



17th - 18th
OCTOBER
2016

PARMA
PAGANINI CONGRESSI
ITALY



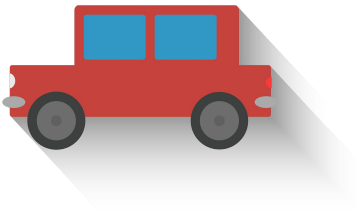
Validation of Automotive Control Applications using Formal Methods and metamodeling techniques

- ❖ Simone Silvetti, Esteco Spa & University Udine
- ❖ Mariapia Marchi, Esteco Spa

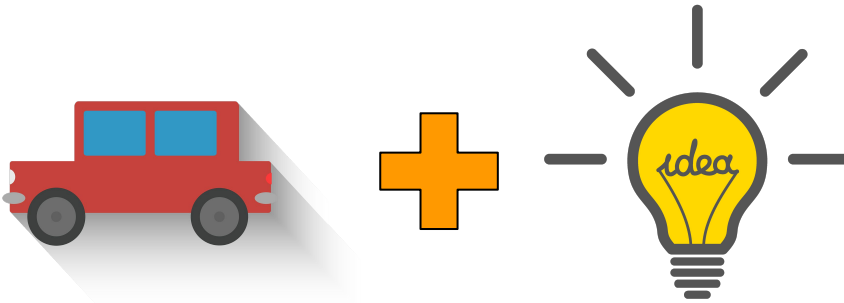
MDB (Model Based Development)

- ❖ process aimed at designing complex systems
- ❖ cost reduction
- ❖ reduce development time

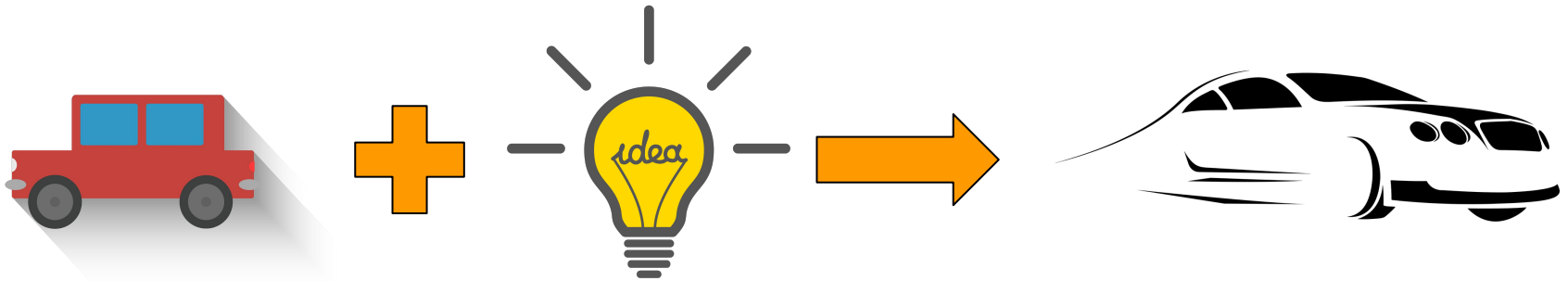
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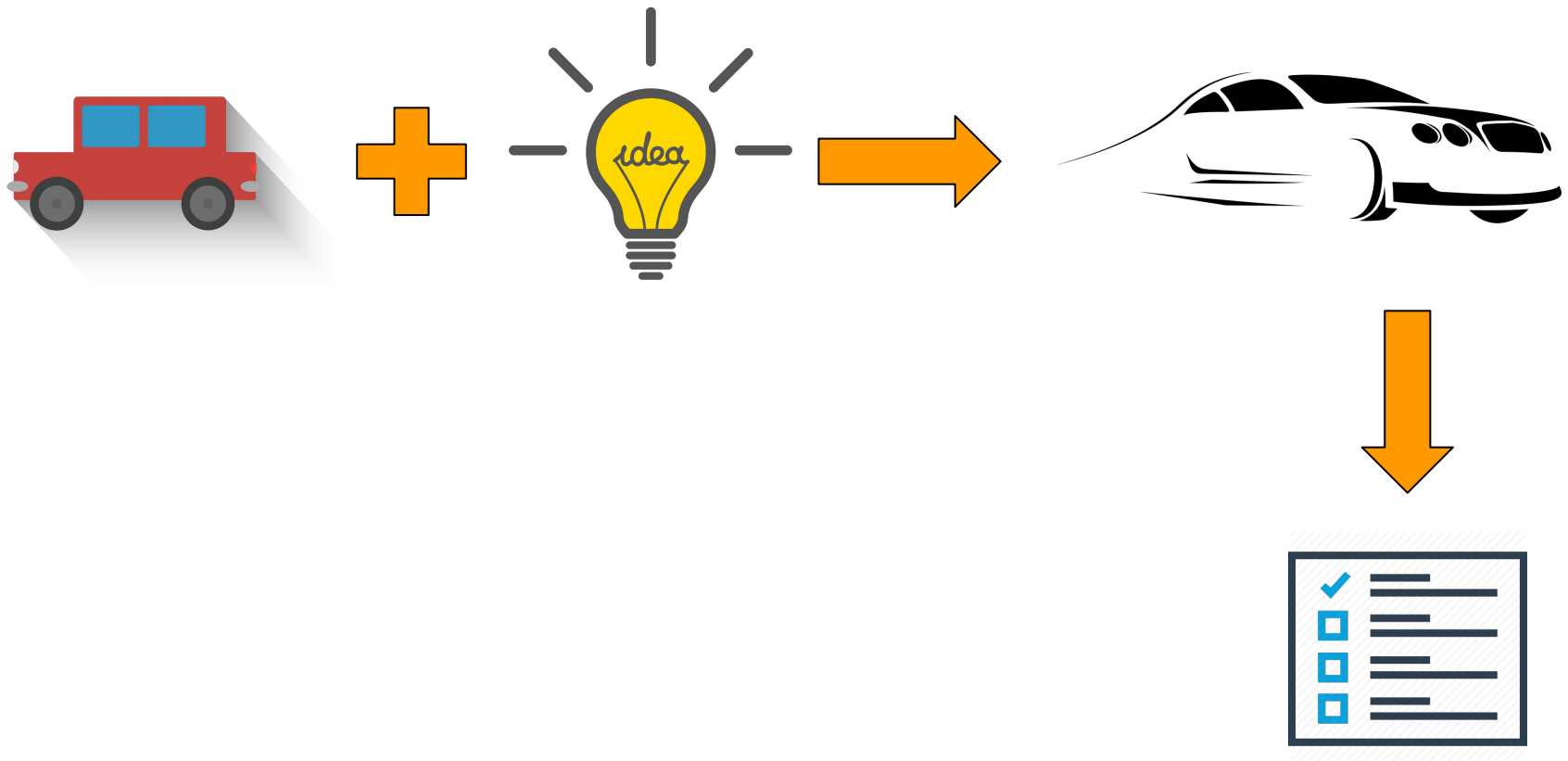
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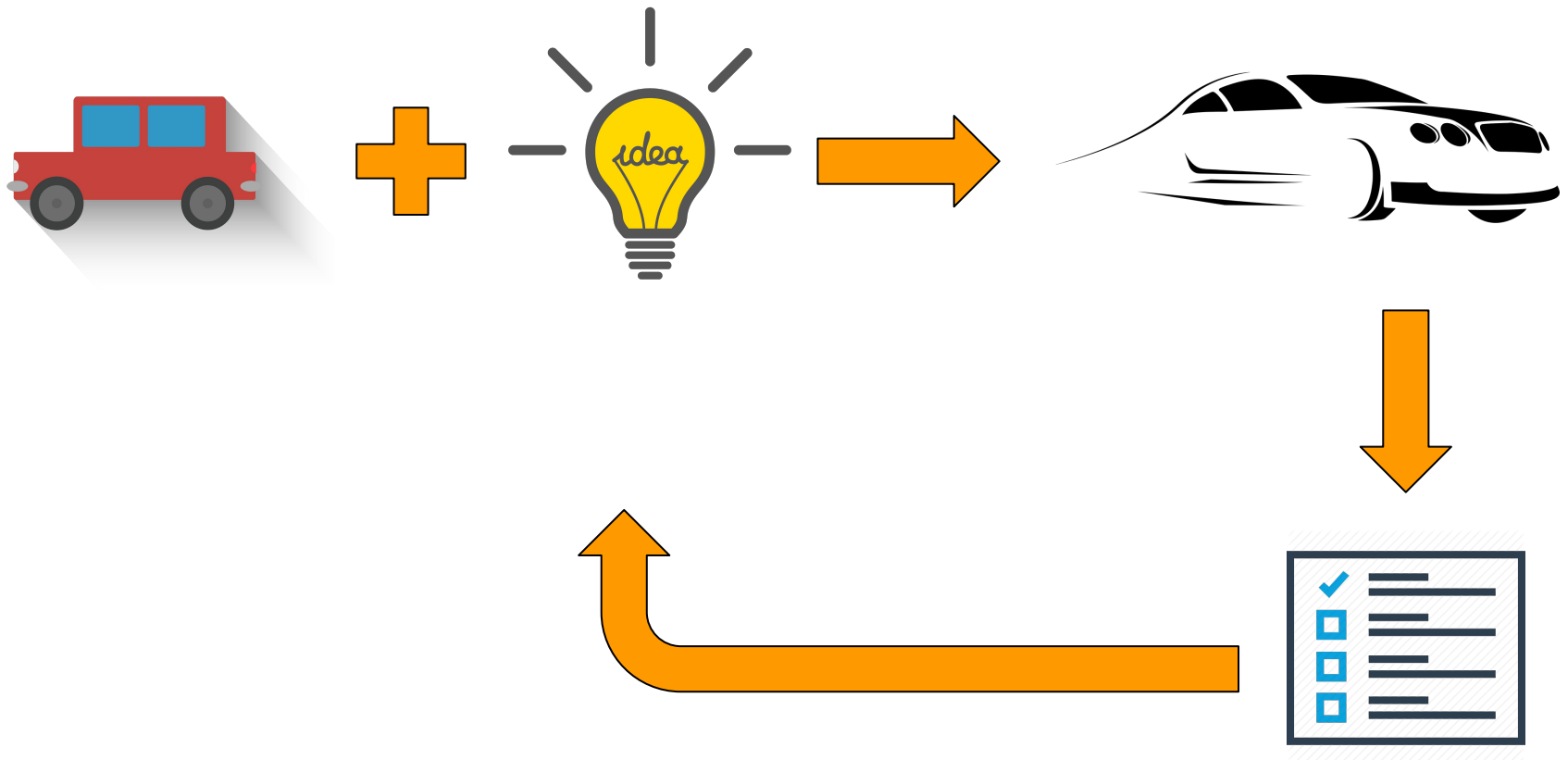
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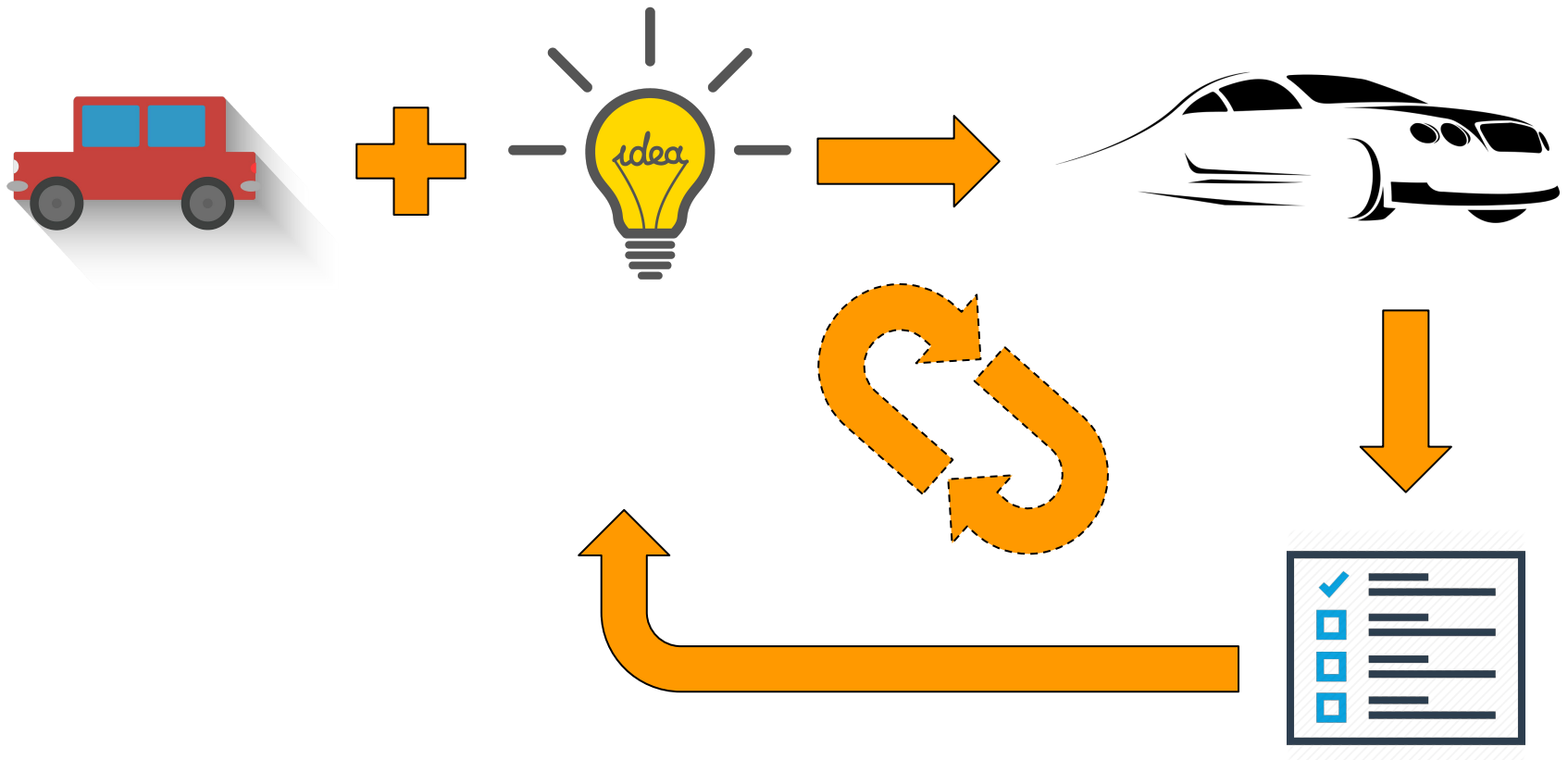
MDB (Model Based Development)



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Validation Process



Validation Process



- ❖ Use of block diagram tools (Simulink, Gt suite)
- ❖ Powerful Tools but complex

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- ❖ Use of natural languages
- ❖ Involves time events...

