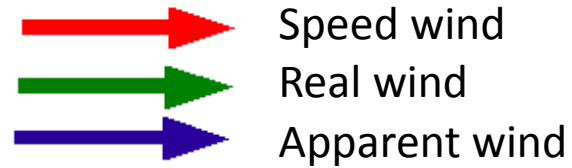


# A Process for Evaluating Parametric Models for Mechanical Systems Simulation: the Case of a Sailboat

# Context



## *The wind*

### Absolute wind

TWD : True Wind Direction

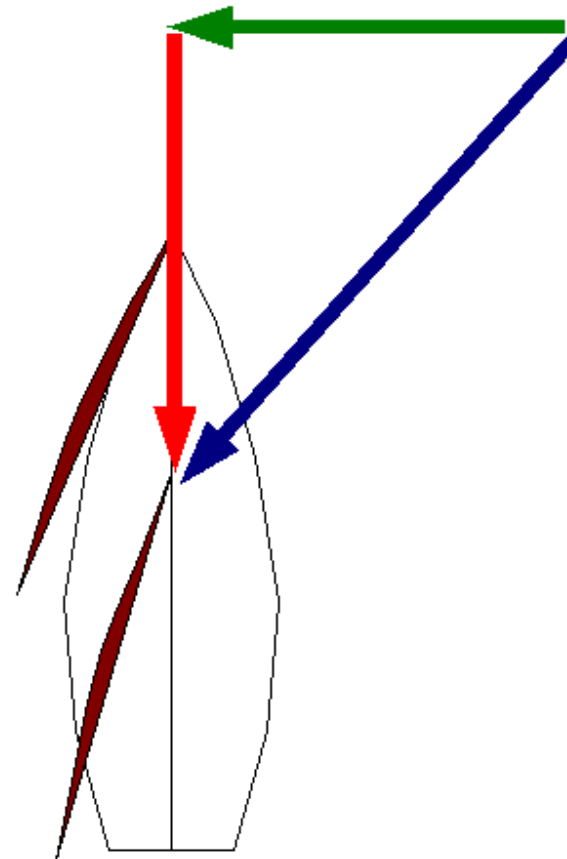
TWA : True Wind Angle

TWS : True Wind Speed

### Relative wind

AWA : Apparent Wind Angle

AWS : Apparent Wind Speed



## *The sailboat*

### Speed

COG : Course Over Ground

SOG : Speed Over Ground

### Behavior

Heel : heel angle

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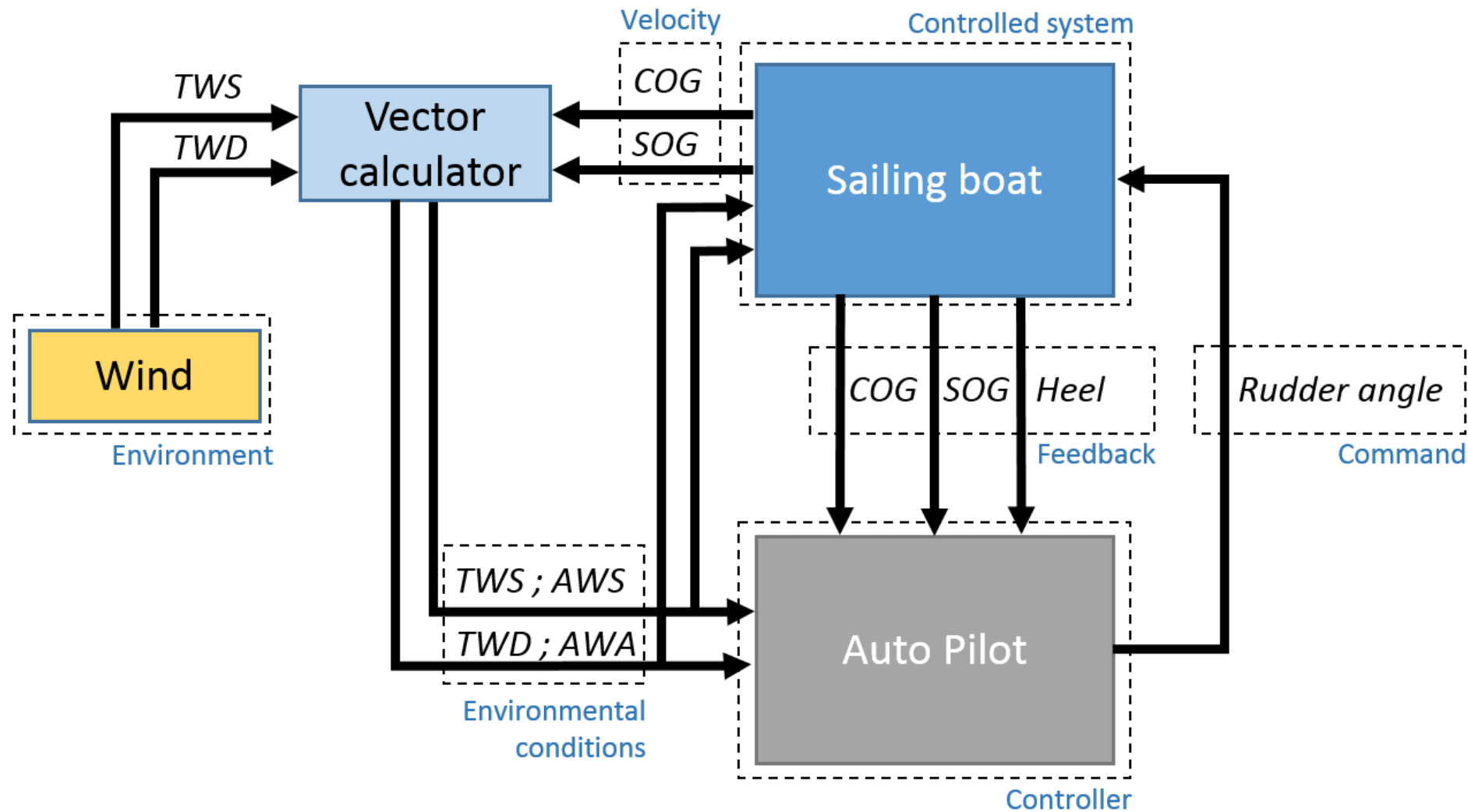
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# Sailboat modeling



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# Controlled system modeling

## No efficient analytical model

Strongly nonlinear system

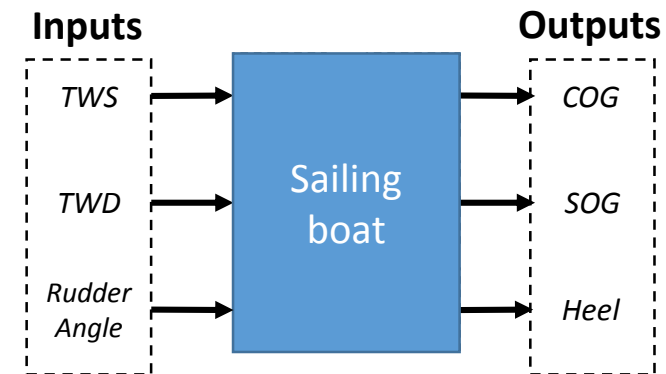
- fluid / structure interactions in aero and hydro
- CFD (complex and heavy computation)

Multiple and uncertain parameters

- Measured wind
- High sensitivity to settings

Dataset logged from the sail boat

→ Evaluation of a parametric model



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## MIMO systems : Multiple Inputs Multiple Outputs

State-space models

*State-space approach*

$$\begin{cases} x_{i+1} = [A] \cdot x_i + [B] \cdot u_{i+1} \\ y_i = [C] \cdot x_i + [D] \cdot u_i \end{cases}$$

Autoregressive models

*Transfer function approach*

$$y_i(z) = \frac{b_1 \cdot z^{-1} + b_2 \cdot z^{-2} + \dots + b_p \cdot z^{-p}}{1 + a_1 \cdot z^{-1} + a_2 \cdot z^{-2} + \dots + a_n \cdot z^{-n}} u_i(z)$$

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## Influence on the number of parameters

