
A Probabilistic Analysis of Pipelined Global Interconnect Under Process Variations

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Overview

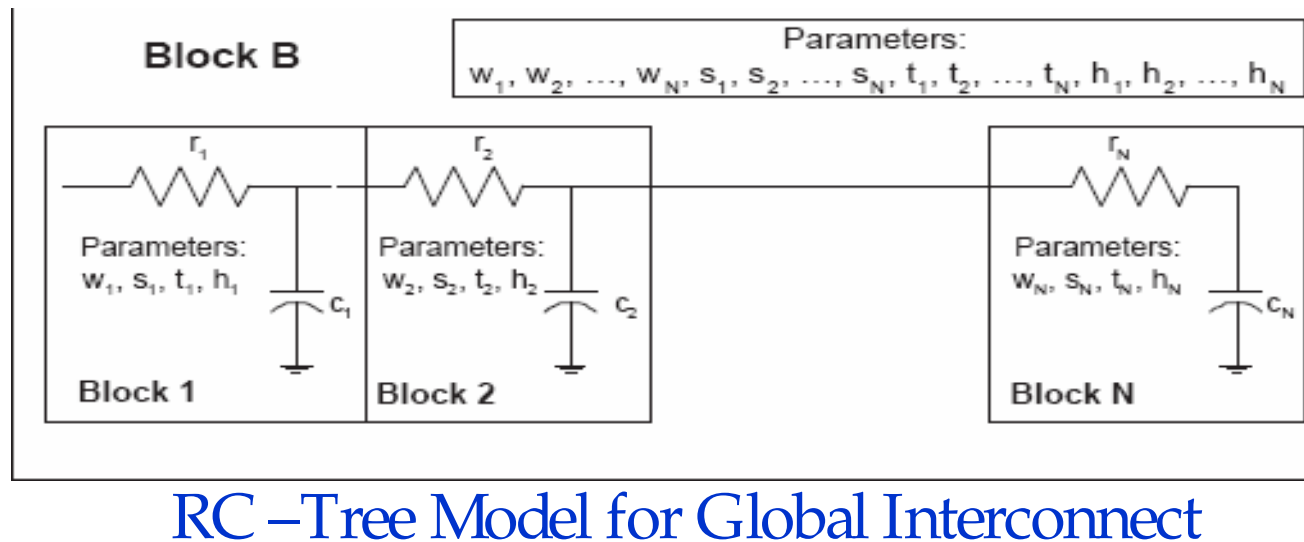
- A Novel Delay Metric based on ANOVA
 - Statistical Timing Analysis of Pipelined Global Interconnect
 - Reliability Aware Global Interconnect Sharing
 - Experimental Results
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Our Approach – Delay Metric based on Anova (DMA)

- Given the uncertainty in parameters and the degree of required model, DMA returns a polynomial expression for delay
- A distributed RC model for interconnect is assumed



Algorithm for DMA Implementation

```
{ B1, n} = DIVIDE( Block B);           //divide Block B into 'n' smaller
                                         //identical blocks B1

{ M} = FindModel(B1, p);                //find model M of degree 'p' for block
                                         //B1 using PCM

{ P } = ANOVA(M, R2);                  //run ANOVA on M to find
                                         //insignificant variables such that
                                         //reduced model is R2 % accurate

{ E} = Extrapolate(P);                  //extrapolate the insignificant variables
                                         //for other identical blocks of B1 to find
                                         //all the insignificant variables. E

{ RM} = VarRed(E, Block B);             //using E, eliminate variables from
                                         //block B to get reduced model RM

{  $\mu$ ,  $\sigma$ } = FindMoments(RM);        //find moments of the reduced model
                                         //RM
```

Algorithm for DMA

Implementation – Step 3 ANOVA

- What is ANOVA (Analysis of Variance)?
- As its name suggests – “ Analyzes Variances”
- Main Idea - Decomposition of total variance

$$\sigma^2 = \sum_i \sigma_i^2$$

- Mean response due to a particular input - Keep that input constant and vary all other inputs

$$\hat{\mu}_i(\xi_i) \equiv \int \cdots \int \hat{y}(\xi_1, \xi_2, \dots, \xi_n) d\xi_1 \cdots d\xi_{i-1} d\xi_{i+1} \cdots d\xi_n$$