- ❖ Not rigorous
- ❖ Not Machine interpretable

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**FORMAL
METHODS !**

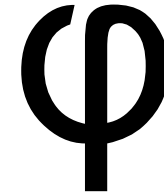
Validation Process



Validation Process

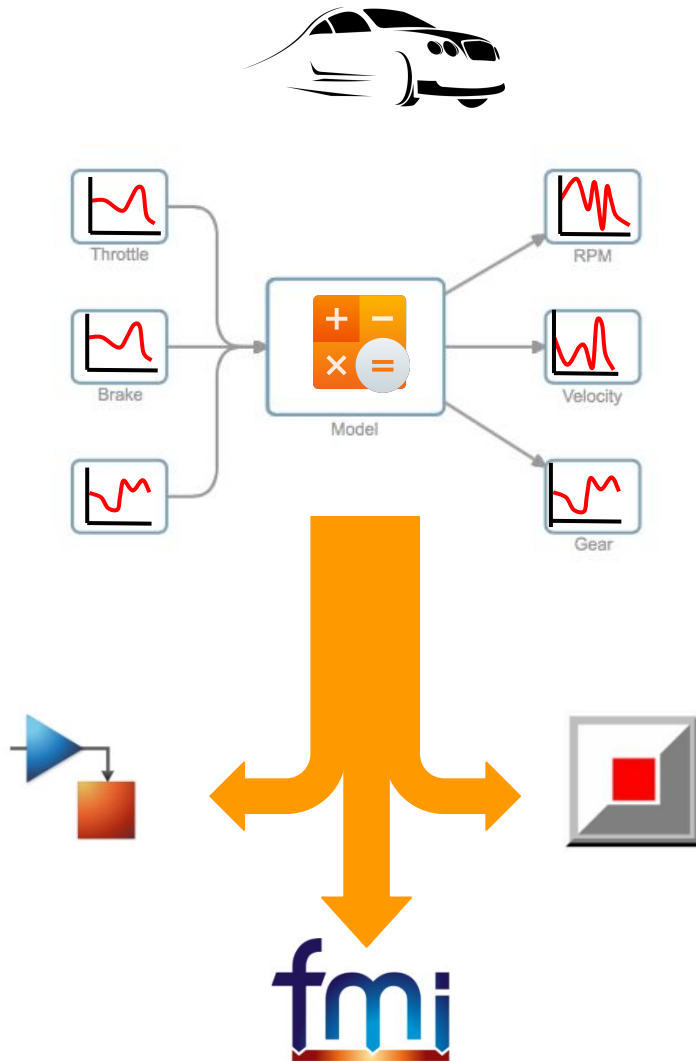


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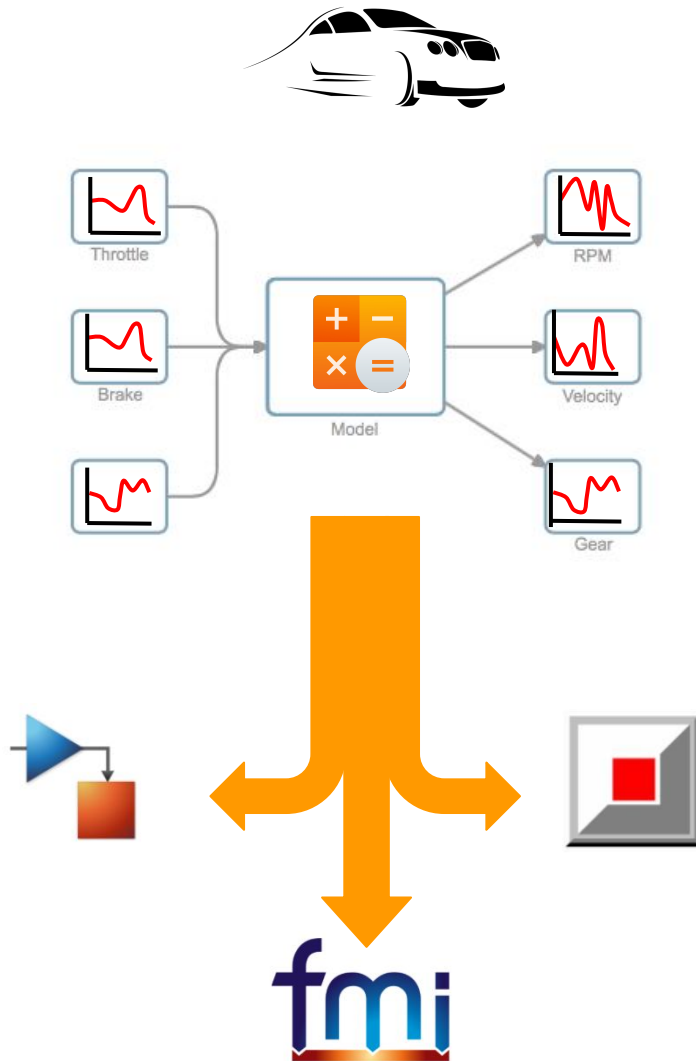


Validation Process

ϕ



Validation Process



ϕ

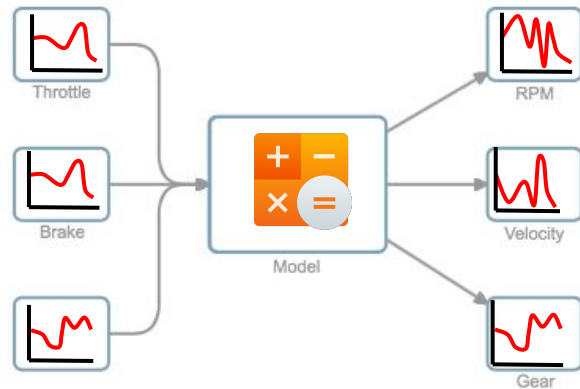


“If the engine speed (w) is always less than k_1 then vehicle speed (v) can not exceed k_2 in less than T sec”



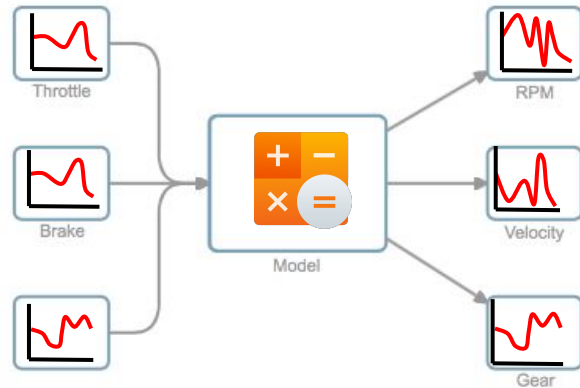
$$\neg (F_{[0,T]} (v \geq k_2) \wedge G(w \leq k_1))$$

Robustness Semantics

 $\models$ φ

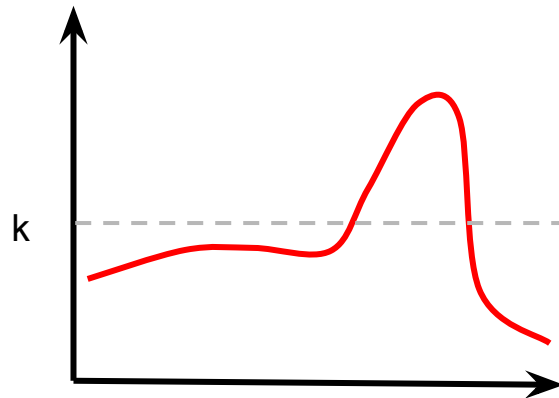
?

Robustness Semantics



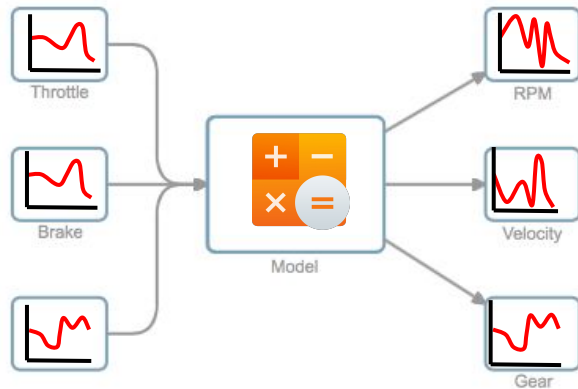
$\models$ φ ?

$F(f > k)$



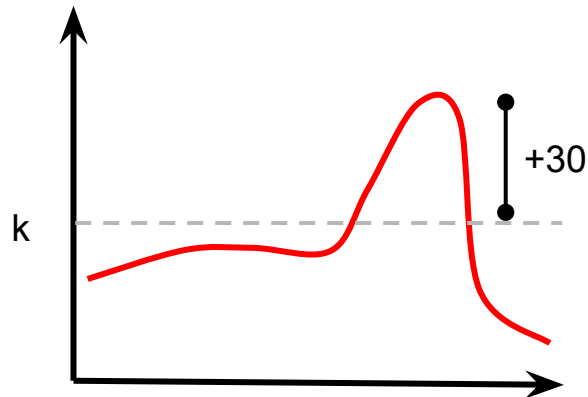
Boolean	
yes/no	

Robustness Semantics

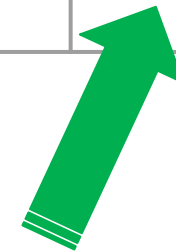


$\models$ φ ?

$F(f > k)$

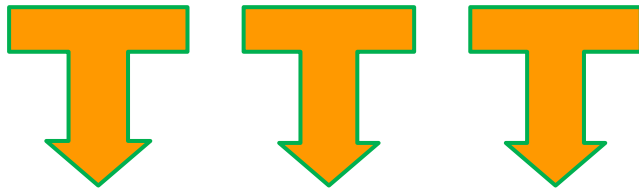
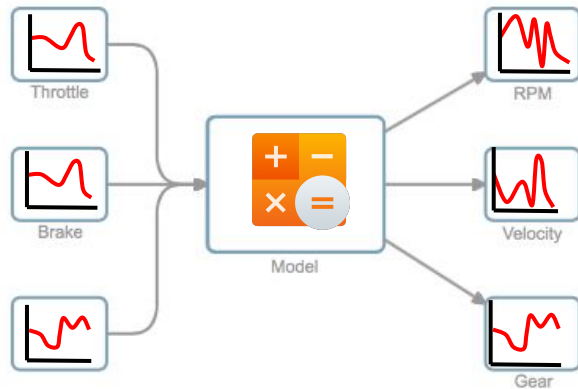


Boolean	Robustness
yes/no	+30 / -30



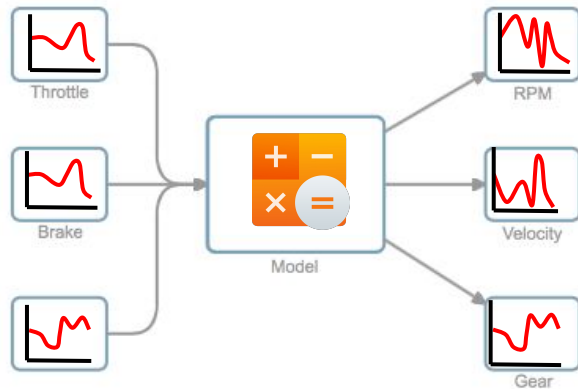
More Information!

The goal



$f \longrightarrow M \longrightarrow M(f)$

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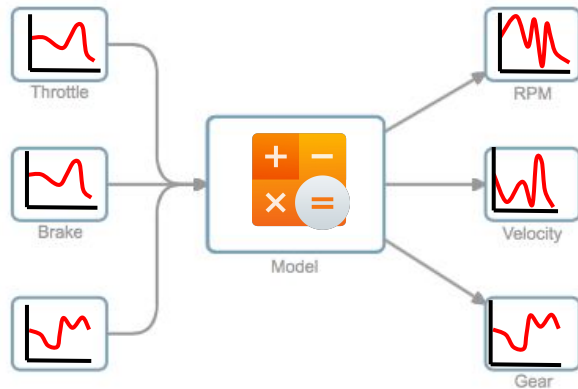


$f \longrightarrow M \longrightarrow M(f)$

The optimization Problem

$$R = \min_{f \in F} [M(f), \varphi]$$

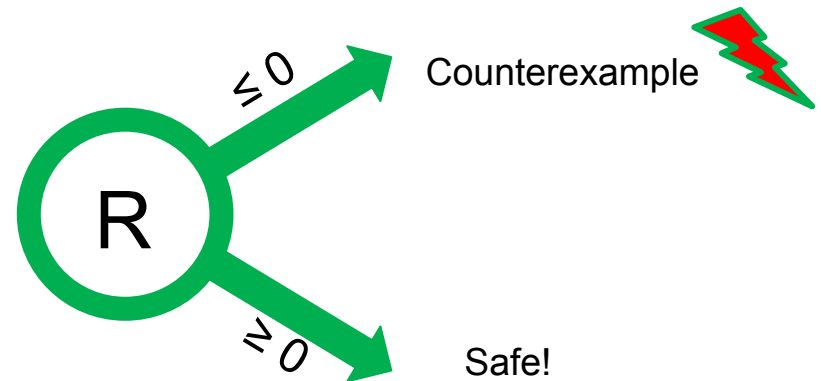
The goal



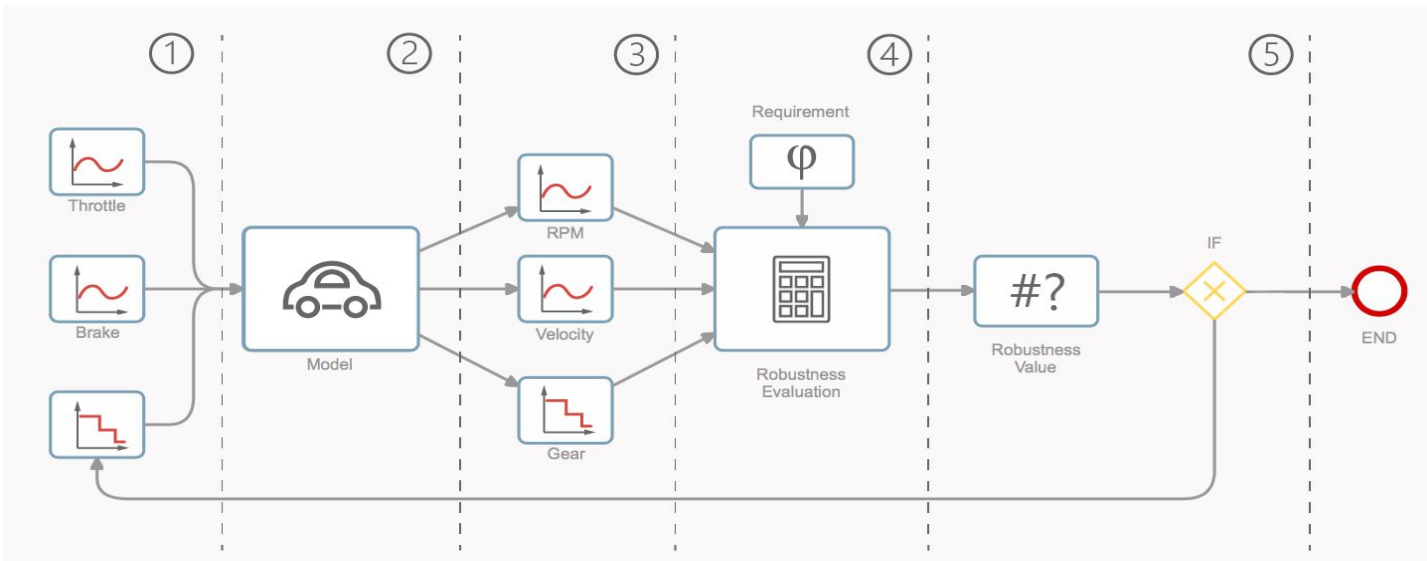
$f \longrightarrow M \longrightarrow M(f)$

The optimization Problem

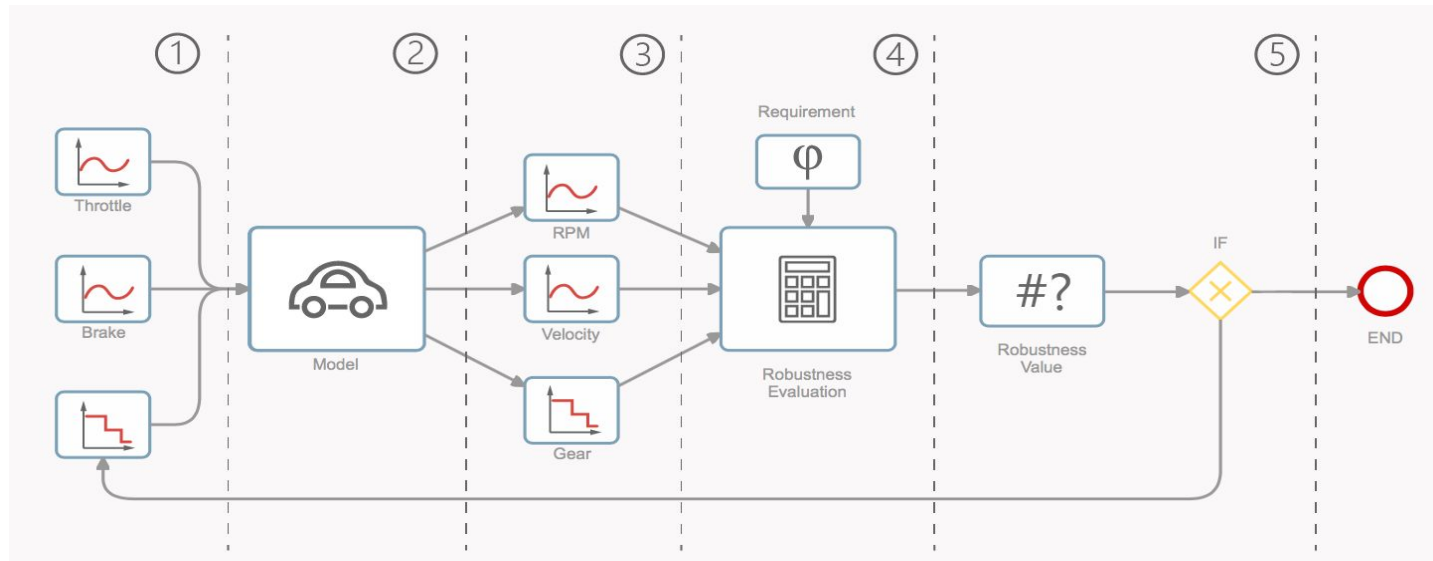
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The optimization process



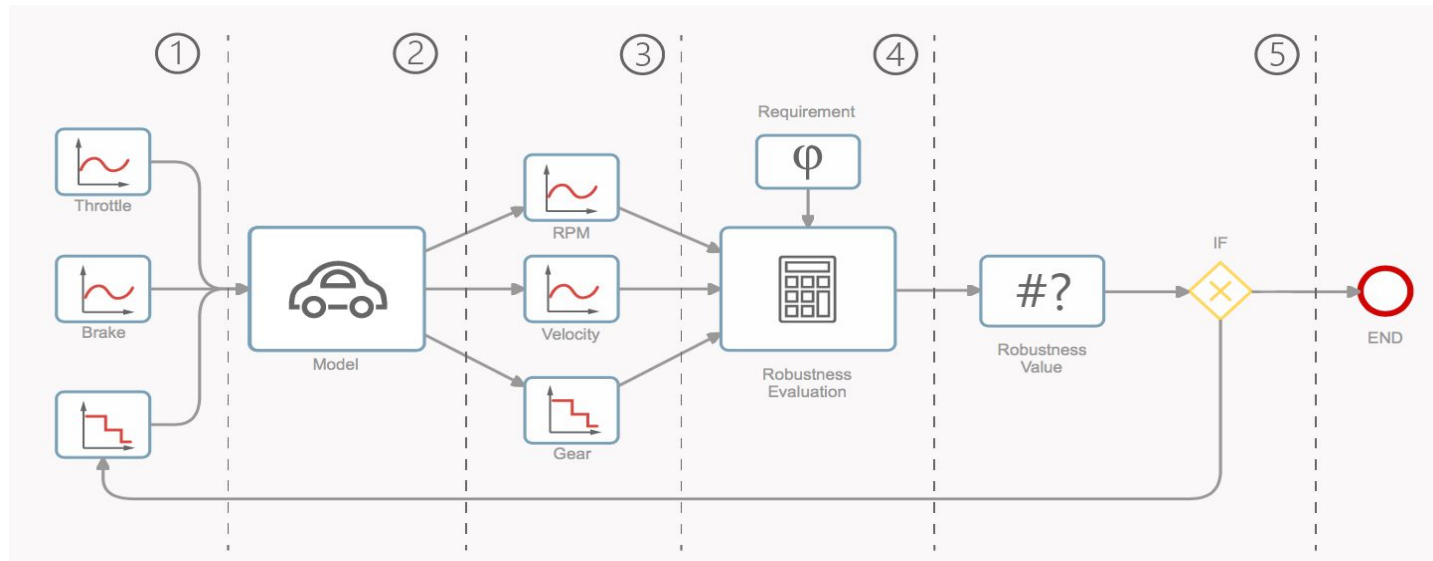
The optimization process



Challenges

- ❖ Low number of model execution
- ❖ Inputs are functions (temporal series)!!