State-space models

*State-space approach*



Size of the state vector

Autoregressive models

*Transfer function approach*



Order of each transfer function



# Nonlinearities of the system

- Linear equation of motion

$$\frac{\partial m \cdot \vec{V}}{\partial t} = \sum \vec{F}$$

- Nonlinear parameters

$$F_v = \frac{1}{2} \rho \cdot V^2 \cdot S \cdot C$$

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# Referential choice

## Relative referential

Work with apparent wind

→ AWA and AWS

Work on cap variation

→ Yaw rate

*VS*

## Absolute referential

Work with real wind

→ TWS et TWD

Work on absolute position

→ COG and SOG

*Rem : relevant for nonlinear systems and to deal with bad conditioned system*

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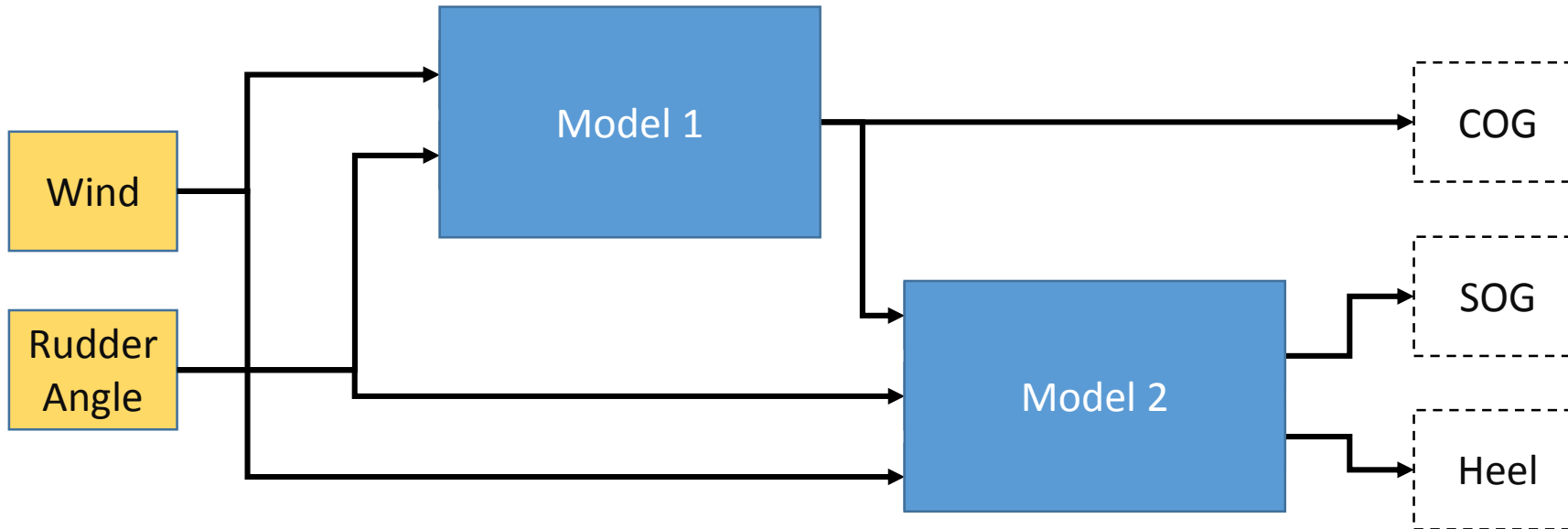
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# Chained models



