# Margining Races (cont.)

- Fixed sigma:
  - PVT margin varies with the logic depth
  - PVT margin varies with Vdd

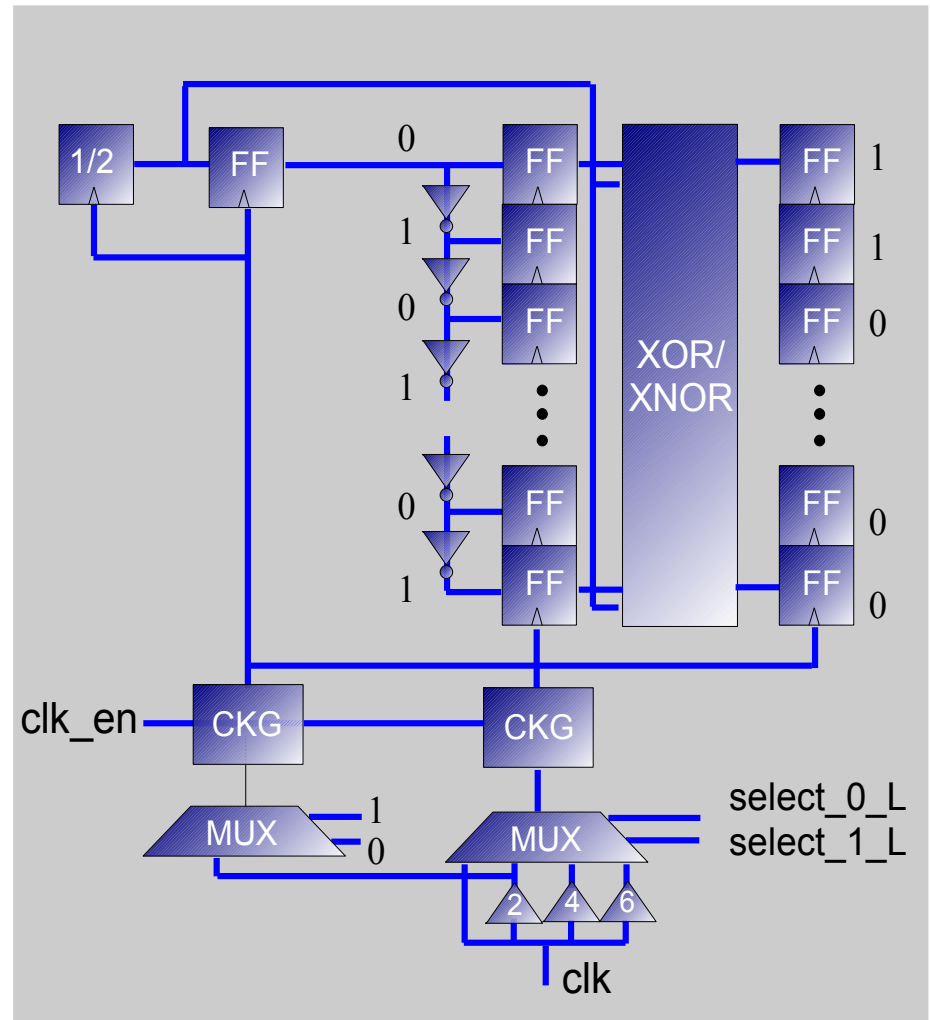


# Measuring Process Variability

- Test structures were developed to measure process variability.
- A testchip was built in a 65nm, triple-Vt, dual-oxide CMOS process.
- Data was collected across dies, wafers, lots, and across voltage and temperature.
- Measured data was used to:
  - Validate statistical SPICE models
  - Monitor process development
  - Determine design margins
  - Predict circuit limited yield