The optimization process



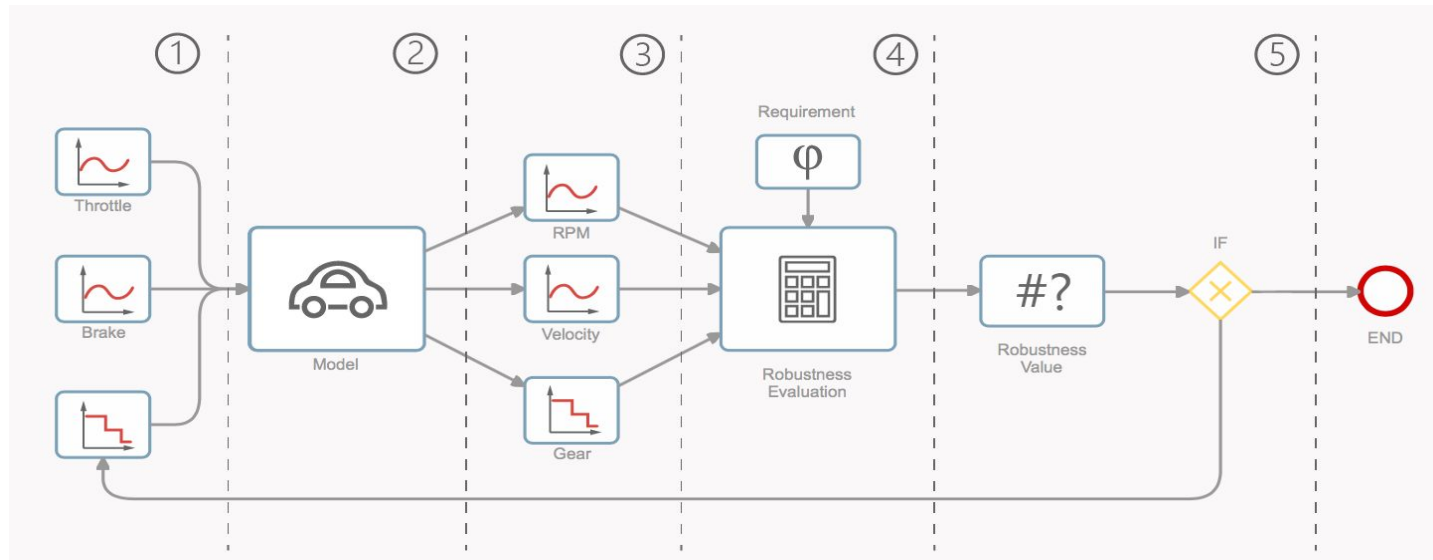
Challenges

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The optimization process



Challenges

❖ Low number of model execution



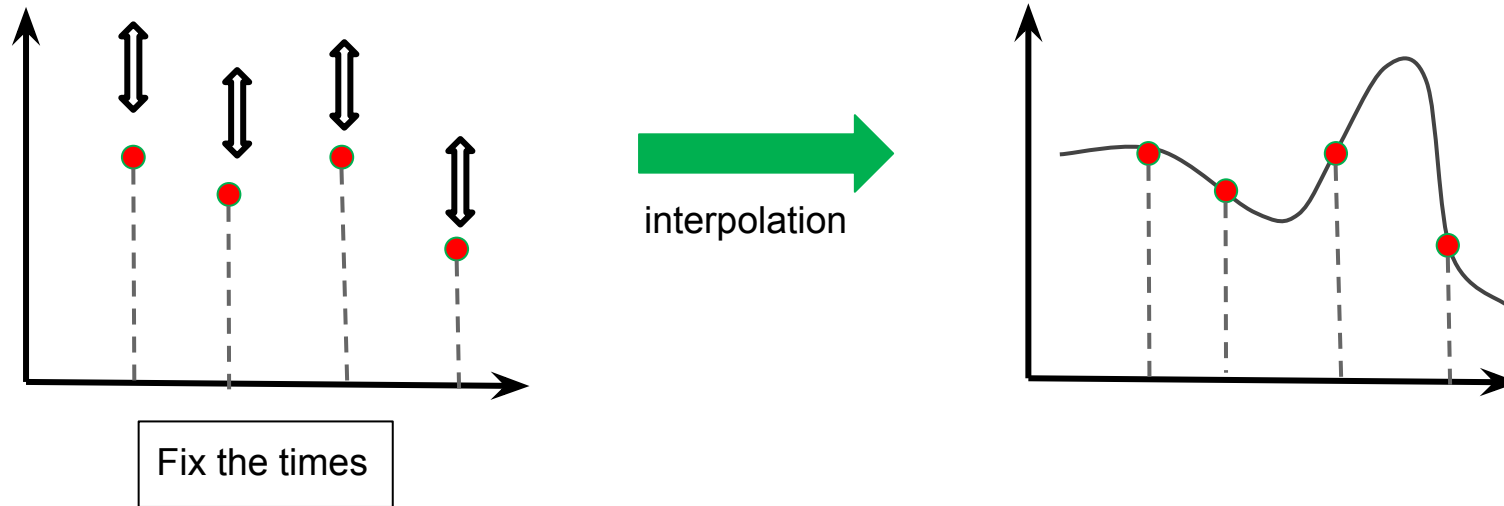
GP-UCB

❖ Inputs are functions (temporal series)!!

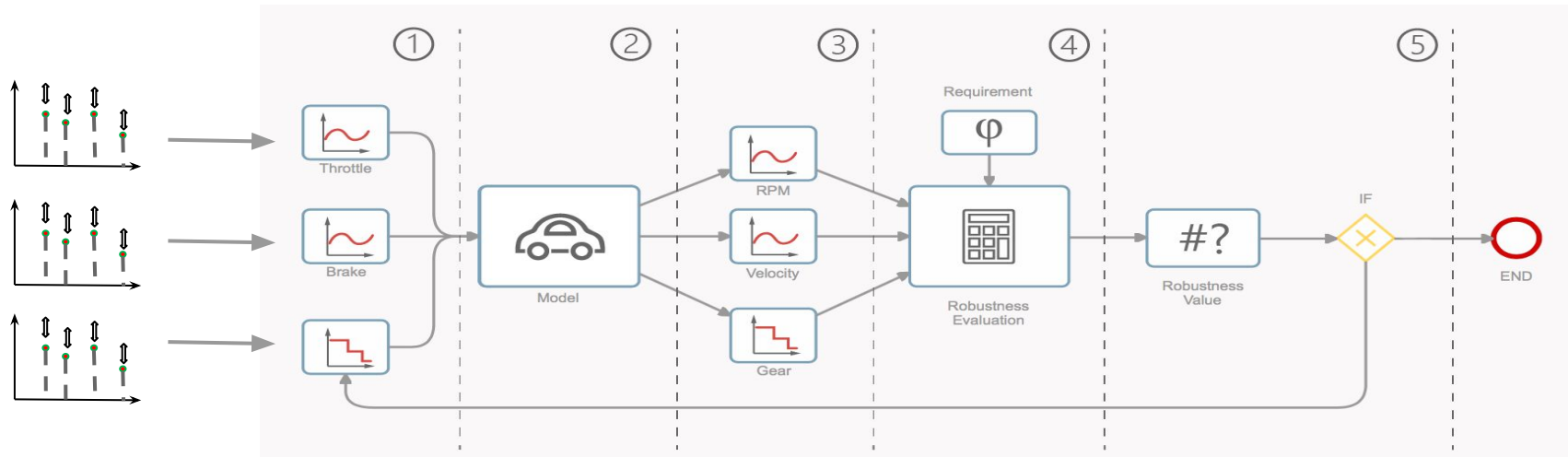
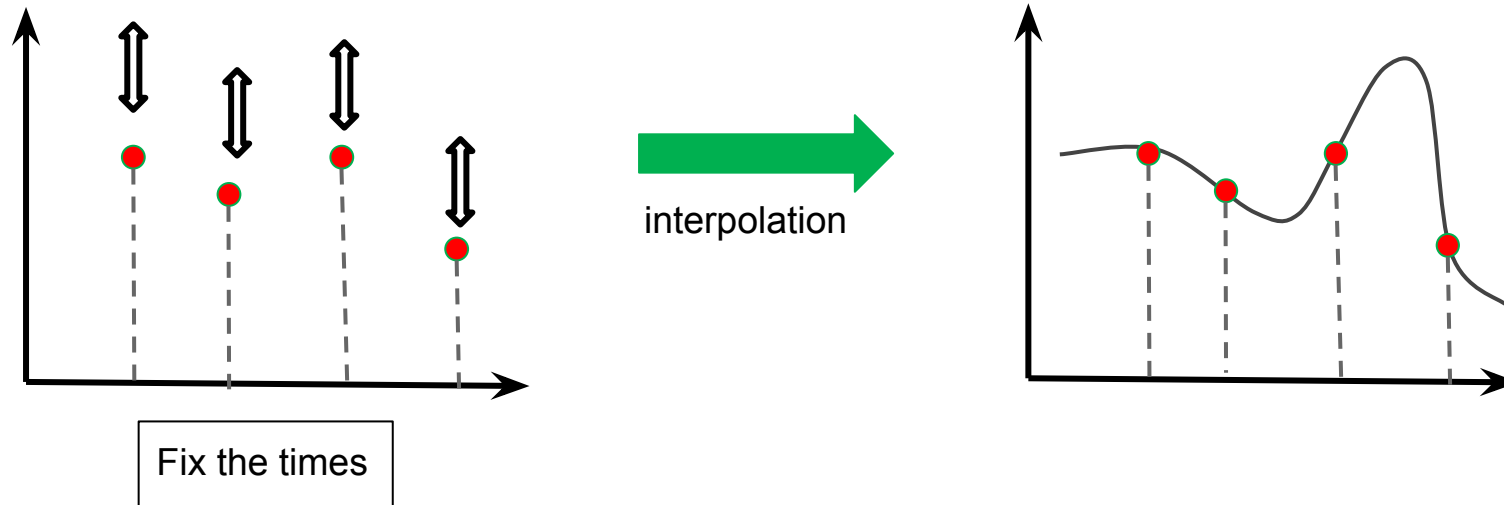


Adaptive Control Point
Parametrization

The Control Point Parametrization

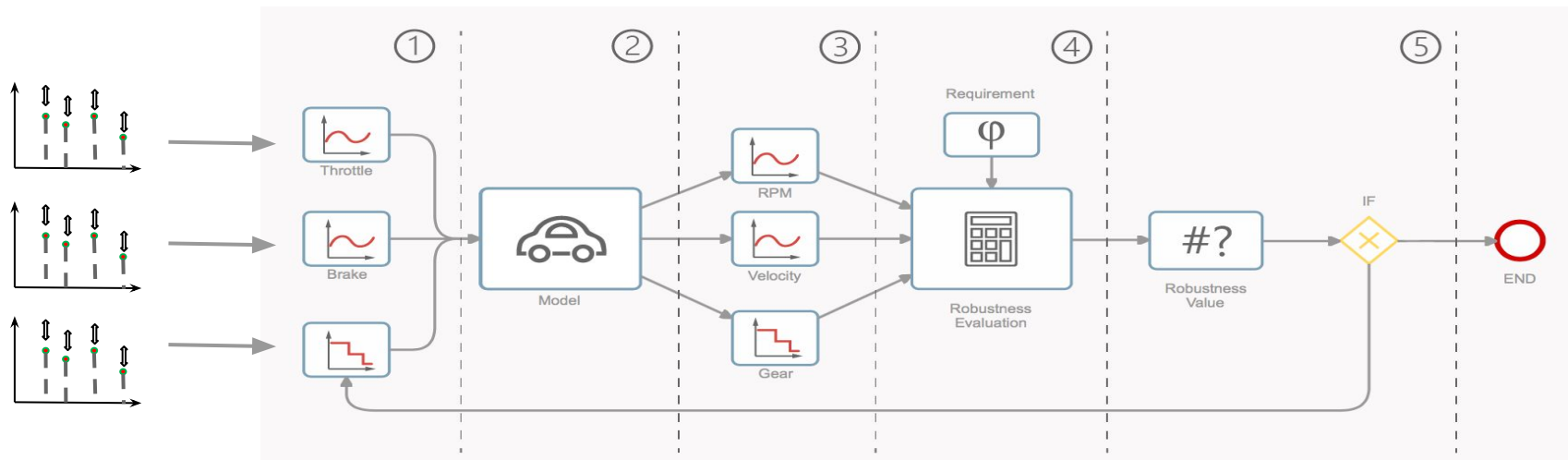
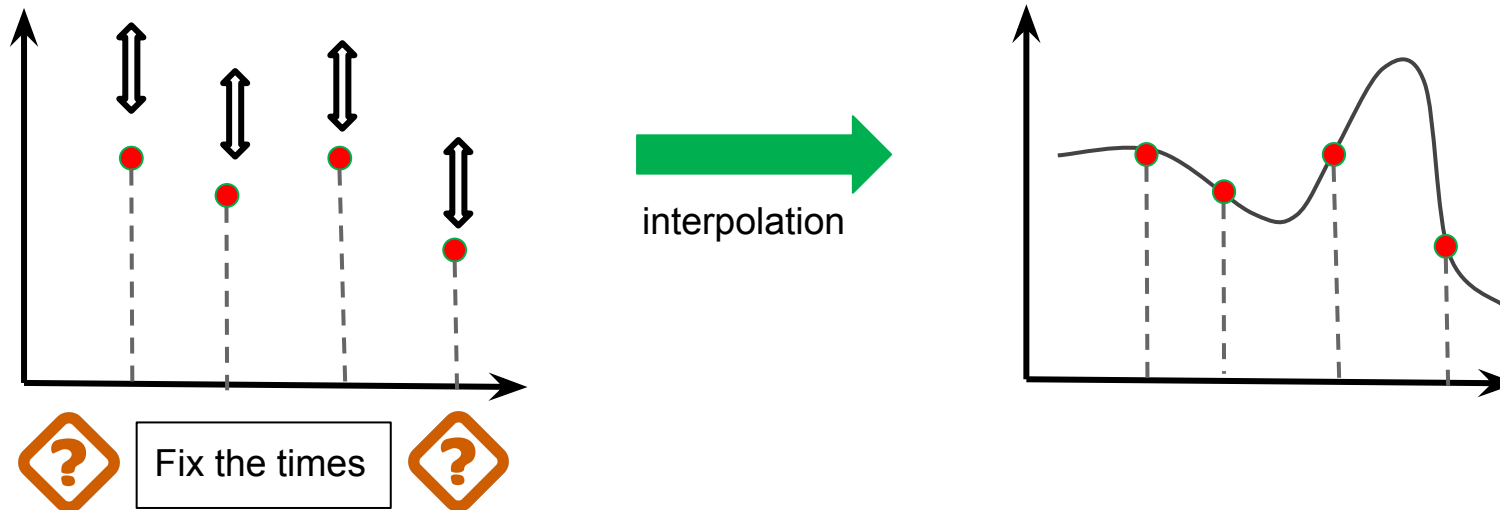


