

# **Geometrically Parameterized Interconnect Performance Models for Interconnect Synthesis**

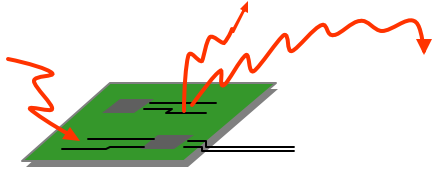
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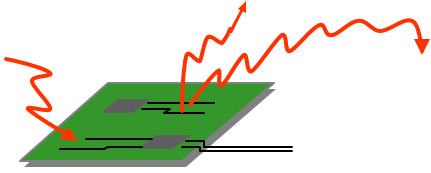
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## Motivation

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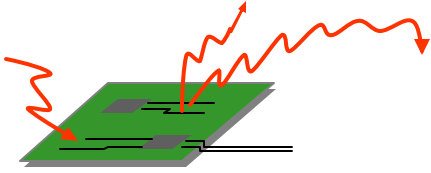
- **In interconnect design often would like to design for:**
    - **reliable functionality:**
      - minimize capacitive cross-talk,
      - minimize inductive cross-talk,
      - minimize electromagnetic interference
    - **high speed:**
      - minimize resistance
      - minimize capacitance
    - **low cost:**
      - minimize area
  - **Need to explore tradeoff space and find optimal design!**
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## Motivation (cont.)

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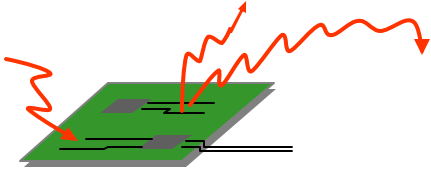
- **The traditional design flow:**
    - **REPEAT**
      - design all interconnect wires
      - extract accurately parasitics all at once
    - **UNTIL noise and timing are within specs**
  - **such procedure is not ideal for optimization!**
  - **each iteration is very time consuming**
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## Alternative design methodologies

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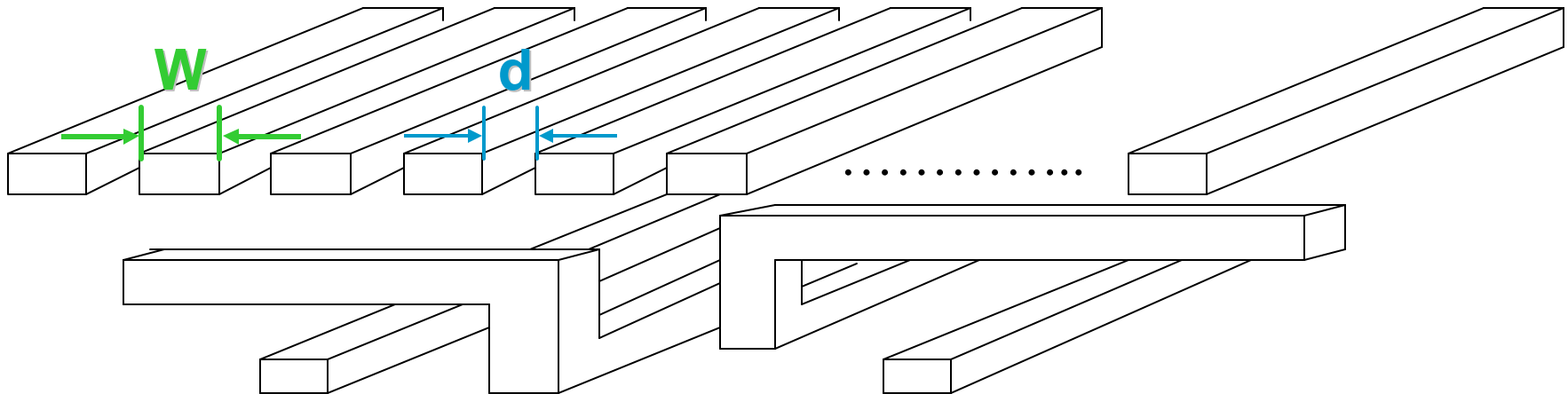
- 1. Pre-characterize standard interconnect structures (e.g. busses):**
    - using parasitic extraction and table lookup
    - **or building parameterized and accurate low order models**
  