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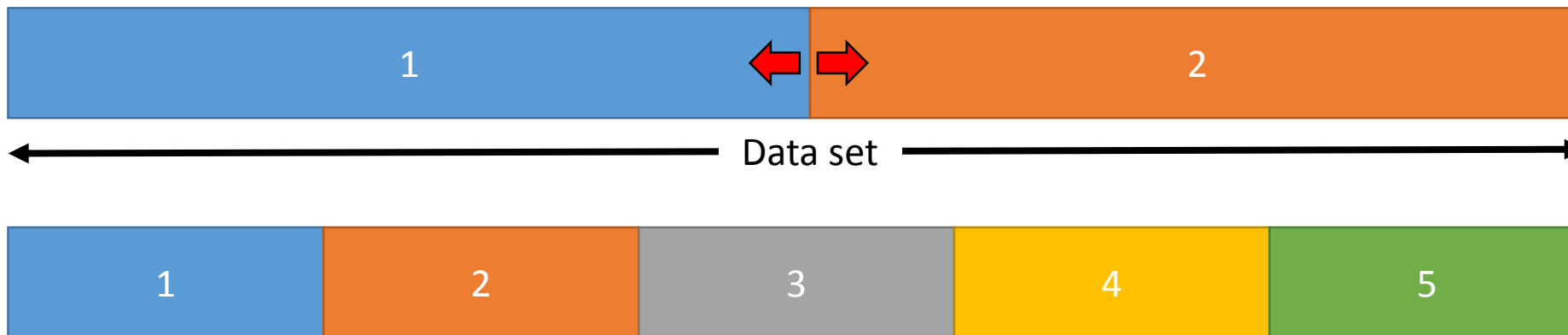
# Window size choice

## Classical approach in identification method

Split the data set in two parts :

- One part to compute the model
- One part to validate the model

Question of the size of each part



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# Model issues and options

- **Choice of a model family**
- **Choice of the referential**
- **Choice of the model order**
- **Choice of the number of used models**
- **Choice of the window size**
- **Choice of additional inputs to deal with nonlinearities**

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# Model evaluation and setting

- **Family and referential**
  - Criteria (distance) to compare models
- **Choice of the number of used models**
  - Testing different combinations
- **Choice of the model order**
  - Mathematical tools to find best order : Matlab
- **Choice of additional inputs to deal with nonlinearities**
  - Add exponentiation inputs
- **Choice of the window size**
  - Split the set into several parts of different size

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## *Measure set from a racing multihull*

All inputs and output data logged during a sailing navigation:

- TWS, TWD, rudder angle, AWS, AWA, COG, SOG, Heel
- Length of data set : 2500 s
- Sample frequency : 1 Hz

# Model choice

Name	Referential	Model family
A	absolute	State-space
B	absolute	Autoregressive
C	relative	State-space
D	relative	Autoregressive

→ Numerical criteria to compare model performances

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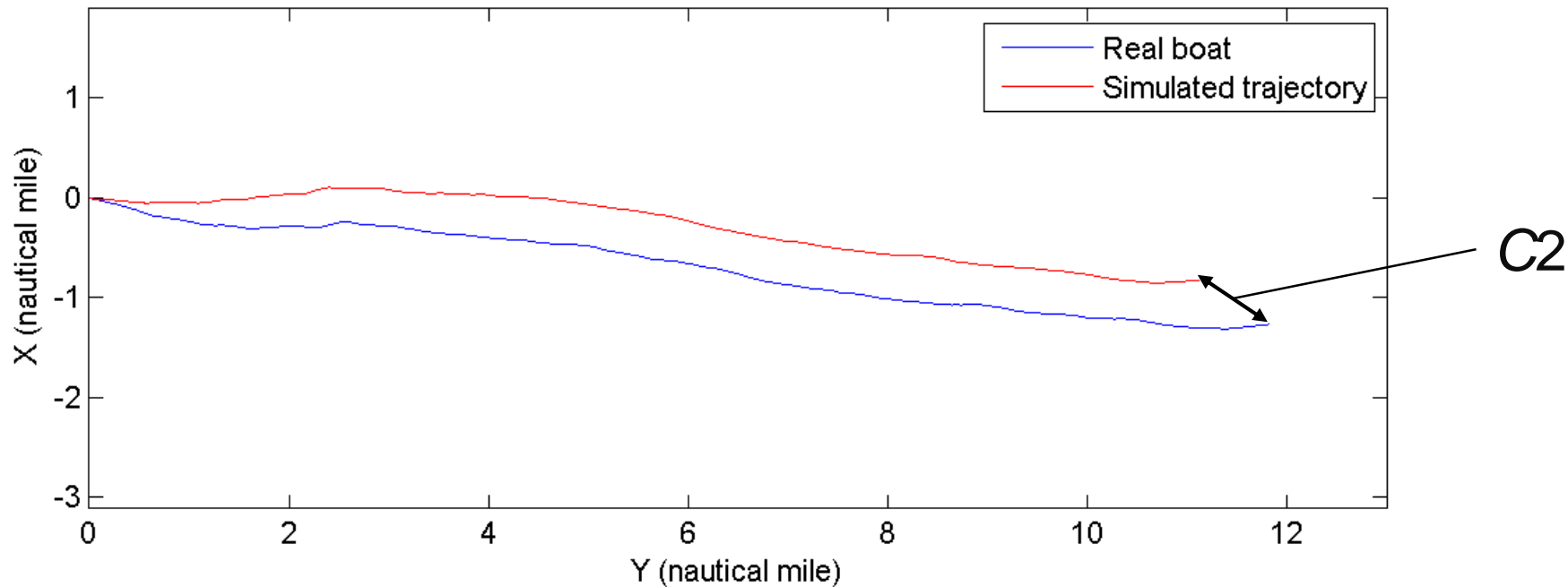
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# Numerical criteria