The Control Point Parametrization



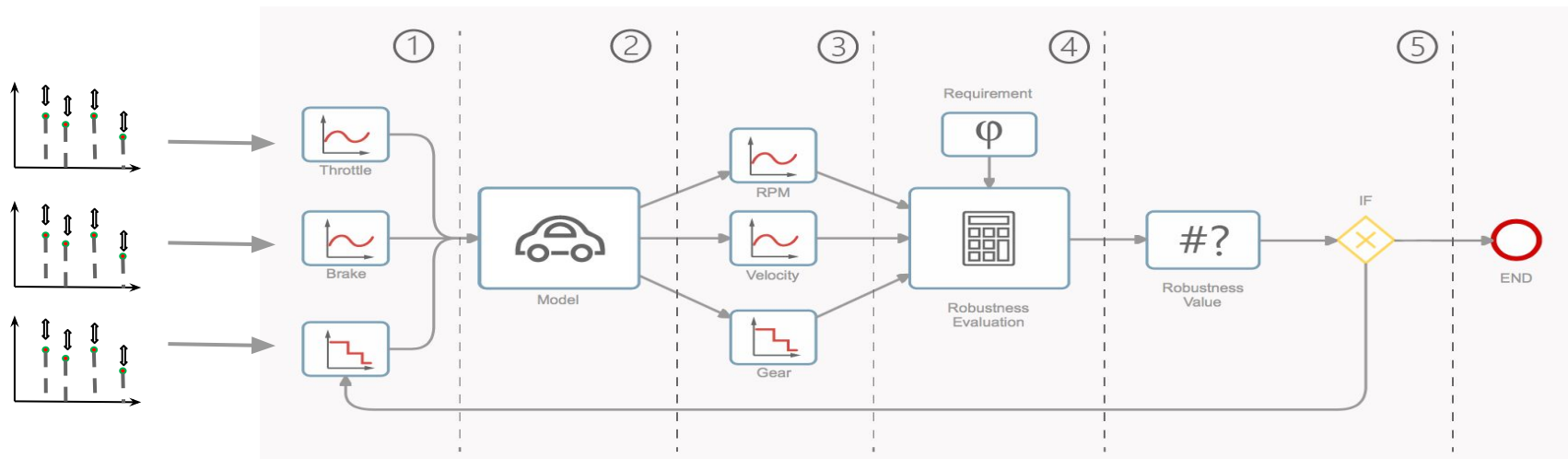
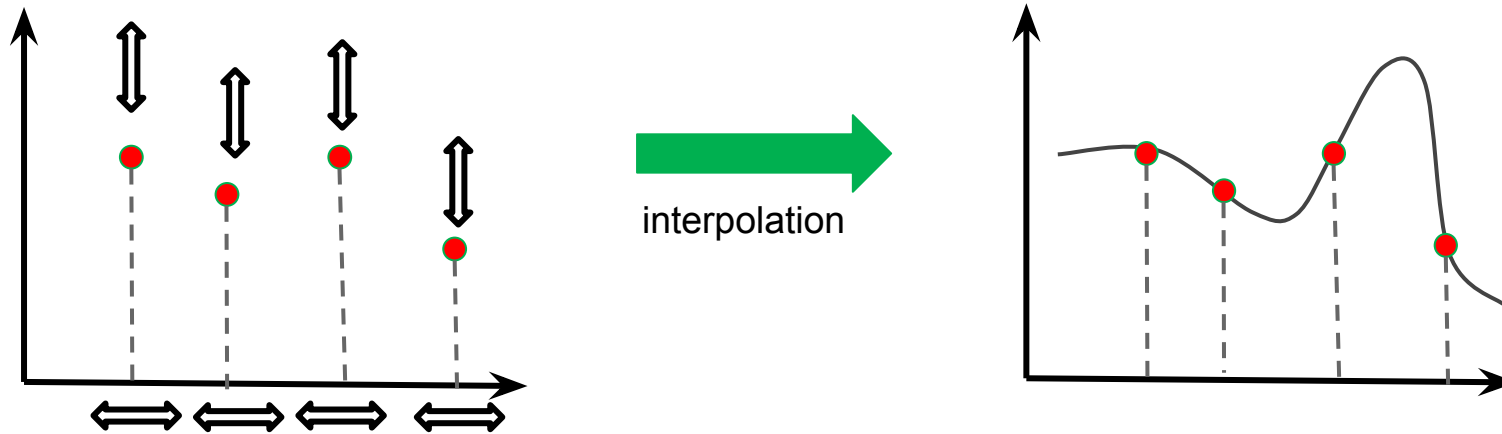
n Control Points $\longrightarrow$ n Variable to optimize

The Control Point Parametrization



n Control Points  n Variable to optimize

The adaptive Control Point Param.



n Control Points $\longrightarrow$ $2n$ Variable to optimize

Problem

Increase the expressivity

but...

Doubled the variables



Problem

Increase the expressivity

but...