  - 2. And if the model construction is fast enough can also:**
    - **build the interconnect structure model "on the fly" during layout**
    - accounting for any topology in surrounding topologies already committed to layout
    - then use optimizer to choose the best parameter for optimal tradeoff design.
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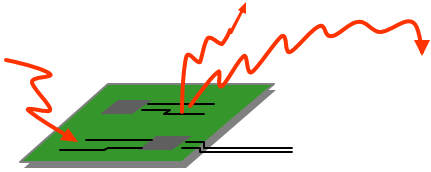
## Example: an interconnect bus

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- We construct a multi-parameter model of the bus parameterized in wire **width  $W$**  and **separation  $d$**

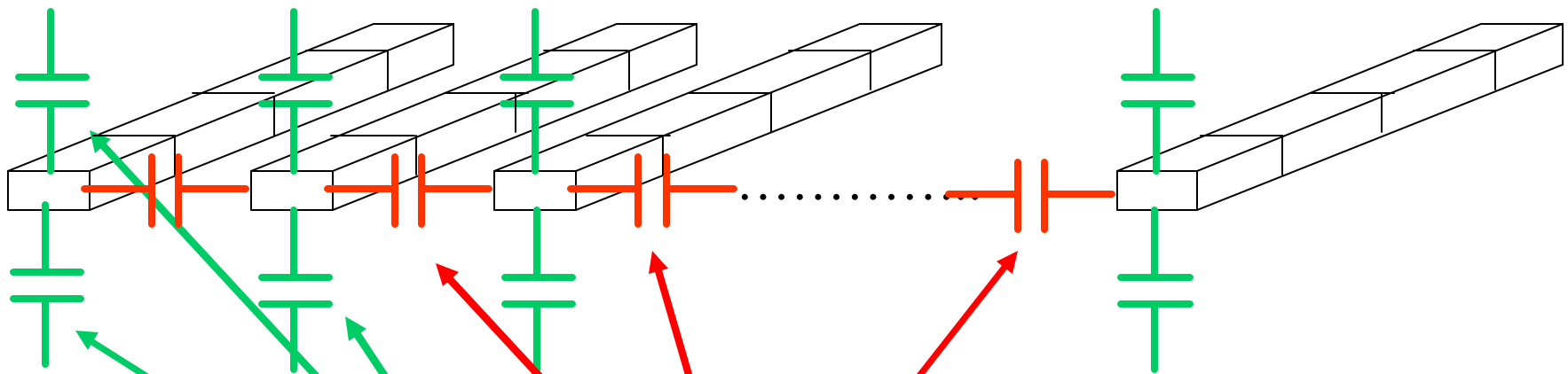


- **accounting for surrounding topology**
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# Parasitic extraction produces large state space models

- E.g. subdividing wires in short sections and using for instance Nodal Analysis

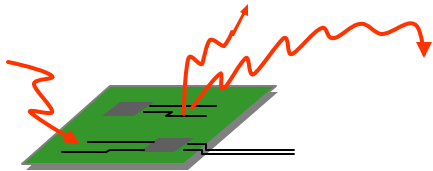


$$\left[ sW C_{gnd} + s \frac{C_{side}}{d} + WG \right] x = b u$$

Conductance matrix

**Large linear dynamical system**

$$y = c^T x$$



## Our goal

- Given a large parameterized linear system:

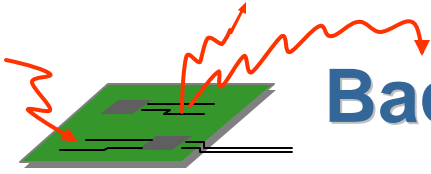
$$\left( \begin{array}{c} sW \\ C_{gnd} \end{array} + \frac{s}{d} \begin{array}{c} C_{side} \end{array} + W \begin{array}{c} G \end{array} \right) \begin{array}{c} x \\ \\ \end{array} = \begin{array}{c} b \\ \\ \end{array} u$$

$y = c^T x$

- construct a reduced order system with similar frequency response

$$\left( \begin{array}{c} sW \\ \hat{C}_{gnd} \end{array} + \frac{s}{d} \begin{array}{c} \hat{C}_{side} \end{array} + W \begin{array}{c} \hat{G} \end{array} \right) \begin{array}{c} \hat{x} \\ \\ \end{array} = \begin{array}{c} \hat{b} \\ \\ \end{array} u$$

$y = \hat{c}^T \hat{x}$



## Background: Classical Non-parameterized Model Order Reduction

- Given a large parameterized linear system:

$$s \quad \begin{array}{|c|} \hline A \\ \hline \end{array} \quad \begin{bmatrix} x \\ \end{bmatrix} = \begin{bmatrix} x \\ \end{bmatrix} + \begin{bmatrix} b \\ \end{bmatrix} u$$