ANOVA Basics

- Variance due to design variable ξ_i

$$\hat{\sigma}_i^2 = \int [\hat{\mu}(\xi_i) - \mu]^2 d\xi_i$$

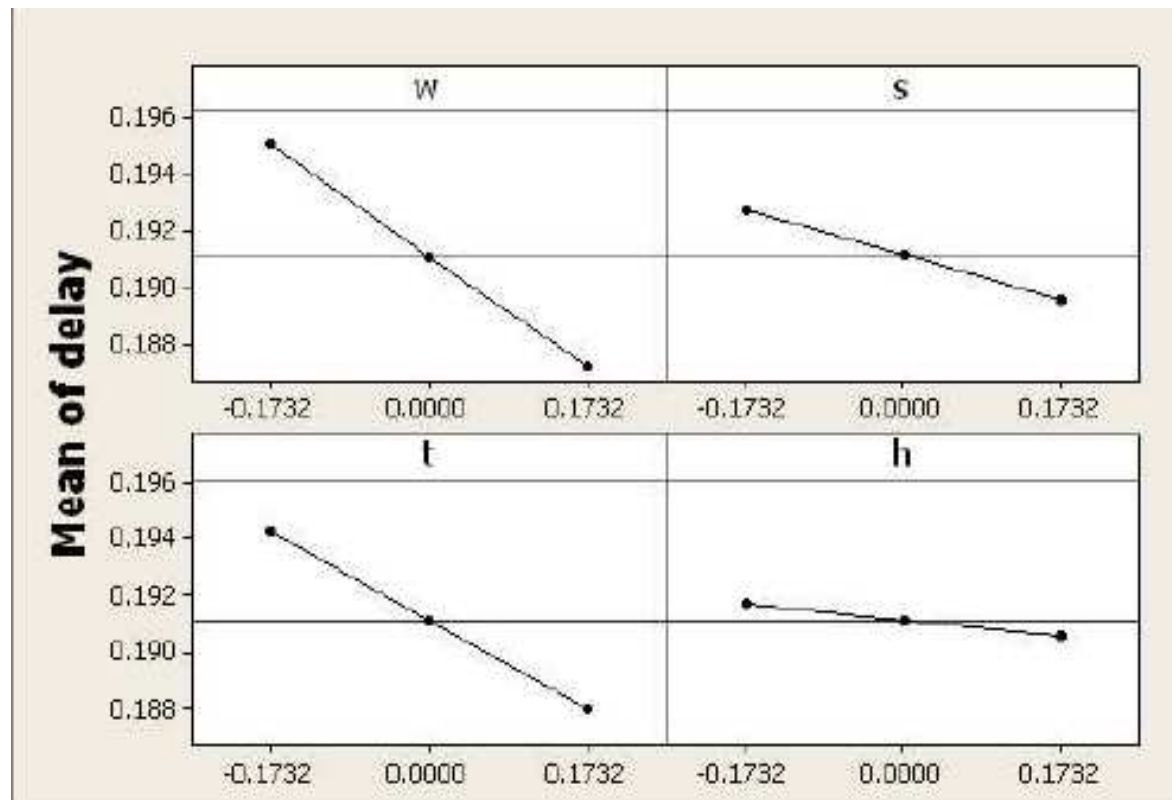
- Statistical Significance parameter (F):

$$\frac{\int [\hat{\mu}(\xi_i) - \mu]^2 d\xi_i}{\sigma^2}$$

- We calculate the “F” parameter using ANOVA
 - Another Important parameter found using ANOVA is: R^2
 - Based on these parameters, the algorithm decides whether the input parameter is significant or not.
-

Running ANOVA

- Input - Delay equation from PCM
- Apply Primary Screening – Compute delay gradient



Algorithm for DMA Implementation – Step 5: Variable Reduction

- Secondary Level of Screening - ANOVA
 - Identify Insignificant terms based on F- value
 - Remove insignificant terms
 - Generate reduced analytical equation such that R^2 is at least 98.5%
-

An Example

Delay for a single RC segment of a global interconnect for 0.13um technology

$$\begin{aligned} \text{delay} = & 19.65 - 2.28\xi_1 - 0.9\xi_2 - 1.82\xi_3 - 0.32\xi_4 \\ & + 0.28(\xi_1^2 - 1) + 0.1(\xi_2^2 - 1) + 0.12(\xi_3^2 - 1) \\ & + 0.05(\xi_4^2 - 1) + 0.17(\xi_1\xi_2) + 0.03(\xi_1\xi_4) \\ & + 0.2(\xi_2\xi_3) - 0.17(\xi_2\xi_4) + 0.17(\xi_3\xi_4) \text{ ps} \end{aligned}$$