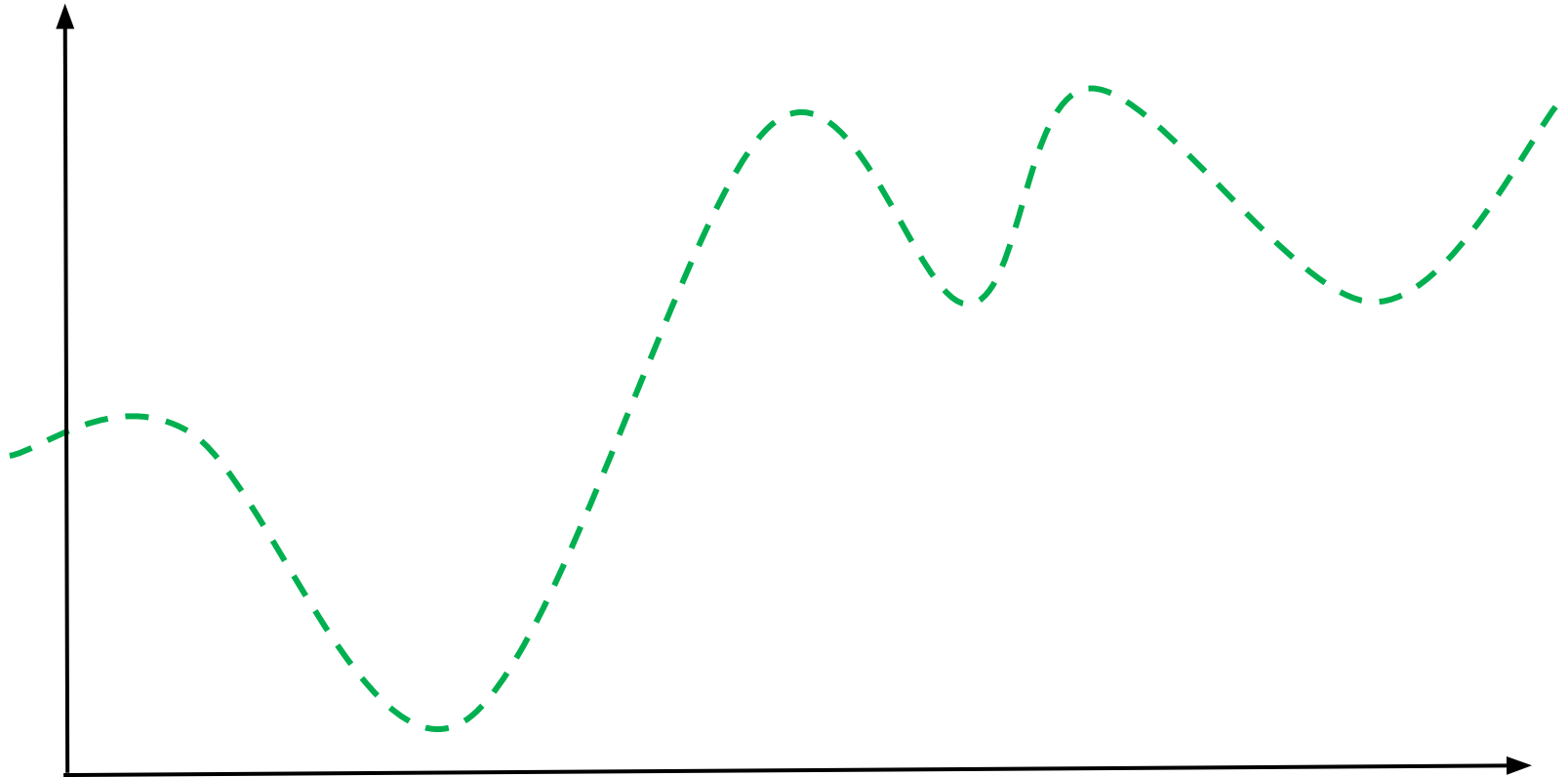
Doubled the variables



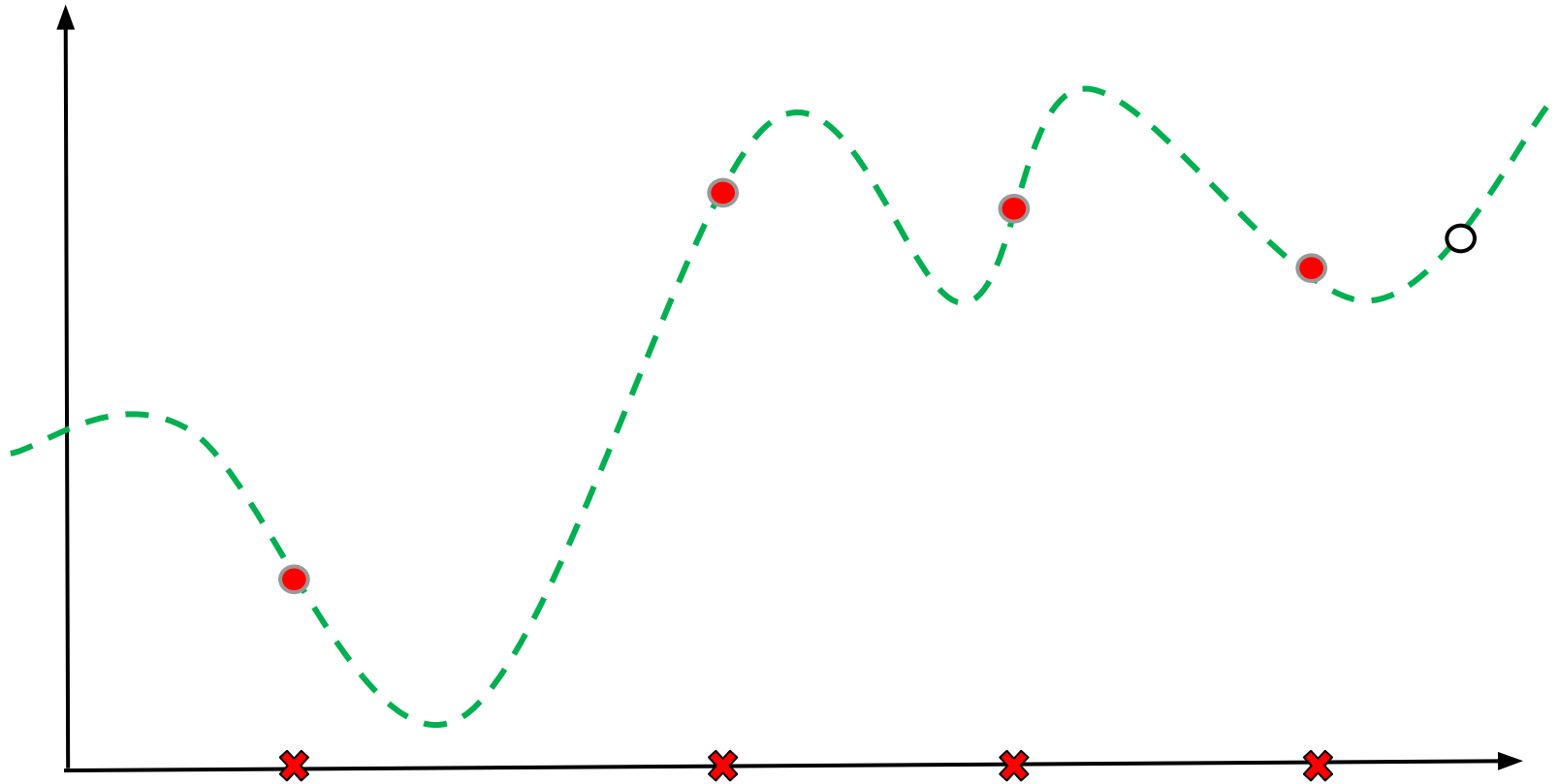
Solution

GP-UCB Optimizer

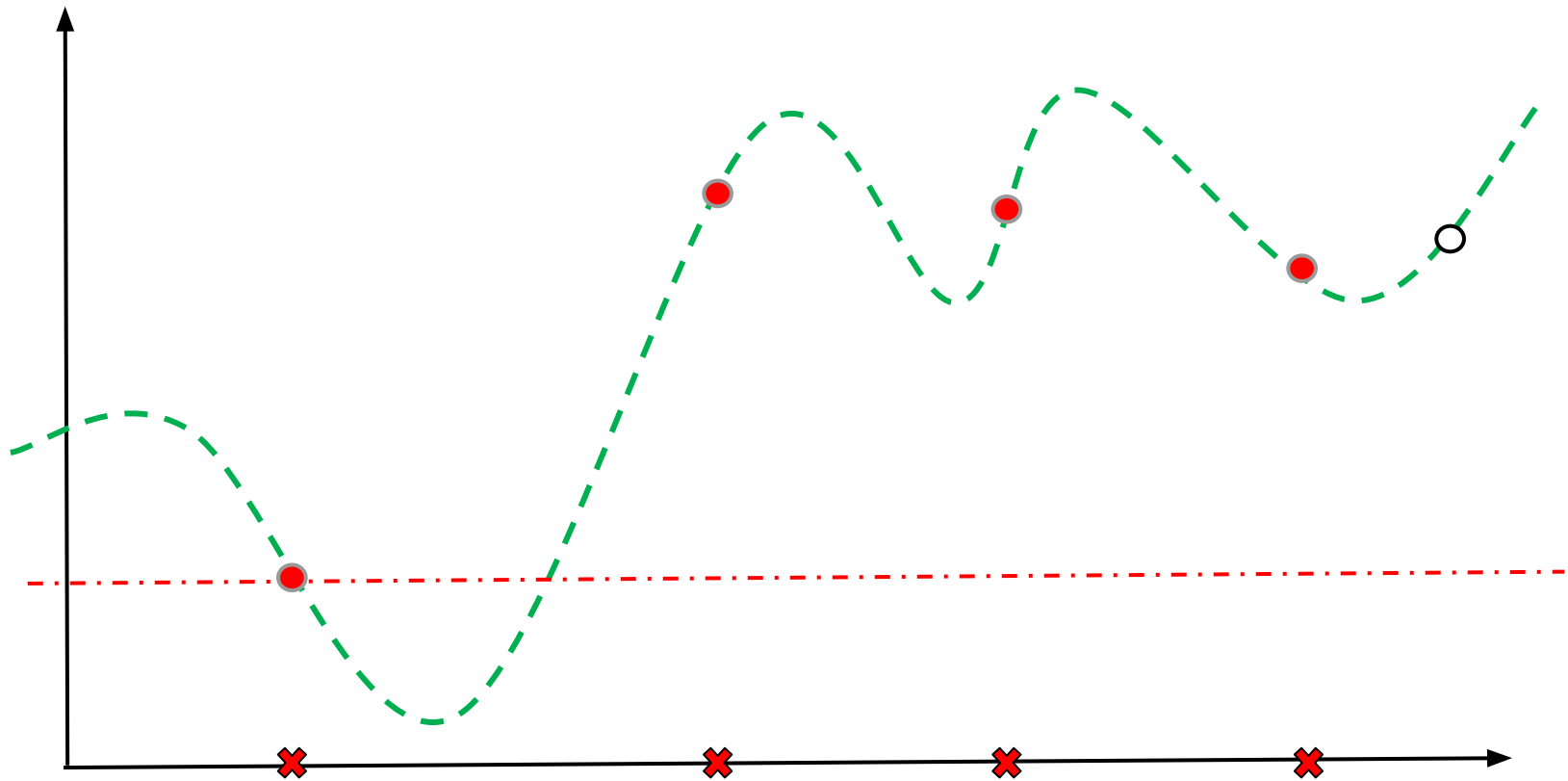
GP-UCB



GP-UCB

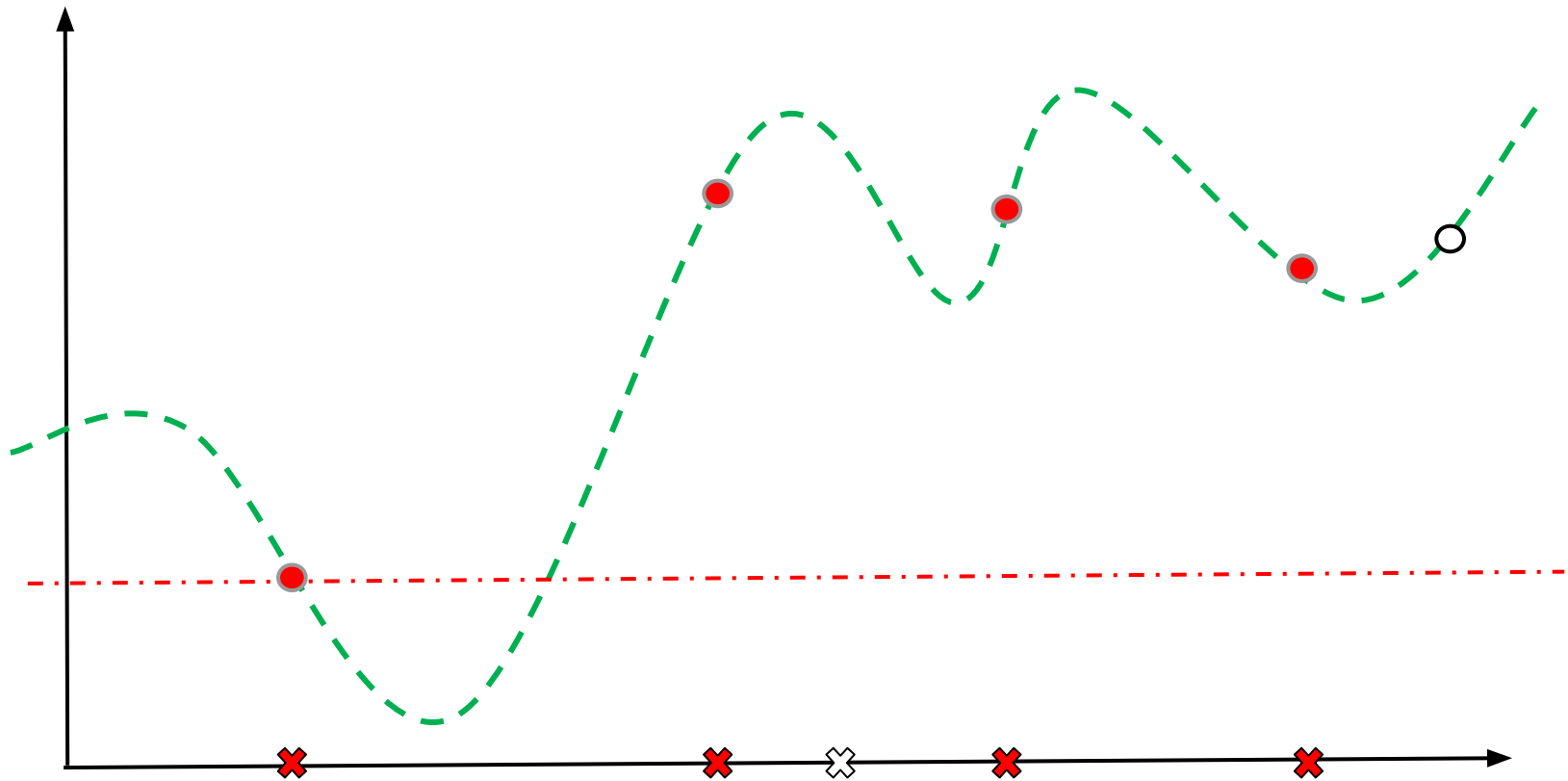


GP-UCB

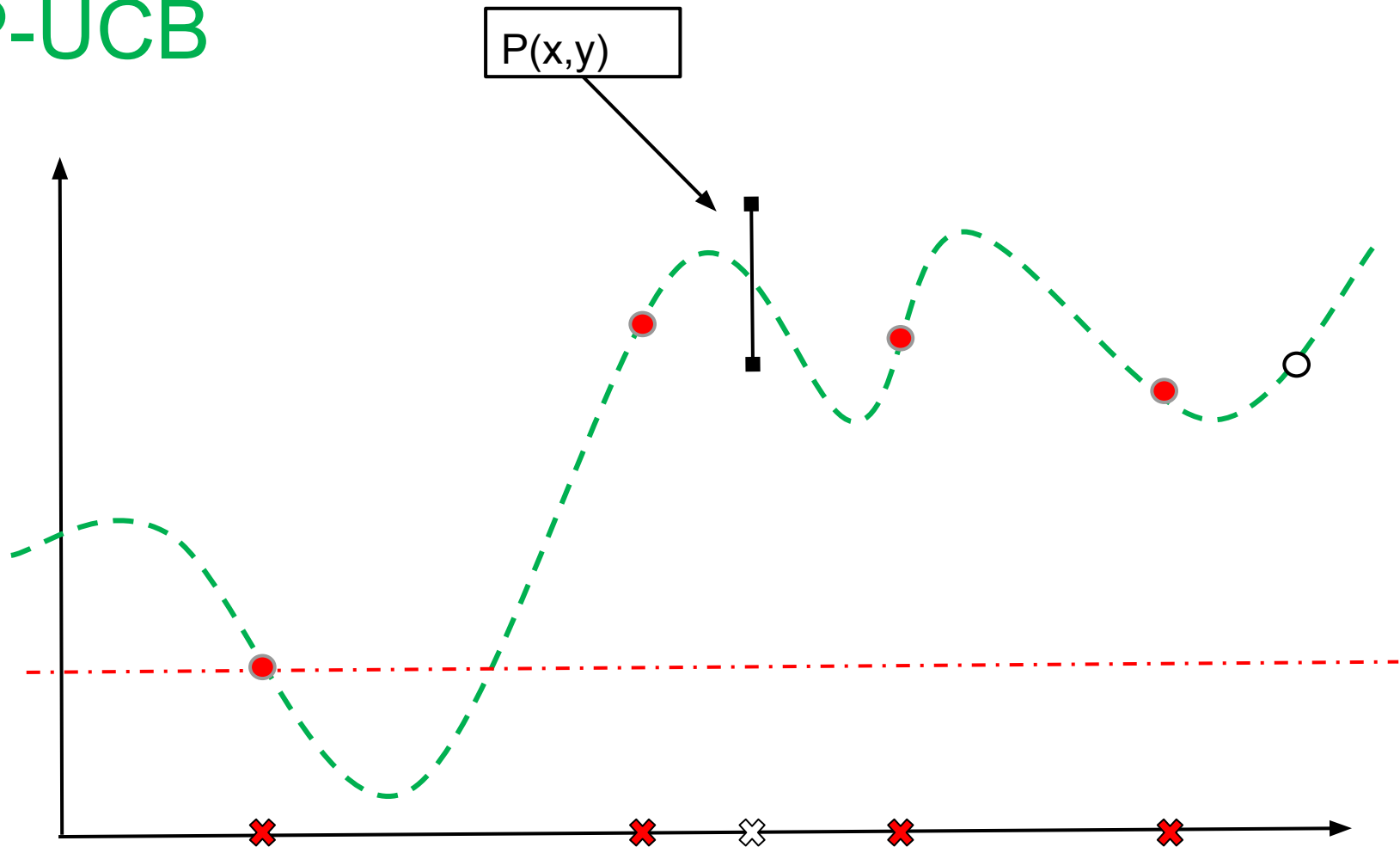


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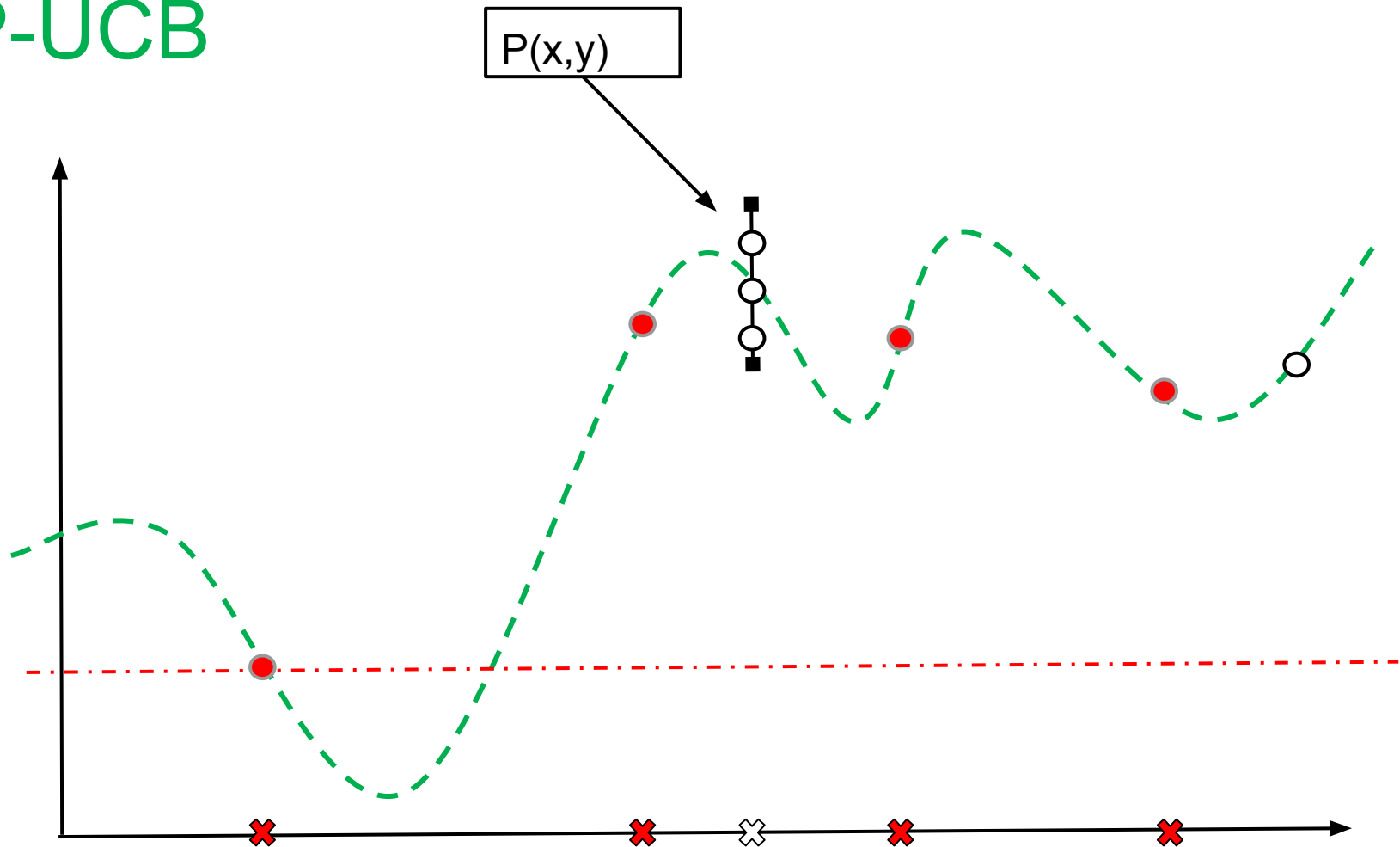
$$P(x,y)$$