**500,000 x 500,000**

$y = c^T x$

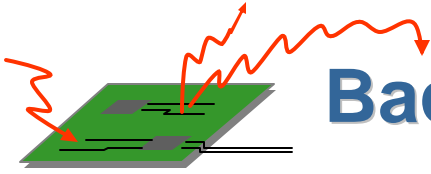
- construct a reduced order system with similar frequency response

$$s \quad \begin{array}{|c|} \hline \hat{A} \\ \hline \end{array} \quad \begin{bmatrix} \hat{x} \\ \end{bmatrix} = \begin{bmatrix} \hat{x} \\ \end{bmatrix} + \begin{bmatrix} \hat{b} \\ \end{bmatrix} u$$

**20 x 20**

$y = \hat{c}^T \hat{x}$





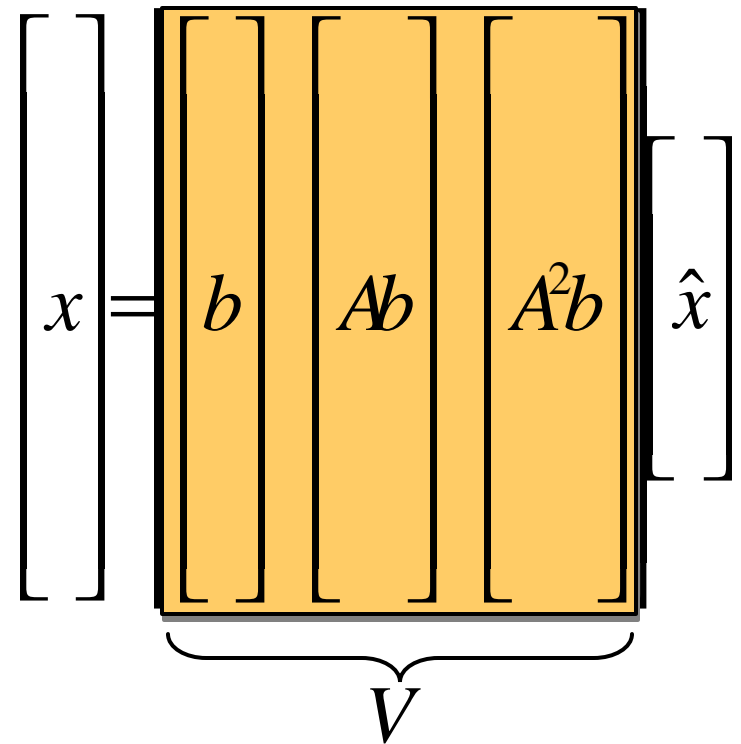
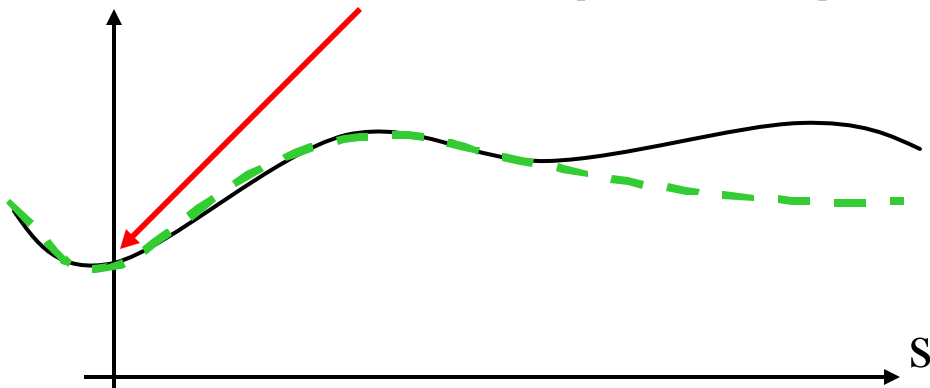
## Background: Classical Non-parameterized Model Order Reduction (cont.)