$$C1 = \left( 1 - \frac{\|COG_m - COG_s\|_2}{\|COG_m - \text{mean}(COG_m)\|_2} \right) \times 100$$



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# Order choice

System Identification Tool - comparaison\_split

File Options Window Help

Import data

Operations

Preprocess

Working Data

Estimate -->

To Workspace To LTI Viewer

Trash

The character is not a valid hotkey

Import models

Model Views

Model output Model resid Transient resp Frequency resp Zeros and poles Noise spectrum Nonlinear ARX Hamm-Wiener

Data Views

Time plot Data spectra Frequency function

Exit

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Computation time : ~1 s

# Inputs and outputs

## Inputs

- Wind speed  
TWS or AWS
- Wind direction  
TWD or AWA
- Rudder angle

## Outputs

- Boat speed  
SOG
- Boat direction  
COG
- Heel

## Taking into account nonlinearities

$$F_v = \frac{1}{2} \rho \cdot V^2 \cdot S \cdot C$$

- *Additional inputs*  
TWS<sup>2</sup> or AWS<sup>2</sup>

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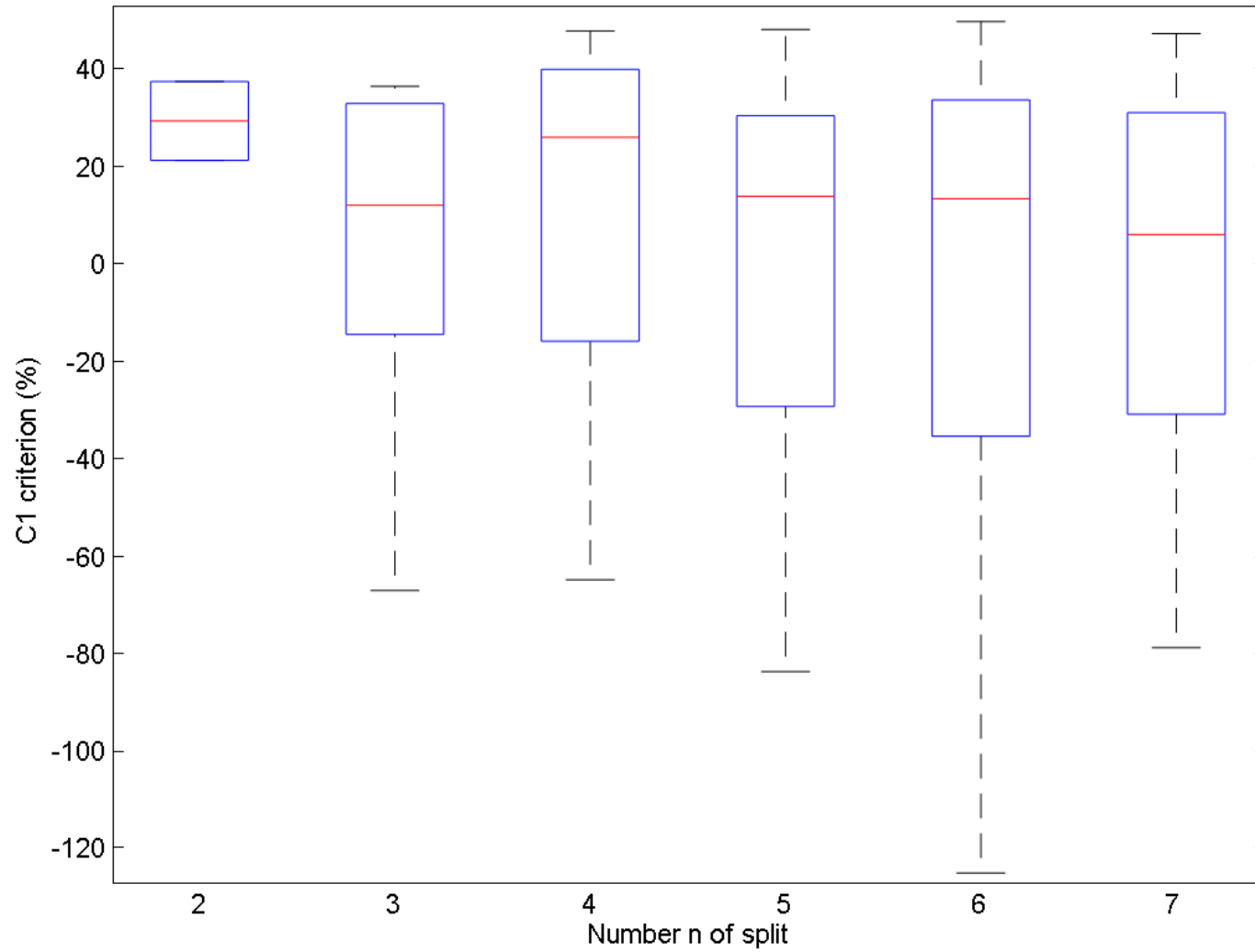
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# Impact of window size