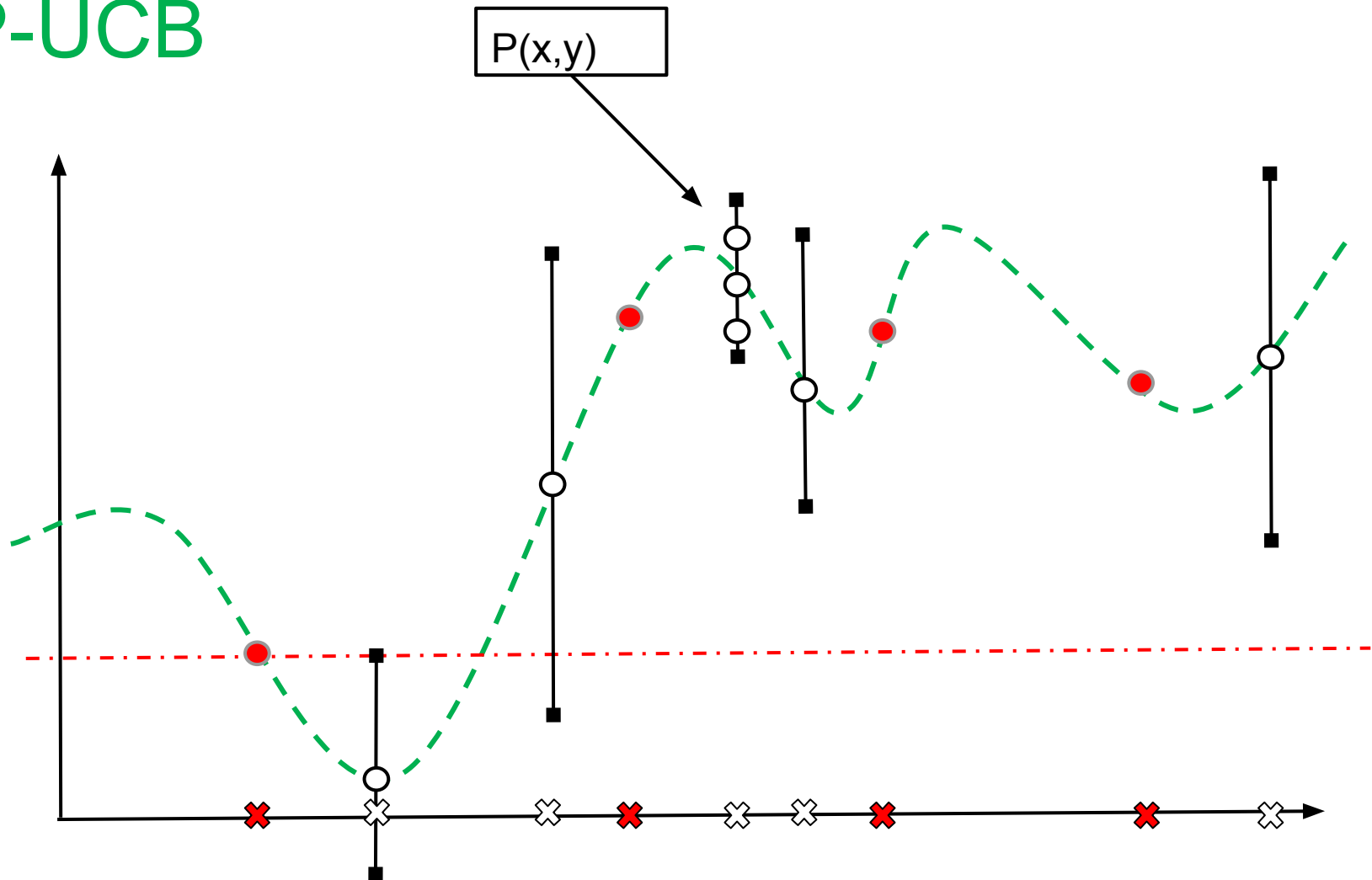
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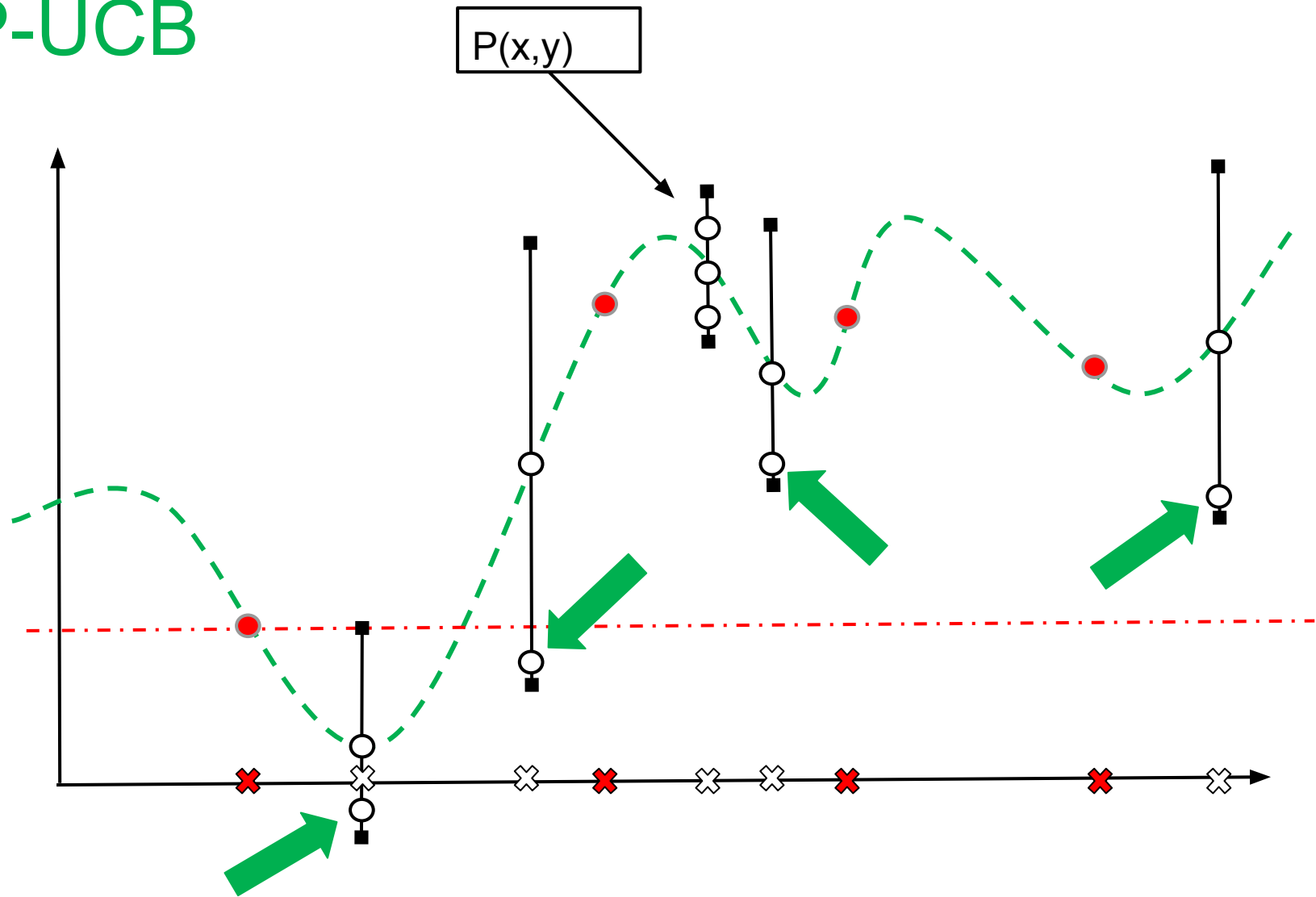
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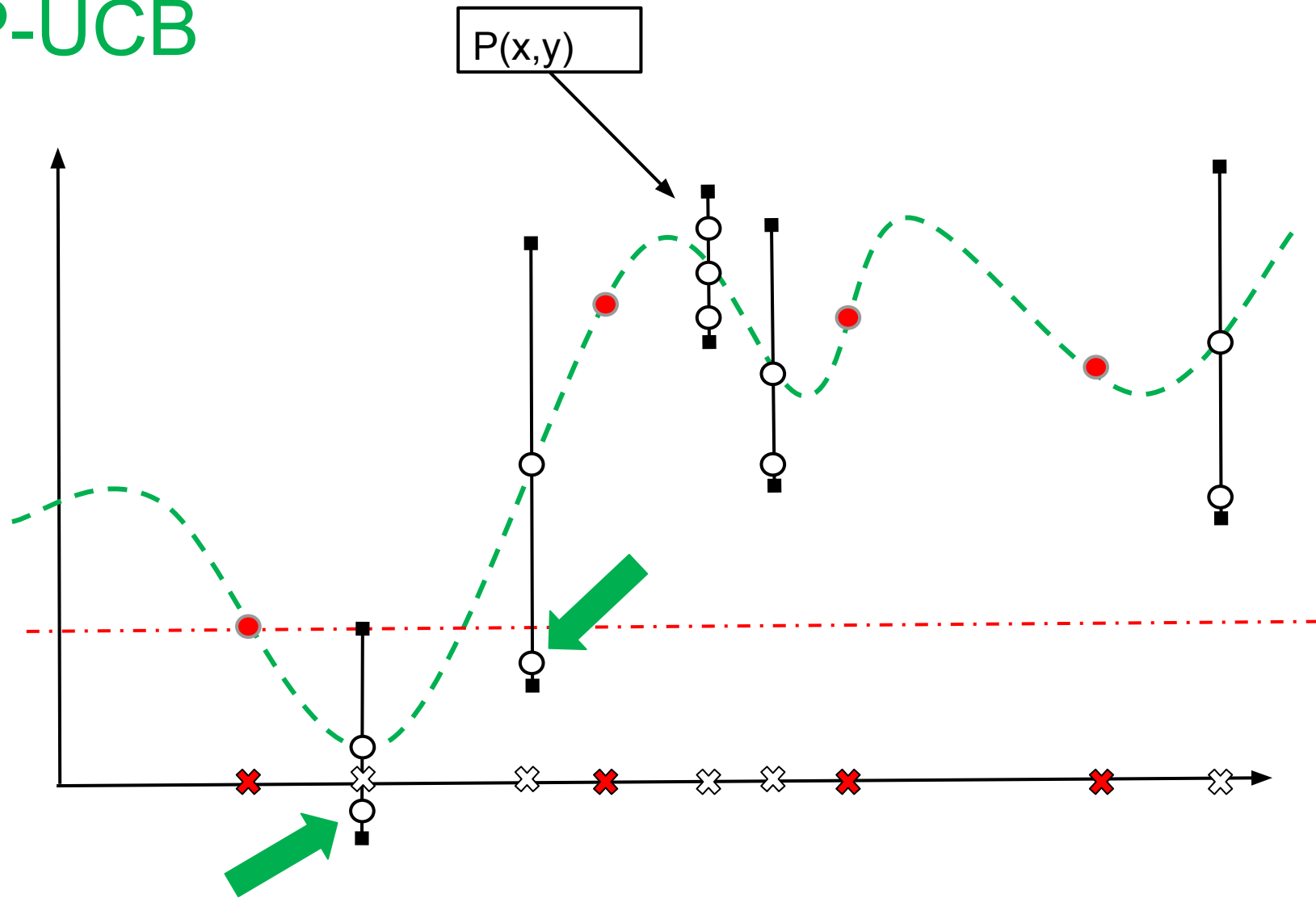
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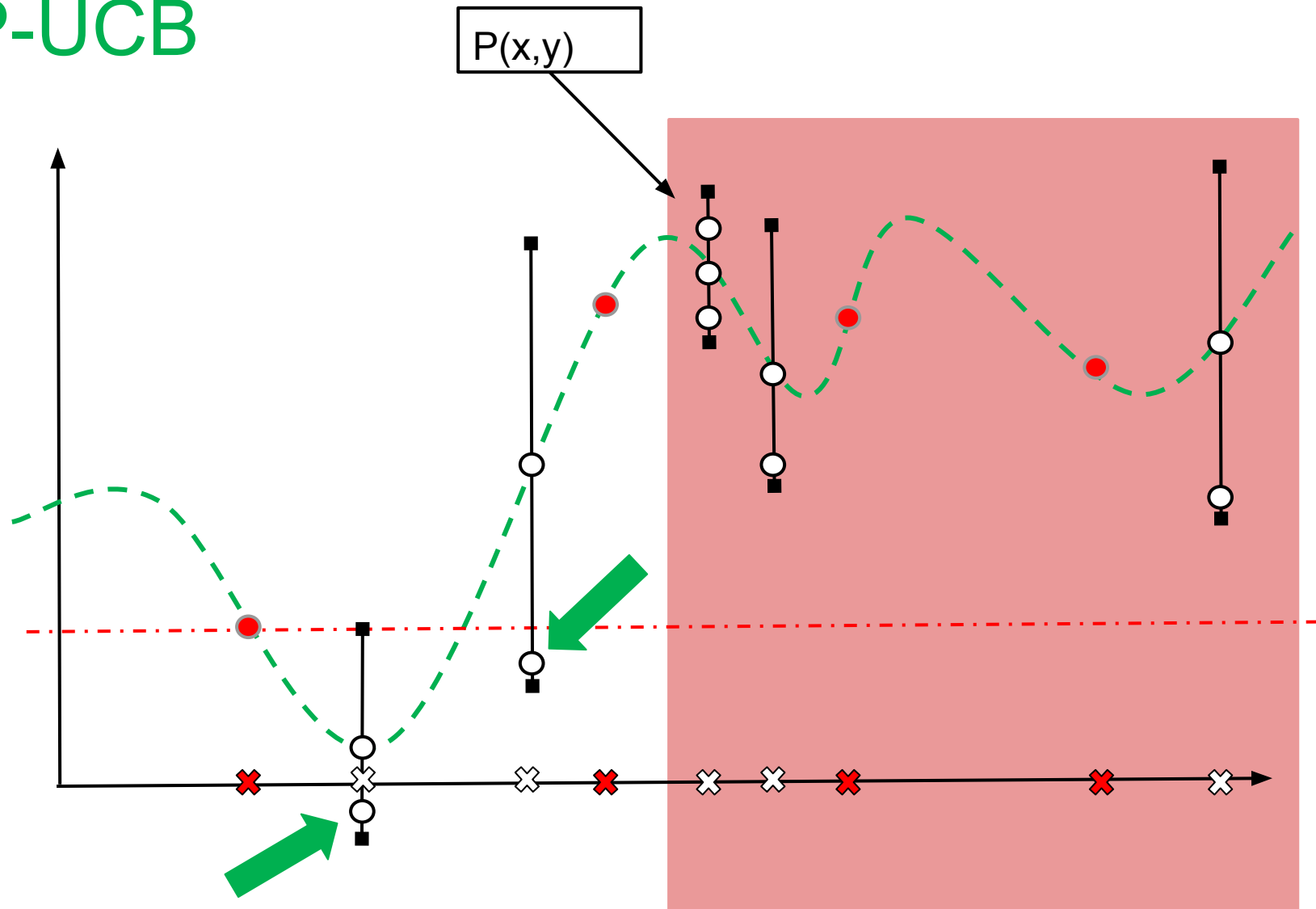
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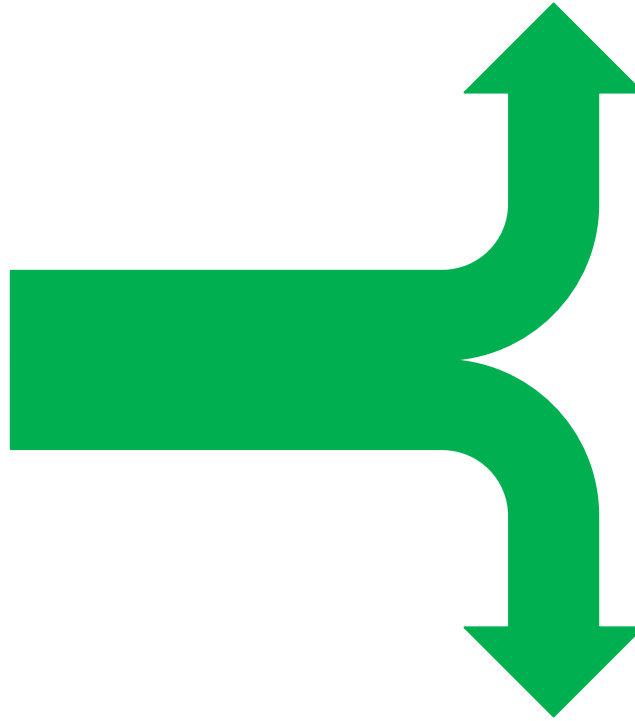
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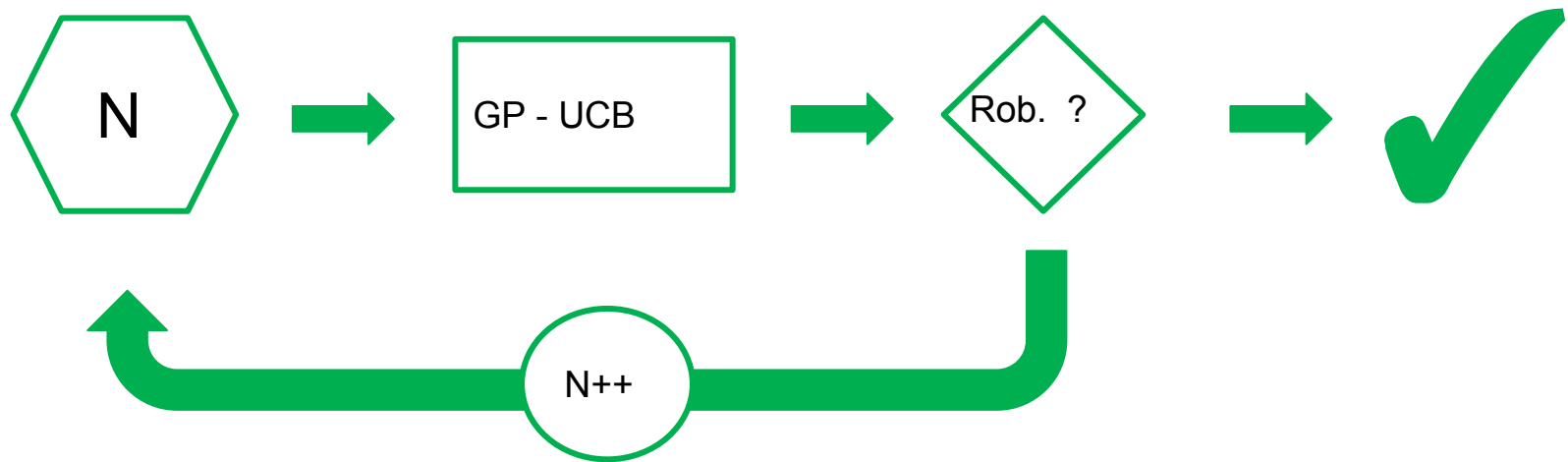
GP-UCB