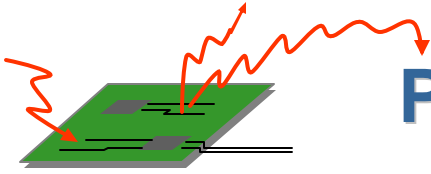
$$sAx = x + bu \quad \Rightarrow \quad x = -(I - sA)^{-1} bu$$

Consider its Taylor series expansion:

$$x = \sum_{m=0}^{\infty} s^m A^m b \quad u \quad \Rightarrow \quad x \in \text{span} \{b, Ab, A^2b, \dots\}$$

- idea for model order reduction: change base and use only the first few vectors of the Taylor series expansion: equivalent to match first derivatives around expansion point





## Parameterized Model Order Reduction (cont.)

$$sAx = x + bu$$

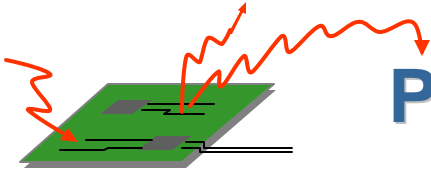
$$y = c^T x$$



$$s \overbrace{V^T A V}^{\hat{A}} \hat{x} = \hat{x} + \overbrace{V^T b}^{\hat{b}} u$$

$$y = \underbrace{c^T V}_{\hat{c}^T} \hat{x}$$

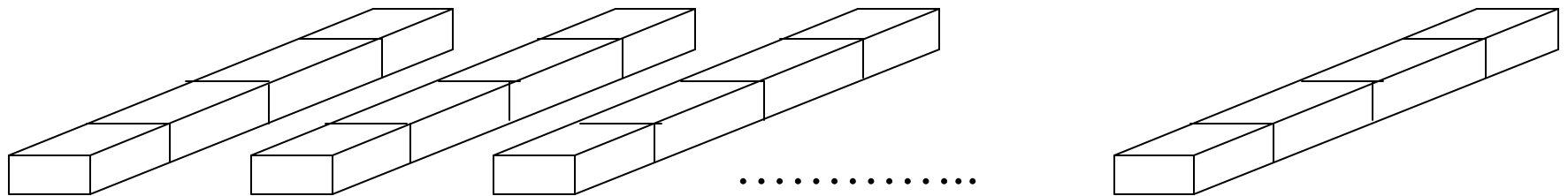
$$V^T A V = \hat{A}$$



# Parameterized Model Order Reduction. Example: interconnect bus

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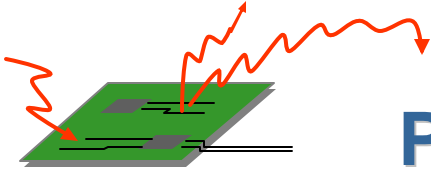
- Discretizing wires and using Nodal Analysis



$$\left[ \begin{array}{c} \textcircled{sWC} \\ \textcircled{s \frac{C}{d}} \\ \textcircled{-WG} \end{array} \right] x = bu$$

$$y = c^T x$$

$s_1$                    $s_2$                    $s_3$



## Parameterized Model Order Reduction

- **In general:** 
$$\begin{aligned} \left[ s_1 A_1 + \dots + s_p A_p - I \right] x &= b u \\ y &= c^T x \end{aligned}$$

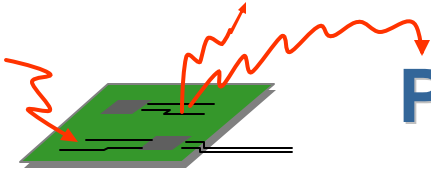
$$x = - \left[ I - (s_1 A_1 + \dots + s_p A_p) \right]^{-1} b u = \sum_{m=0}^{\infty} (s_1 A_1 + \dots + s_p A_p)^m b u$$

- **It is a p-variables Taylor series expansion**

$$x \in \text{span} \left\{ b, A_1 b, A_2 b, \dots, A_p b, A_1^2 b, (A_1 A_2 + A_2 A_1) b, \dots \right\}$$

$$\begin{bmatrix} x \end{bmatrix} = \begin{bmatrix} V \end{bmatrix} \begin{bmatrix} x_r \end{bmatrix}$$

**Once again change basis and project state onto the first few vectors of the Taylor series expansion, in order to match the first derivatives with respect to all parameters**



# Parameterized Model Order Reduction (cont.)

$$\left[ sWC_g + s\frac{C_s}{d} + WG \right] x = bu \quad \longrightarrow \quad \left[ sW\overbrace{V^T C_g V}^{\hat{C}_g} + s\overbrace{V^T C_s V}^{\hat{C}_s} + W\overbrace{V^T G V}^{\hat{G}} \right] \hat{x} = \overbrace{V^T b}^{\hat{b}} u$$