# A Racer Circuit

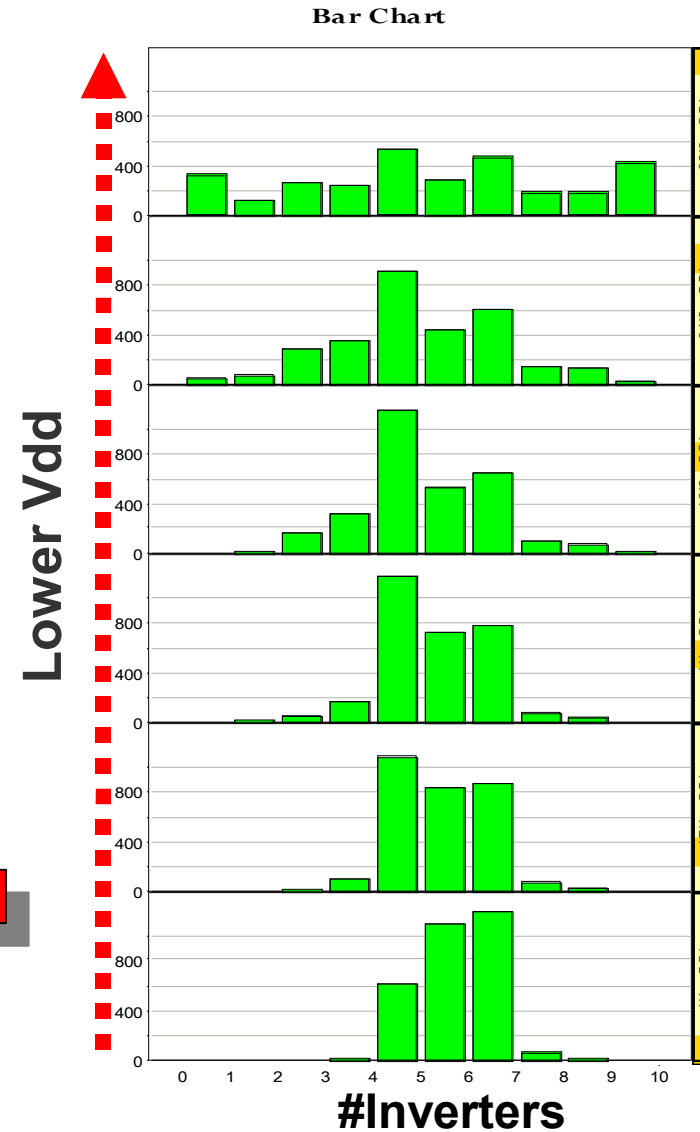
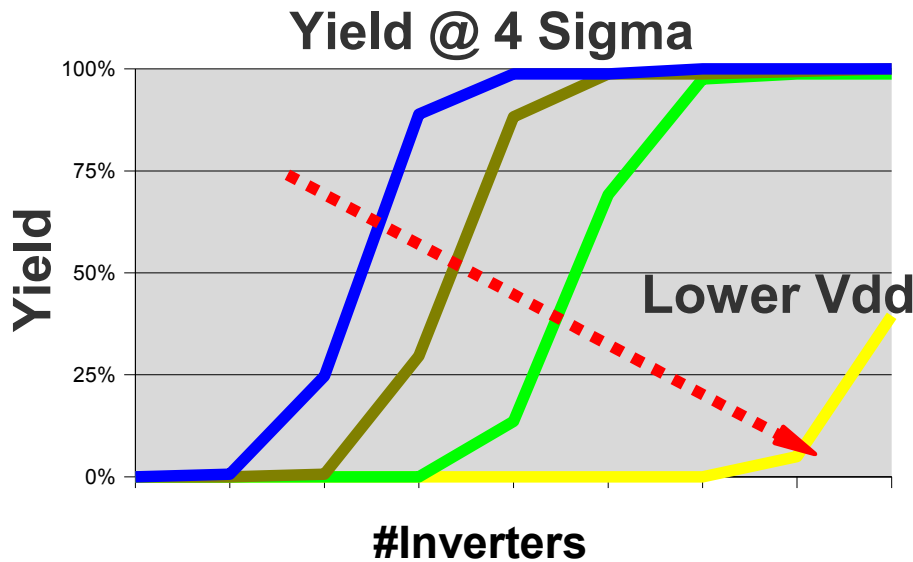
- A Racer circuit measures on-die process variations in Si.
- > 100 copies of the Racer module are placed across the die.
- The spread in the location of the leading “1” provides an indication of the process variability.