Doubled the variables
Reduce Input Space



Schema

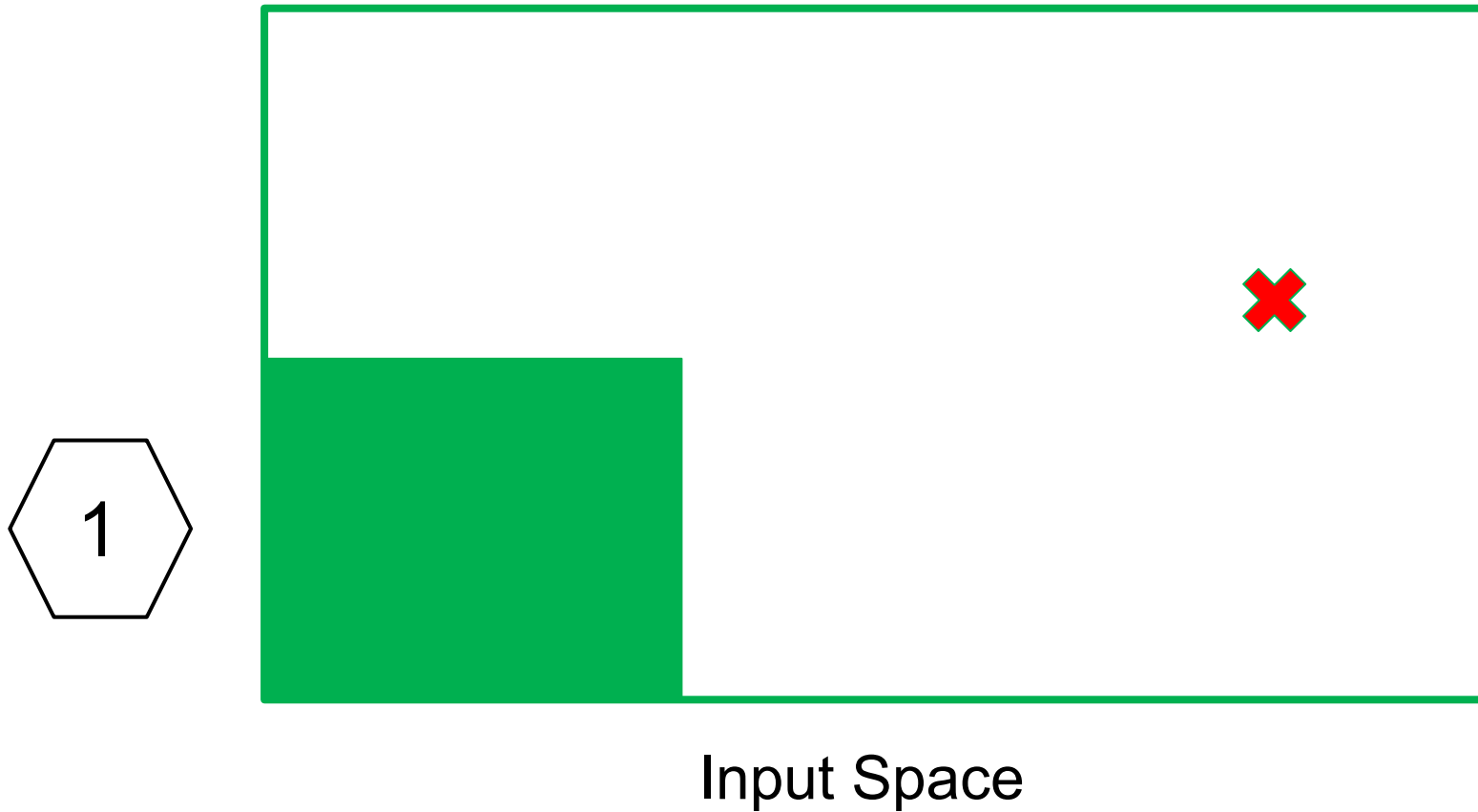


Adaptive Idea

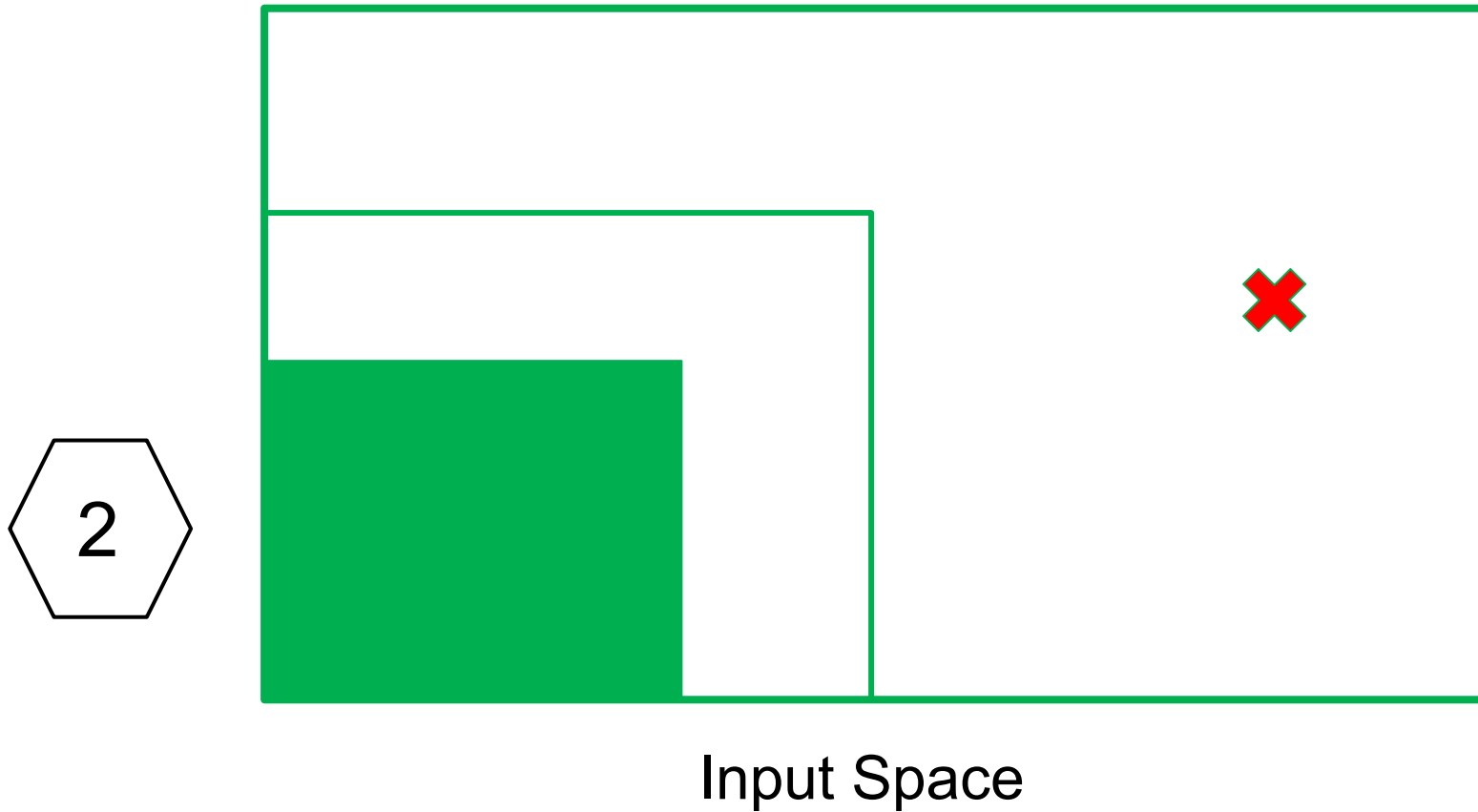


Input Space

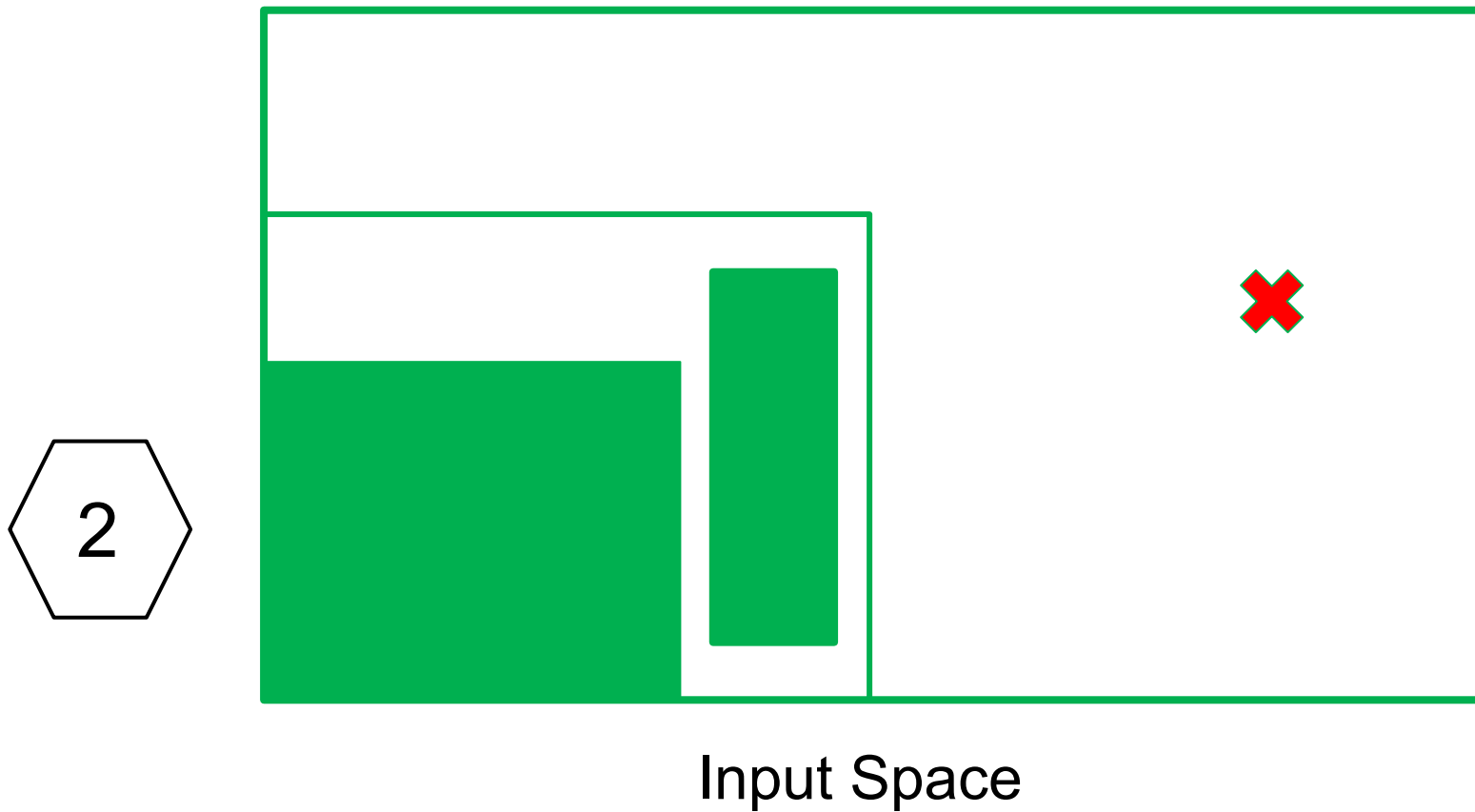
Adaptive Idea



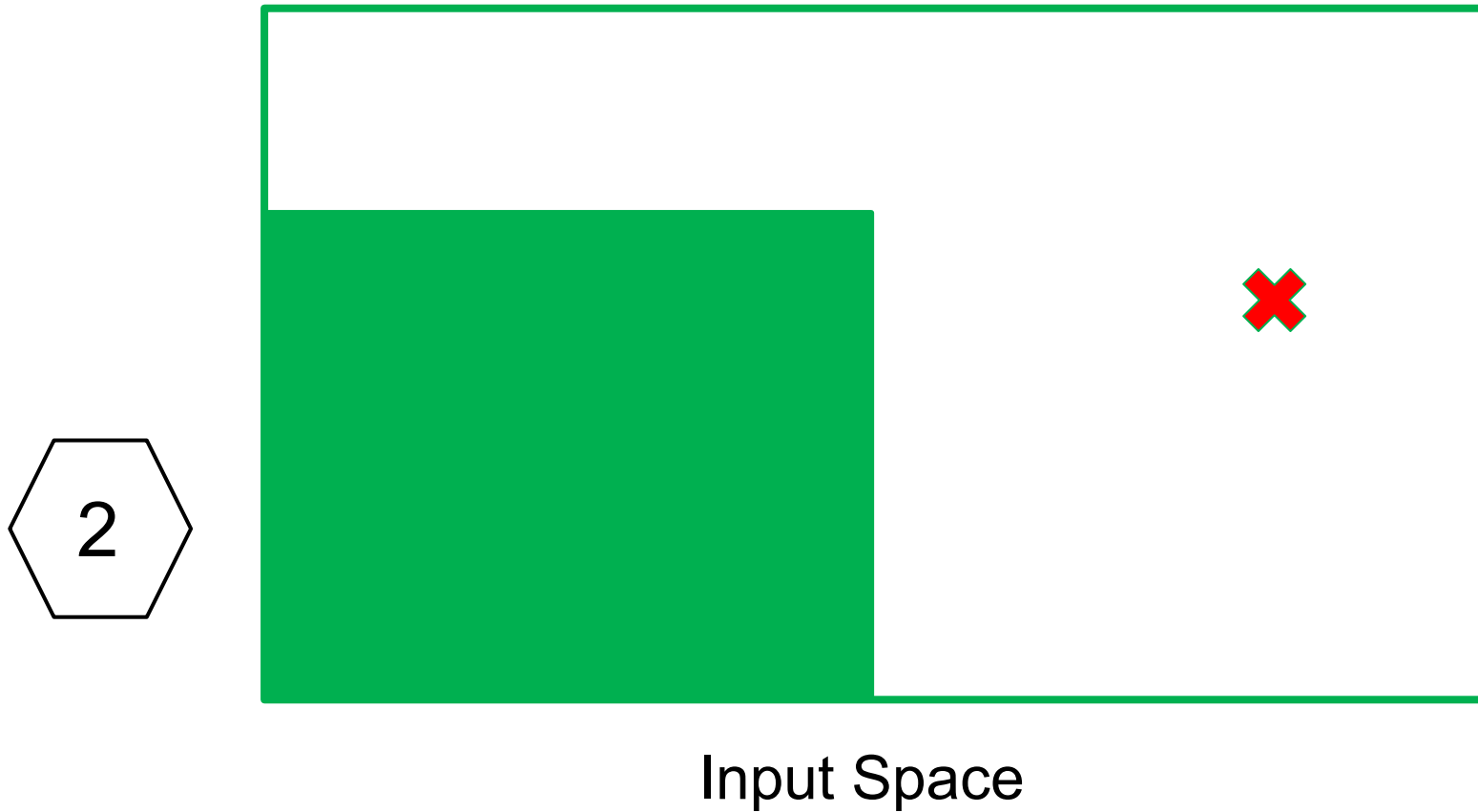
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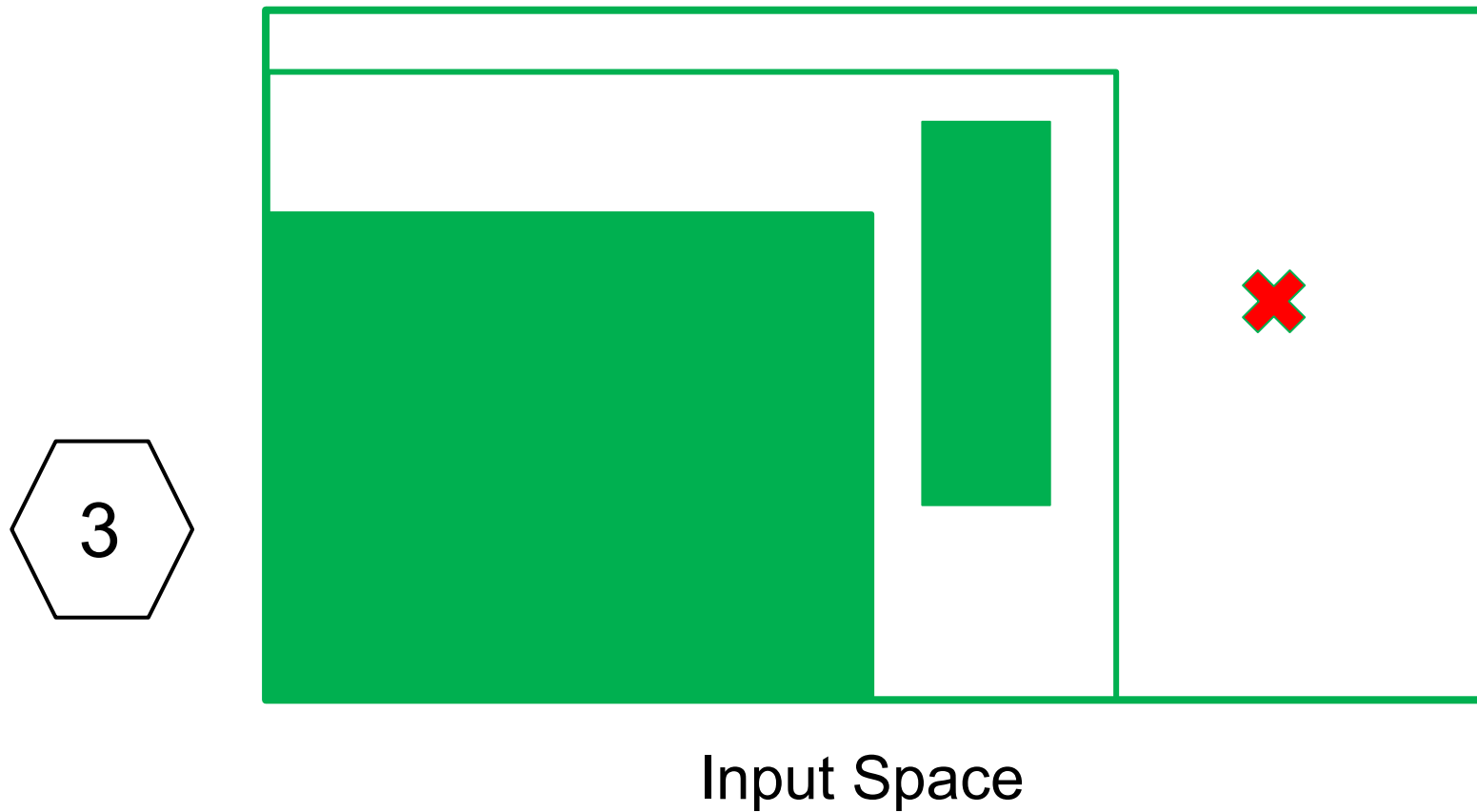
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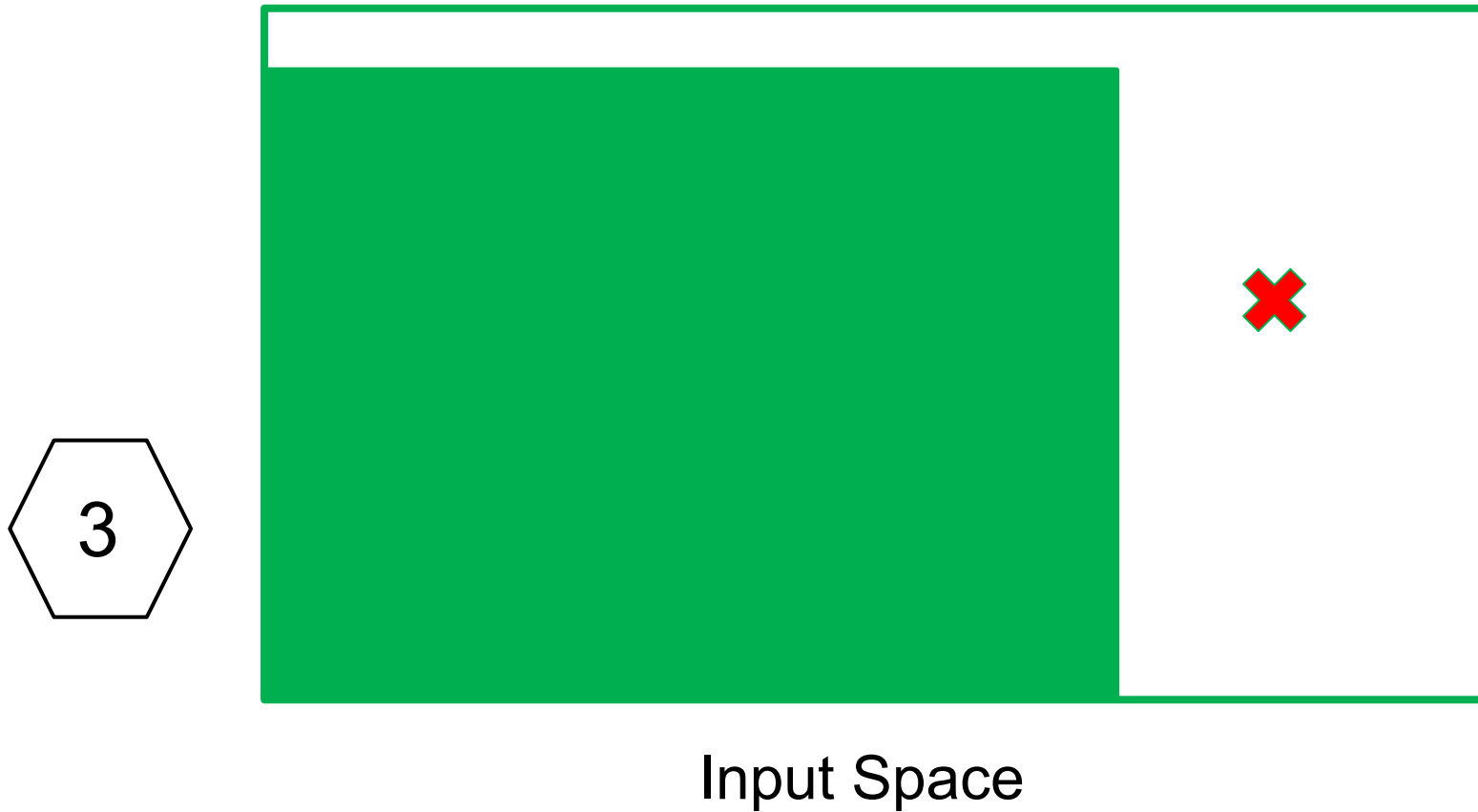
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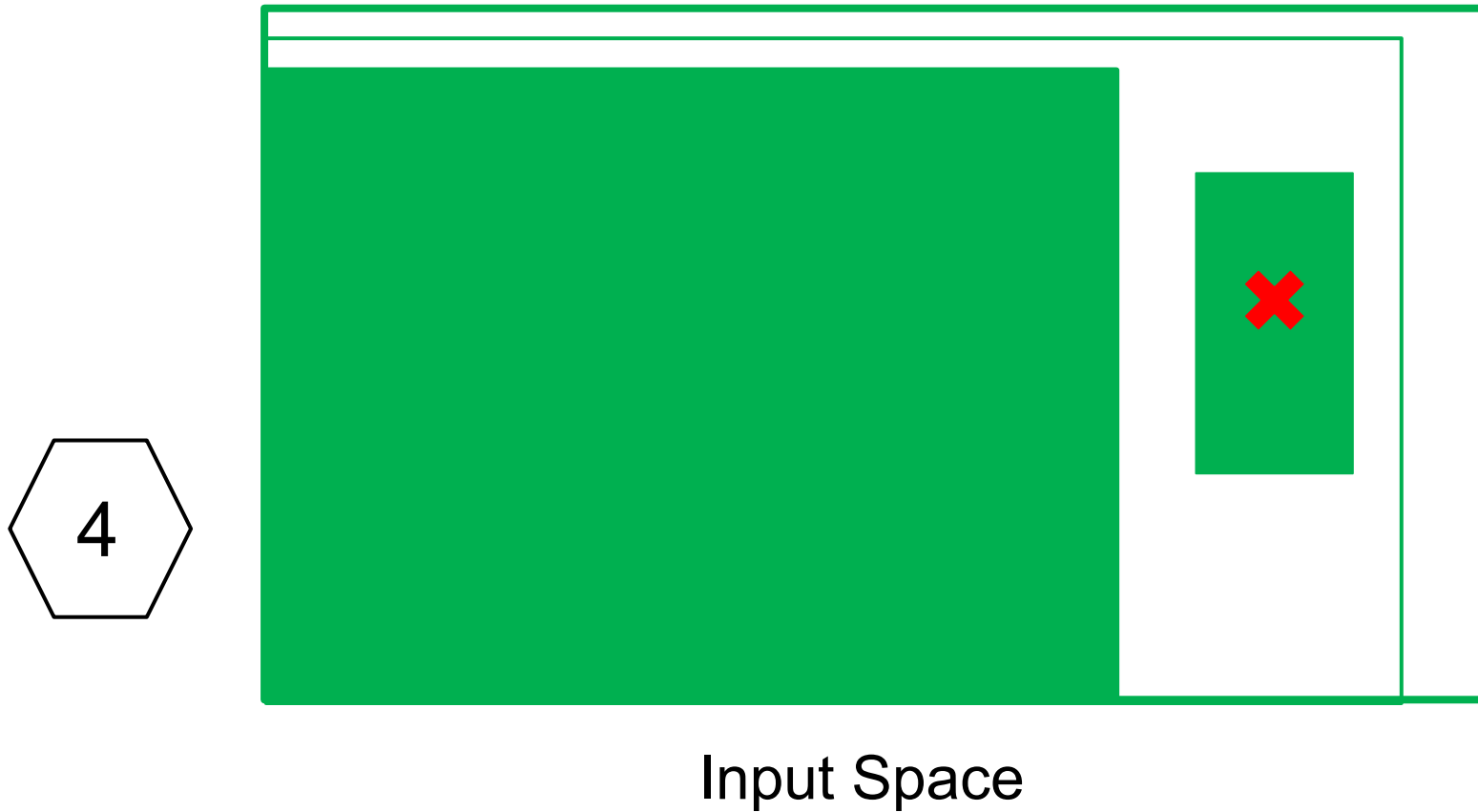
Adaptive Idea