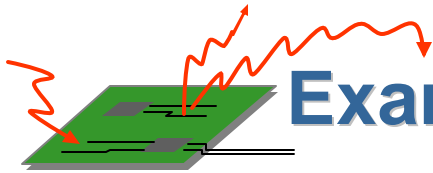
$y = c^T x$

$V^T$   
 $C_g$   
 $V$   
 $=$   
 $\hat{C}_g$

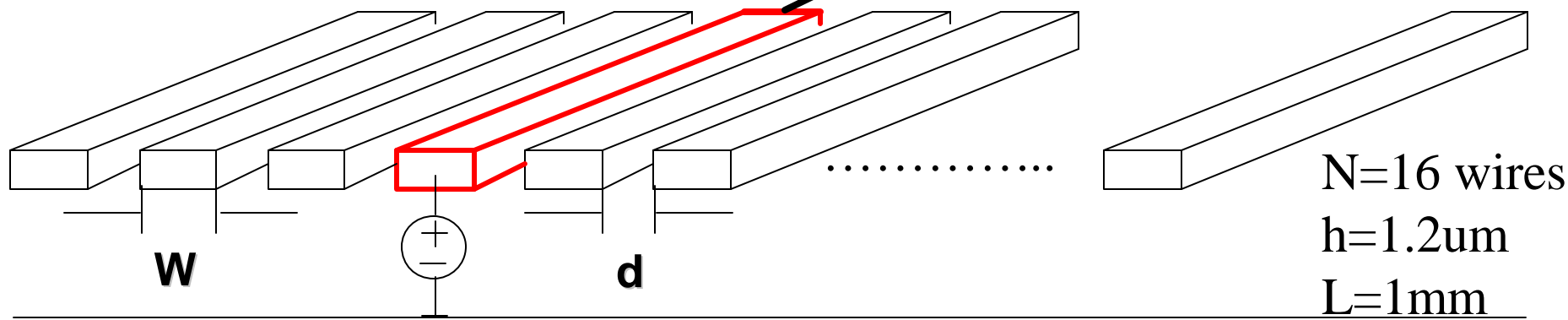
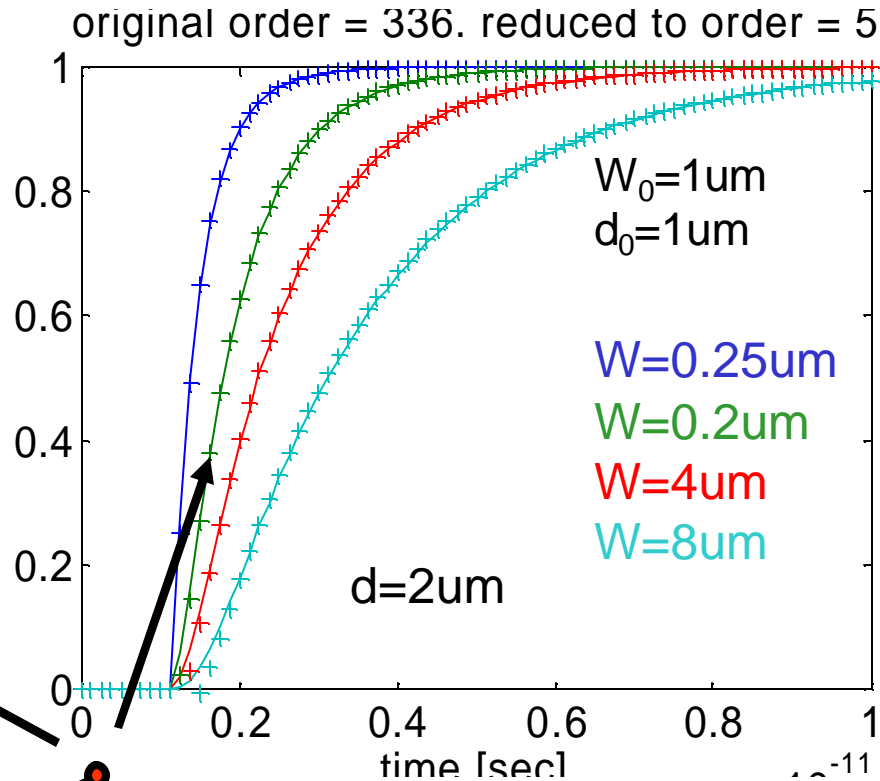
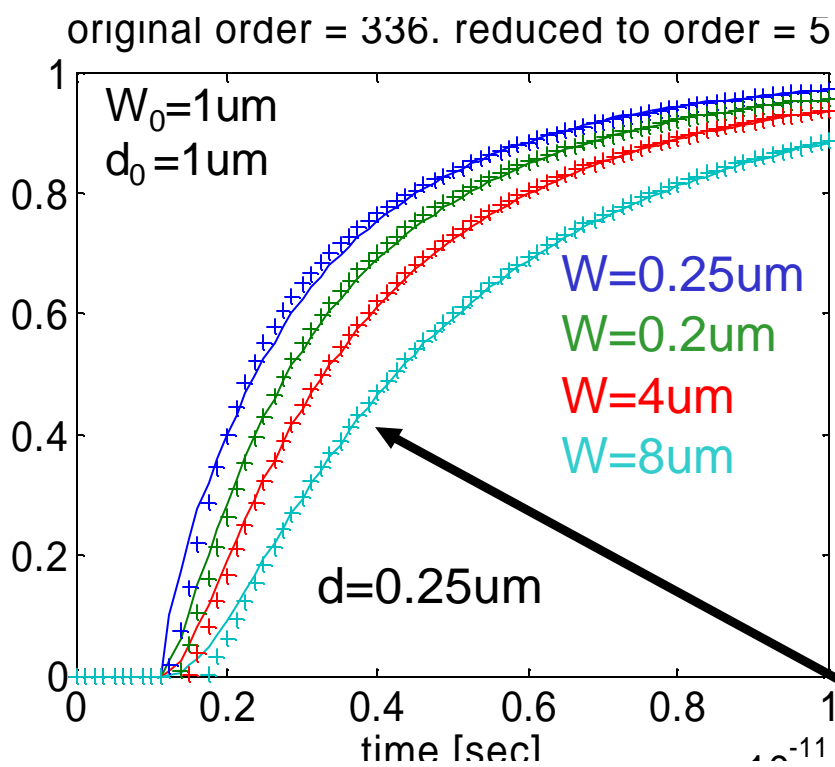
$V^T$   
 $C_s$   
 $V$   
 $=$   
 $\hat{C}_s$