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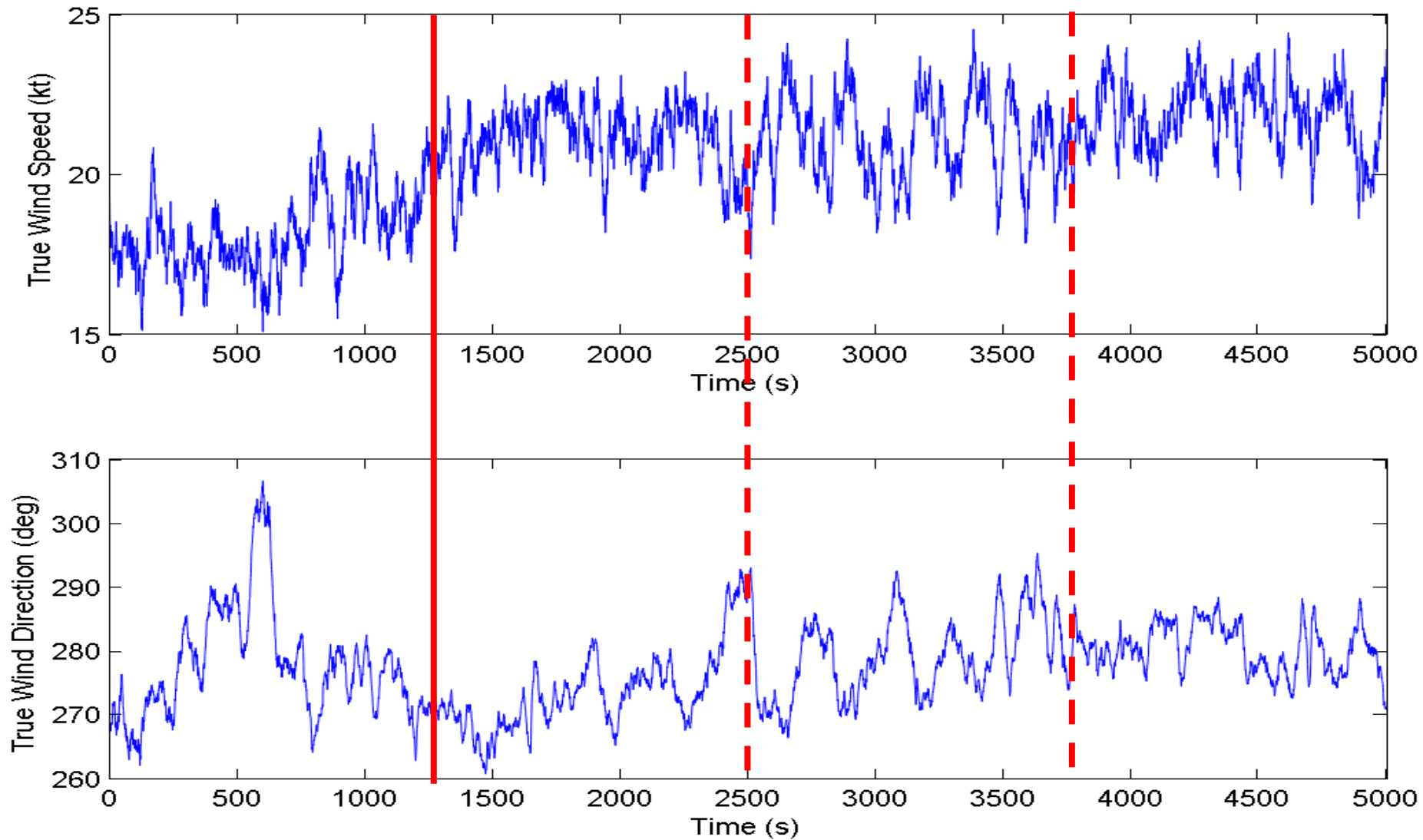
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# Impact of window size