Mean = 19.62ps
Variance = 3.15ps

In this case, ANOVA gives us terms that are insignificant as follows:

$$\xi_4, \xi_2^2, \xi_4^2, \xi_1\xi_2, \xi_1\xi_3, \xi_1\xi_4, \xi_2\xi_4, \xi_3\xi_4$$

After removing these terms, the reduced equation is:

$$\begin{aligned} \text{delay} = & 19.65 - 2.28\xi_1 - 0.9\xi_2 - 1.82\xi_3 + 0.28(\xi_1^2 - 1) \\ & + 0.12(\xi_3^2 - 1) + 0.2(\xi_2\xi_3) \text{ ps} \end{aligned}$$

Mean = 19.64ps
Variance = 3.13ps

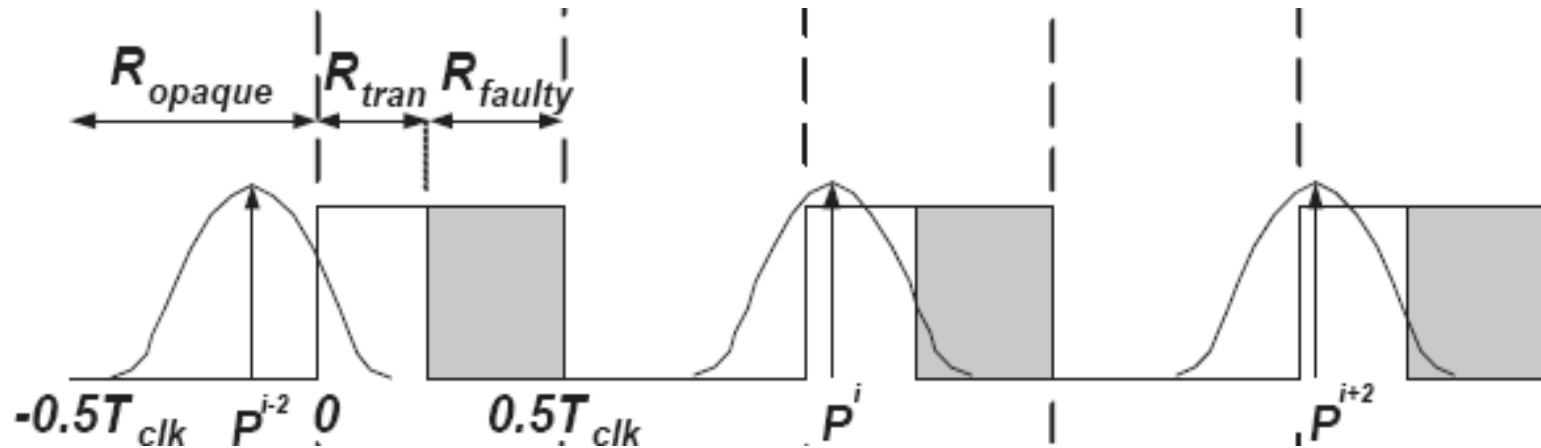
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Statistical Timing Analysis of Pipelined Global Interconnect

- Global Interconnect spans several clock cycles
 - Interconnect Pipelining is mainly used to increase throughput.
 - Two types of pipelining
 - Register Based (Edge Triggered)
 - Latch Based (Level Triggered)
 - Latch pipelining has performance advantage over Register based pipelining.
-

Statistical Timing Analysis of Pipelined Global Interconnect

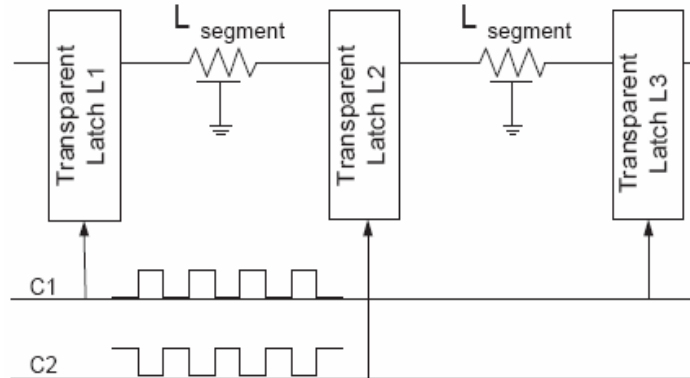


- Propagation delay (p) of present stage is not independent of previous stage
- Therefore, based on region where previous stage lies, p of previous stage lies, p of present stage is written as:

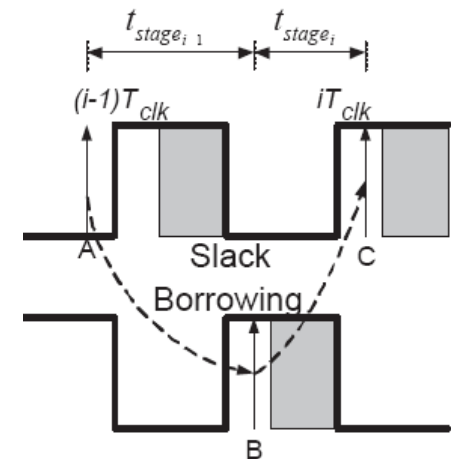
$$p_i = \begin{cases} \tau_{wire} + \tau_{data} - 0.5T_{clk} & p_i \in R_{opaque} \\ p_{i-1} + \tau_{wire} + \tau_{prop} - 0.5T_{clk} & p_i \in R_{tran} \end{cases}$$

Dual- Phase Clocking Scheme

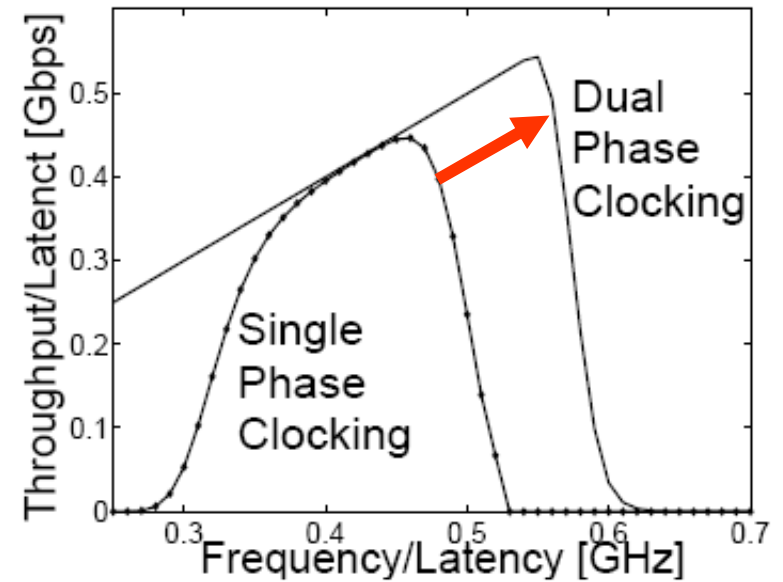
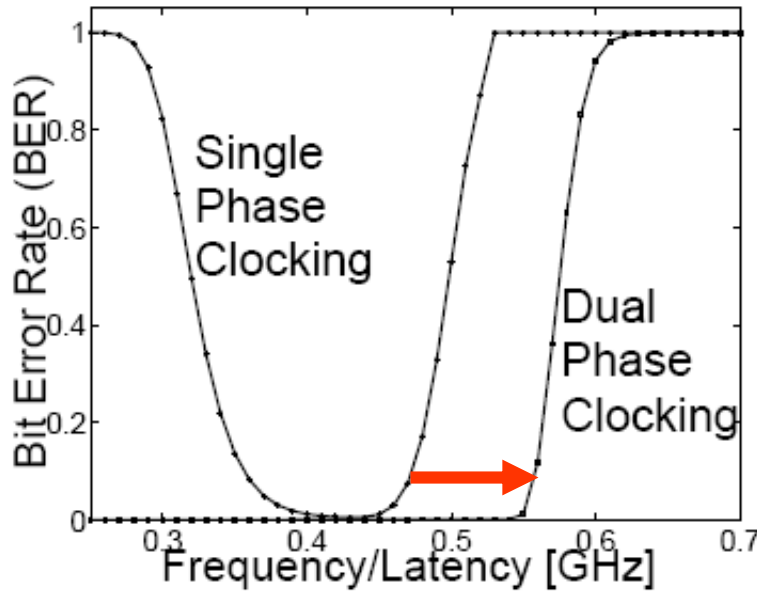
- Two sequentially adjacent clocks are driven using two clocks with 180 phase difference



- Advantages – More Flexibility in timing, Higher performance, Robust to clock variations,



Result showing advantages of dual- phase clocking



- Less Bit Error Rate
- More Throughput

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Reliability Aware Global Interconnect Sharing – Basics