$V^T$   
 $G$   
 $V$   
 $=$   
 $\hat{G}$

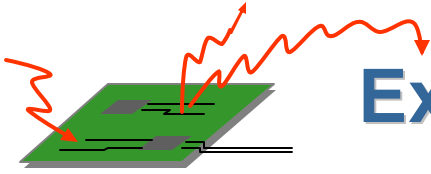
$y = \underbrace{c^T V}_{\hat{c}} \hat{x}$



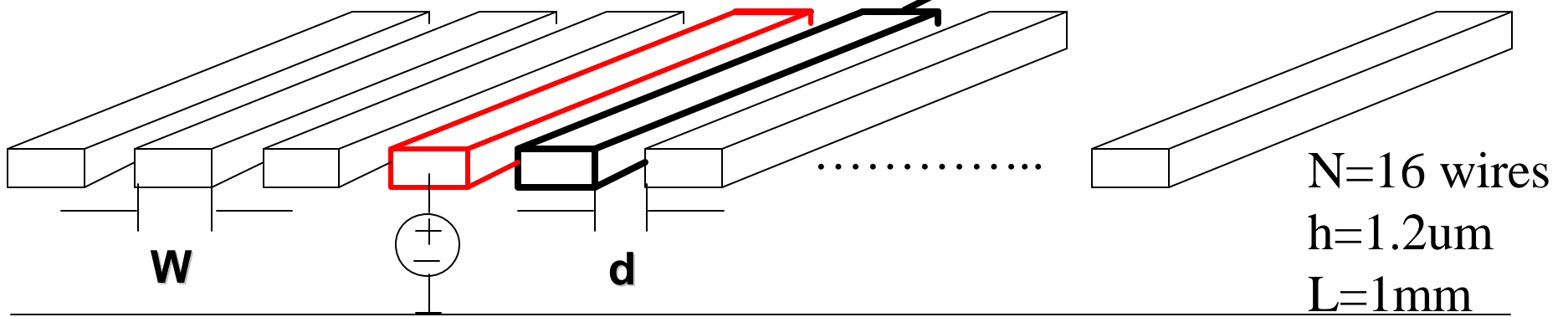