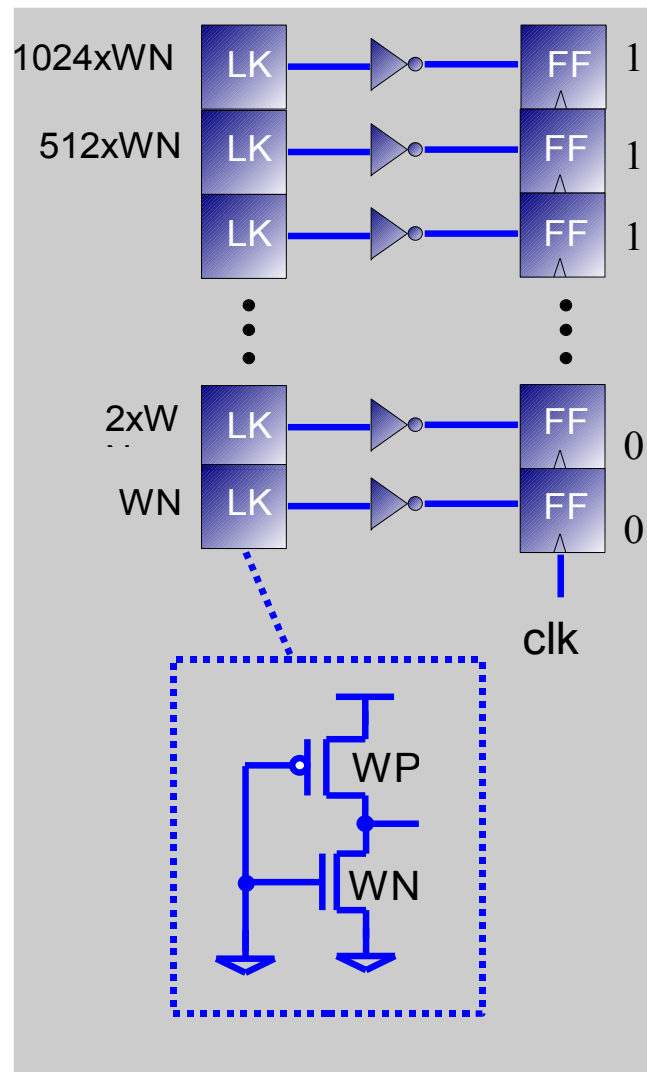
# Racer Results

- Racer data shows large spreads at low Vdd.
- Data can be used to predict circuit yield across Vdd.
- Low Vdd is the yield limiter!