- Different transfers needs to be scheduled as when they will be sent on the interconnect
 - A feasible schedule - Transfer starts after its arrival time and completes before specified deadline
 - To ensure correct transmission, BER must be kept low.
 - Thus, need for a probabilistic methodology to find a schedule for sampling transfers on the interconnect
-

Reliability Aware Global Interconnect Sharing – Preliminaries

- Total Confidence Level(Ψ_f)
 - Sampling Confidence (ψ_s)
 - Transmission Confidence (ψ_b)
- Transmission Confidence: $\psi_b = (1 - \text{BER})$
- Sampling Confidence: $\psi_s = 100 * \int_{-\infty}^{\pi_x} f(x) dx$
where $f(x)$ is pdf of x and π_x is ψ th percentile of x
- $\Psi_f = \psi_s * \psi_b$

Reliability Aware Global Interconnect Sharing – Problem Statement

- Problem Statement: “Given a set of arrival times and their corresponding deadlines, and a global interconnect clock period, the sampling time set is to be found such that total confidence level (Ψ_f) is maximized”.

$$\begin{array}{llll} & \max & & \Psi_f \\ \text{subject to:} & \omega_i & \leq & \omega_{min} \quad \forall i \in n \\ & d_i & \leq & \lambda_i \quad \forall i \in n \\ & \psi_{s_i} & \geq & 50\% \quad \forall i \in n \end{array}$$

Where ω is the BER, d is the delivery time, λ is the deadline time

Scheduling Algorithm

$p = \text{FindLatestArrivalTime}(B);$ //find latest arrival time of an event st
//BER is less than B

$S = \text{ComputeSlack}(\omega_{\min}, AT);$ //compute slack of each event according
// to minimum BER and mean arrival
// time (AT)

$C = \text{FindSamplingClockCycle}(S);$ //find latest clock cycles (C) a event can
//be sampled

$ST = \text{FindSamplingTime}(C);$ //Find sampling times according to C
//such that there is no conflict in
//scheduling

$\omega = \text{FindBER}(ST);$ //compute BER according to the
//sampling time

$\Psi_f = \text{ComputeConfidence}(\omega, ST);$ //compute total confidence for an event

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Experimental Results - DMA

Number of segments	Mean delay (ps)			Delay Variation (ps)			Number of Spice Runs			Error%	
	MC	PCM	DMA	MC	PCM	DMA	MC	PCM	DMA	μ	σ
2	40.06	39.92	40.11	3.59	3.45	3.63	10000	45	38	0.12	1.11
4	163.67	163.94	164.04	9.24	9.37	9.42	15000	153	86	0.22	1.94
8	496.36	496.66	494.62	26.59	26.36	27.16	20000	561	261	0.35	2.15
16	1616.29	1617.15	1625.82	43.45	42.81	44.86	25000	2145	912	0.59	3.26

- MC: Monte Carlo
- PCM: Probabilistic Collocation Method

Experimental Results - Scheduling

Table 5.4: Comparison of Deterministic and probabilistic Scheduling

	μ_A	λ	δ		ζ		Ψ_f						Gain %				
							μ		$\mu + 3\sigma$		probabilistic		μ		$\mu + 3\sigma$		
			SP	DP	SP	DP	Sampling		Sampling		Sampling		Sampling		Sampling		
							SP	DP	SP	DP	SP	DP	SP	DP	SP	DP	
> 0	ps	ps															
Case 1																	
E1	70	2850	1	1	385	650	44.64	43.13	69.99	70.62	99.47	99.79	122.77	131.37	42.09	41.29	
E2	395	3700	3	1	1240	1110											
E3	690	3450	1	2	955	1570											
E4	1020	4100	2	2	1810	2030											
Case 2																	
E1	70	2600	0	0	90	90	49.47	40.65	0	81.54	73.52	99.74	48.62	145.36	-	22.30	
E2	395	2900	0	0	405	650											
E3	690	3150	0	1	695	1110											
Case 3																	
E1	70	2600	0	0	-	90	×	43.13	×	0	×	89.38	-	107.23	-	-	
E2	395	3450	2	2	-	1570											
E3	690	2850	-1	0	-	710											
E4	1020	3100	-2	0	-	1165											

SP → Single Phase clocking

DP → Dual Phase clocking

× → Deadline Constraint Violation

Slack > 0

Slack = 0

Slack < 0

Questions?

Thank you

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