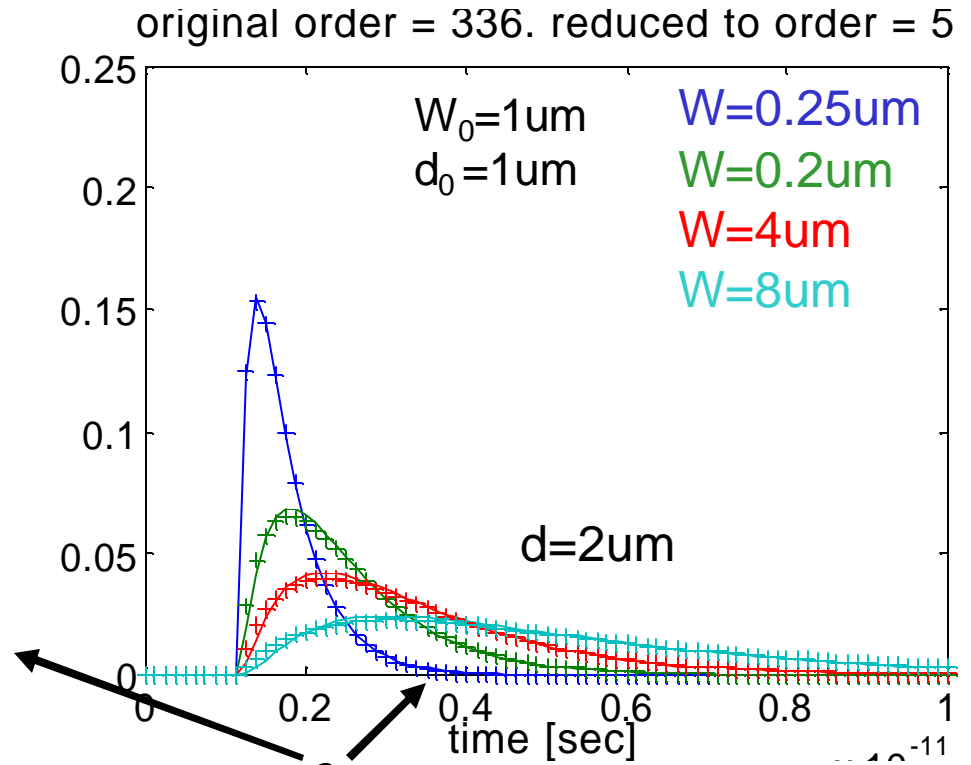
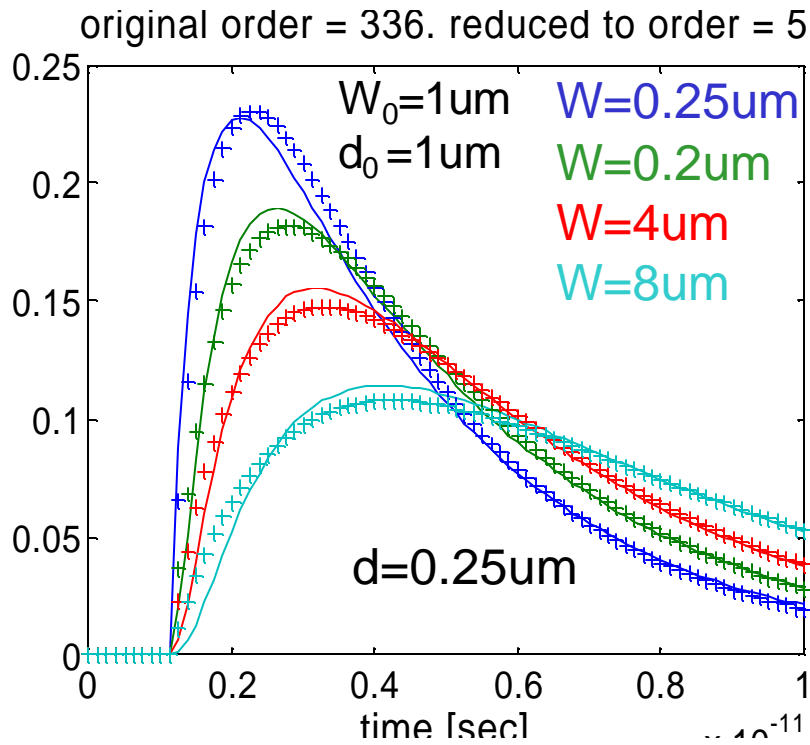
# Example: model step responses for different $W$ and $d$