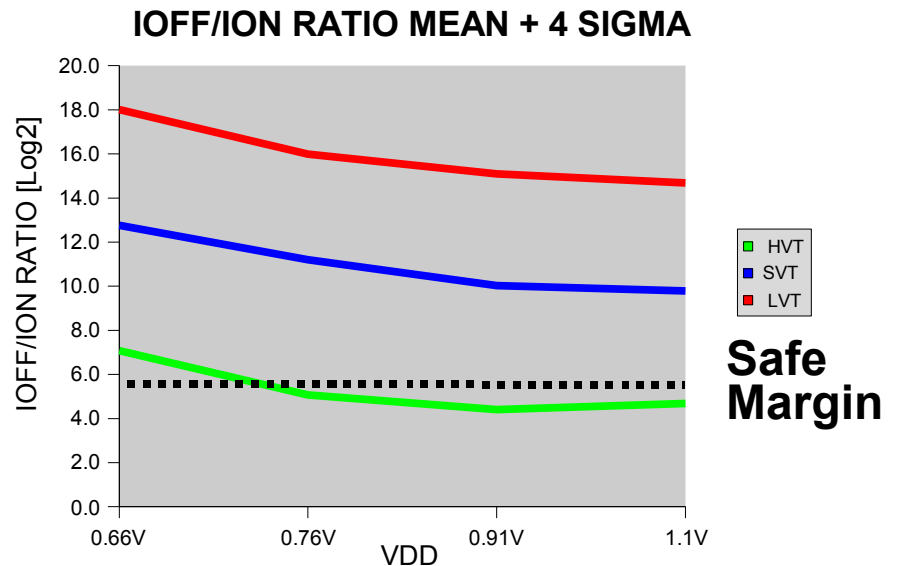
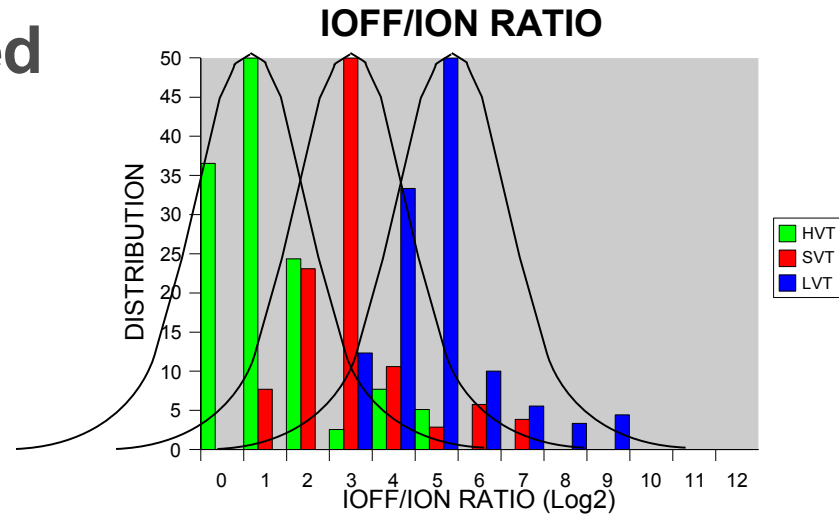
# A Leaker Circuit

- A Leaker circuit measures leakage spread ( $I_{off}/I_{on}$ ) in Si.
- It measures  $I_{off}/I_{on}$  by sensing a tied-off skewed inverter with a 2P:1N inverter and latching to a flop.
- Multiples copies of the leaker module are placed on the die.
- Separate modules are used for standard  $V_t$ , low  $V_t$ , and high  $V_t$  devices.



# Leaker Results

- Leaker data was collected across voltage and temperature.
- Distributions were generated and  $\mu/\sigma$  data was obtained.
- Ioff/Ion ratio worse at low Vdd for all Vt devices
- Ioff/Ion ratio worse at high temperature for all Vt devices



# CAD Challenges

- **Applications for statistical design:**
  - Timing
  - Power
  - ERC
  - Reliability
- **Main Challenges:**
  - Run time: Running Monte Carlo on a library would take years!
  - Tools need to be 'context aware': Ex: Timing optimization depends on the shape of the timing histogram
- **Pseudo-statistical approach**
  - Using statistical methods without running Monte Carlo.

# CAD Challenges (cont.)

- **Cell based designs**
  - Library characterization should produce  $\mu, \sigma$ .
  - Timing analyzer output should be speed yield.
- **Transistor level design**
  - In-situ characterization to generate  $\mu, \sigma$
  - Timing analyzer to create  $\mu, \sigma$  for macro
- **ERC/Reliability**
  - Statistically derived design rules
  - Waivers based on distributions and yield impact
- **Yield, Yield, Yield**
  - Tools should predict yield as a metric for signoff.

# CAD: What's missing

- **Tool Integration**

- Integration of DFM and DFY tools to predict:
  - Manufacturing yield
  - Functional Yield
  - Speed yield
  - Overall product yield

- **Validation**

- Validation of DFY tools in Silicon
- Justification of investment

# Summary

- Ignoring process variability may lead to non-functional designs or suboptimal yields.
- DFY will become more relevant as Vdd continues to scale and device geometries keep shrinking.
- Circuit solutions alone will not be sufficient if Moore's law continues.
- Process variability need to be handled at higher levels of the design process
- Future designs will incorporate:
  - Self-checking logic
  - Self-correcting logic
  - Redundant logic (besides SRAMs)
  - Wearout compensation mechanisms.

# Thank You

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