Adaptive Idea



Adaptive Idea

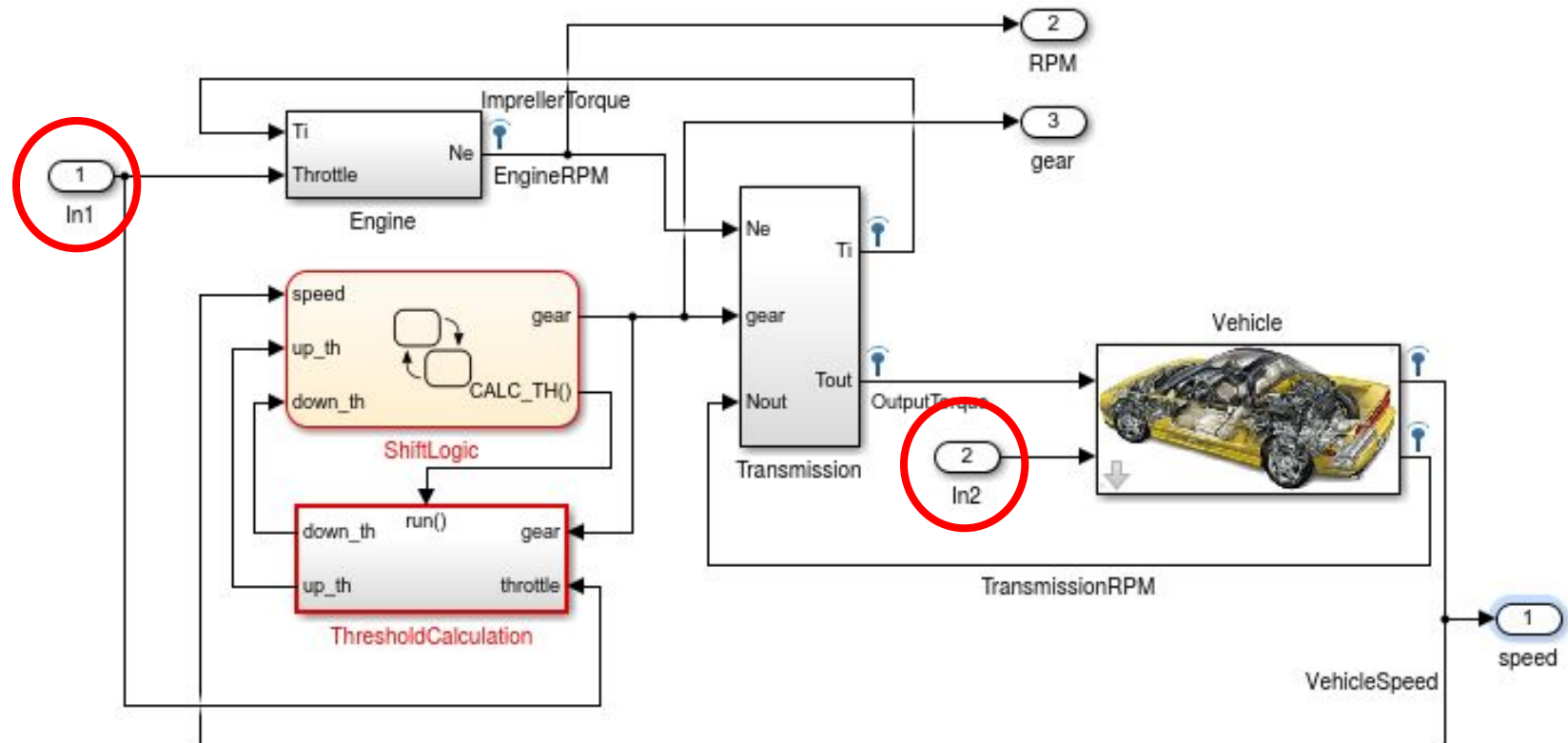


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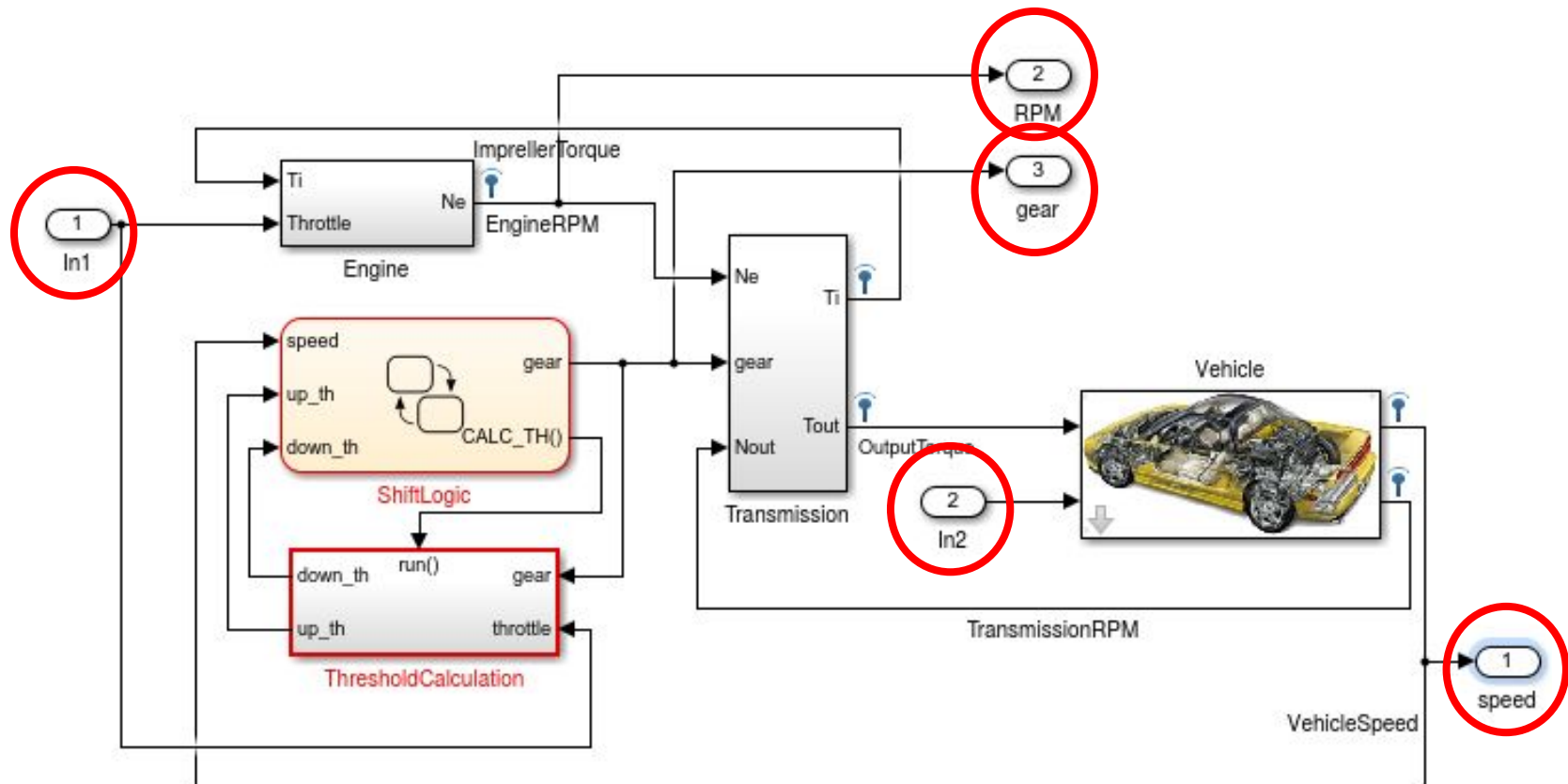


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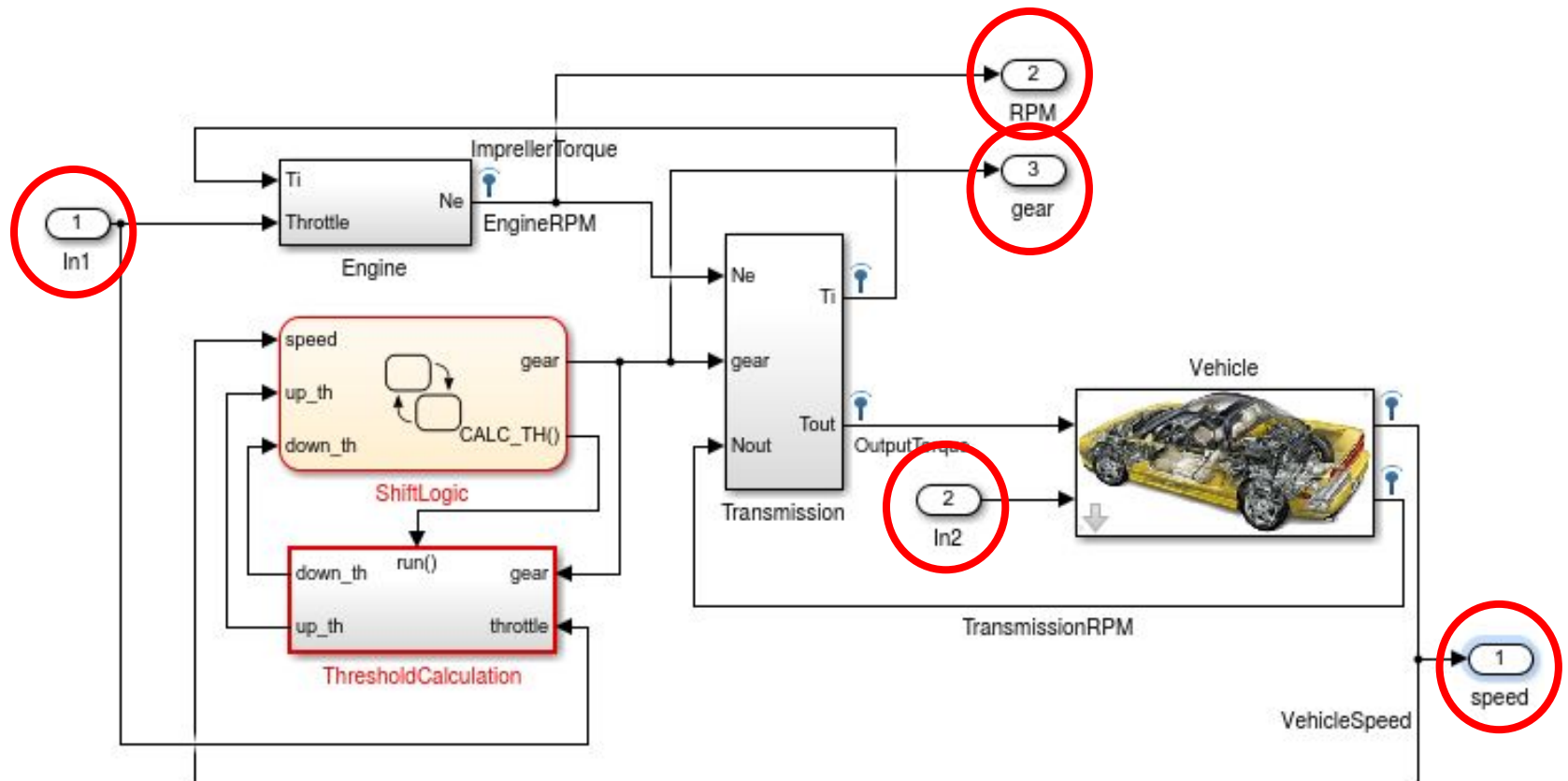
Automatic transmission



Automatic transmission



Automatic transmission



69 blocks: 2 integrators, 3 look-up tables, 3 2D look-up tables, Stateflow Chart

Results

Automatic Transmission		
	Natural languages	<u>MTL</u>
φ_1	The engine (w) and the vehicle speed (v) never reach k_1 and k_2 , resp.	$G((w \leq k_1) \wedge (v \leq k_2))$
φ_2	If the engine speed (w) is always less than k_1 then vehicle speed (v) can not exceed k_2 in less then T sec.	$\neg (F_{[0,T]}(v \geq k_2) \wedge G(w \leq k_1))$
φ_3	Within T sec the vehicle speed (v) is above k_2 and from that point on the engine speed (w) is always less then k_1	$F_{[0,T]}((v \geq k_2) \wedge G((w \leq k_1)))$
φ_4	A gear increase from first to fourth in under than 10 sec, ending in an engine speed (w) above k_1 within 2 sec of that, should result in a vehicle speed (v) above k_2 .	$((g_1 U g_2 U g_3 U g_4) \wedge F_{[0,10]}(g_4 \wedge F_{[0,2]}(w \geq k_1))) \rightarrow G_{[0,10]}(g_4 \rightarrow X(g_4 U_{[0,1]}(v \geq k_2)))$

Results

φ	S-TaLiro			aCPP
	1,1	3,3	7,7	
$\varphi_1 (k_1=4500, k_2=160)$	$8,54 \pm 5,72$	$10 \pm 10,1$	$11,69 \pm 17,63$	$4,40 \pm 1,01$
$\varphi_2 (k_1=4500, k_2=85)$	$63,90 \pm 53,20$	$124,82 \pm 101,51$	$1686,9 \pm 589,57$	$18,2 \pm 3,5$
$\varphi_3 (k_1=4500, k_2=80)$	$12,95 \pm 7,37$	$49,8 \pm 55,47$	$199,15 \pm 175,94$	$6,70 \pm 1,74$
$\varphi_4 (k_1=4500, k_2=80)$	$28,59 \pm 24,15$	$32,65 \pm 27,05$	$26,72 \pm 23,98$	$5,33 \pm 1,31$



✓ aCPP reduces minimum number of evaluations by **50-70%**

✗ GP-UCB is slow.

Results

$$\text{Time} = \{\#\text{Simulations}\} \times \{\text{Simulation Time}\} + \{\text{Optimizer time}\}$$

GP-UCB is slow



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$$\text{Time} = \{\#\text{Simulations}\} \times \{\text{Simulation Time}\} + \{\text{Optimizer time}\}$$

GP-UCB is slow



Future work

- ❖ from **Matlab** to **Java** (parallelization)
- ❖ multi-objective approach
- ❖ using fmi as simulator

Acknowledges



Esteco



Luca Bortolussi



Alberto Policriti



Thank You!

....AND USE FORMAL
METHODS