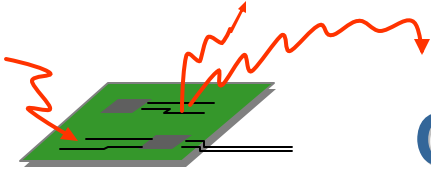


$N=16$  wires  
 $h=1.2\mu\text{m}$   
 $L=1\text{mm}$



# Example: model crosstalk responses for different $W$ and $d$



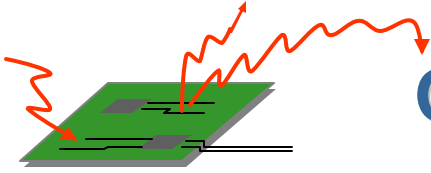


## Open research issues and limitations

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- So far only account for resistance and capacitance. Still need to verify if can account also for **inductance**.
  - No good a priori **error bounds** available for moment matching reduced order modeling techniques
    - i.e. for a given accuracy, don't know how to pick order theoretically a priori.
    - however, practically, we do know how to construct the model incrementally increasing its order reusing all previous computation until we meet desired accuracy.
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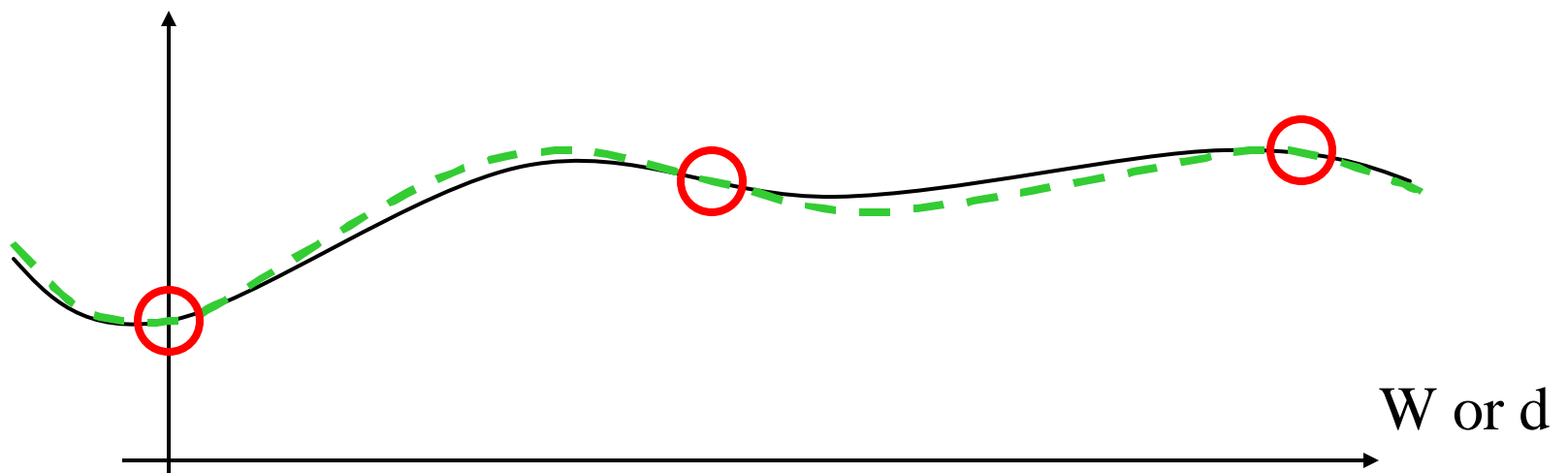


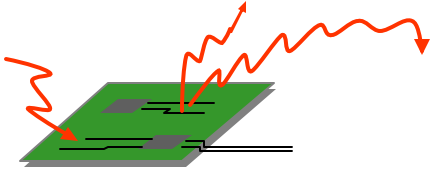


## Open research issues and limitations (cont.)

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- **Model order grows as  $O(p^m)$**  where  $p = \#$  parameters and  $m = \#$  derivatives matched for each parameter
  - however model order is linear in  $\#$  of parameters when matching only one derivative per parameter ( $m = 1$ ) and still produces good accuracy in our experiments.
  - furthermore, for higher accuracy instead of increasing  $\#$  of matched derivatives, can instead match **multiple points** (or combine the two approaches)





## Conclusions

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- **Parameterized low order model of interconnect structures can help interconnect synthesis and optimization**
  - **Presented a technique for parameterized modeling:**
    - based on Krylov subspace congruence transformation
    - requires only matrix-vector products: **fast model construction**
    - produced **models capture accurately the behavior of the original system**
    - and have low order: **can be instantly evaluated for any parameter value** for instance in an optimization procedure.
  - **Shown example result: bus interconnect parameterized in wire widths and separation.**
-