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# Numerical results

Model name	C1 (%)	C2 (NM)
A	36.6	0.8261
B	4.39	1.3089
C	-2.95	1.4157
D	-110	1.9528

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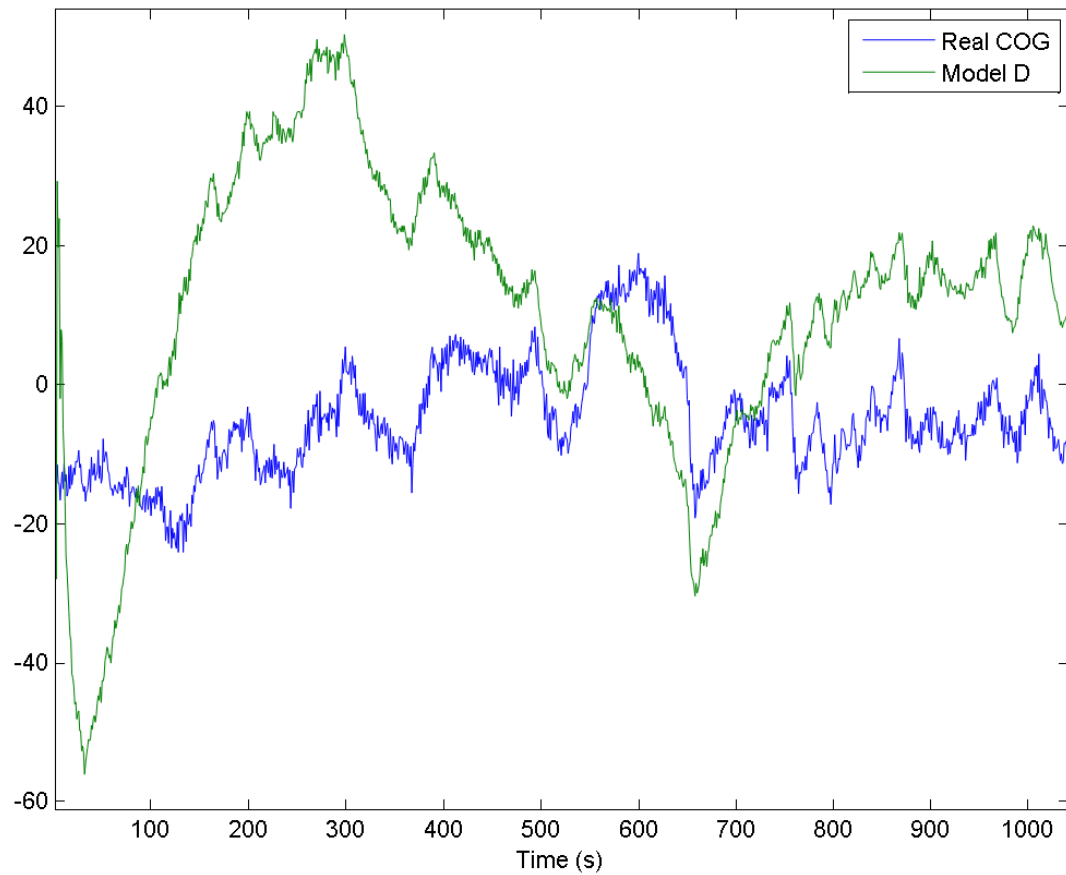
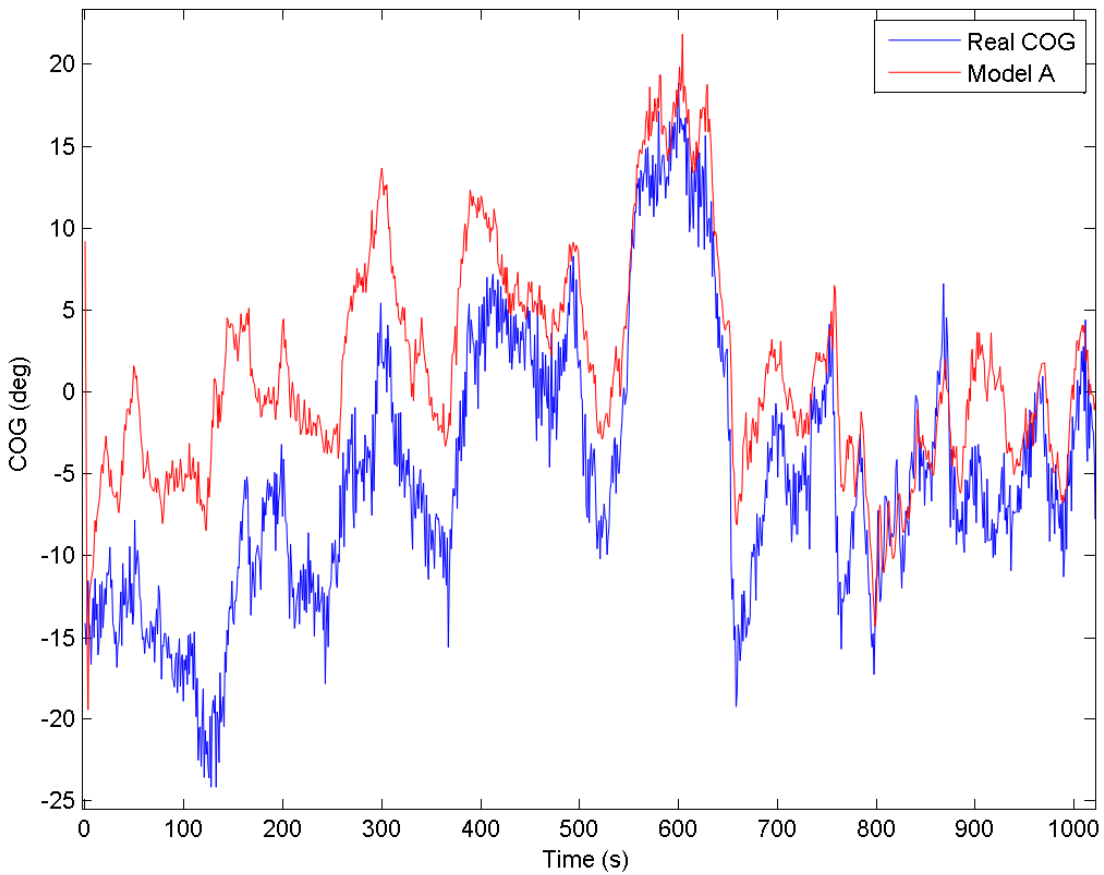
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# Simulated COG



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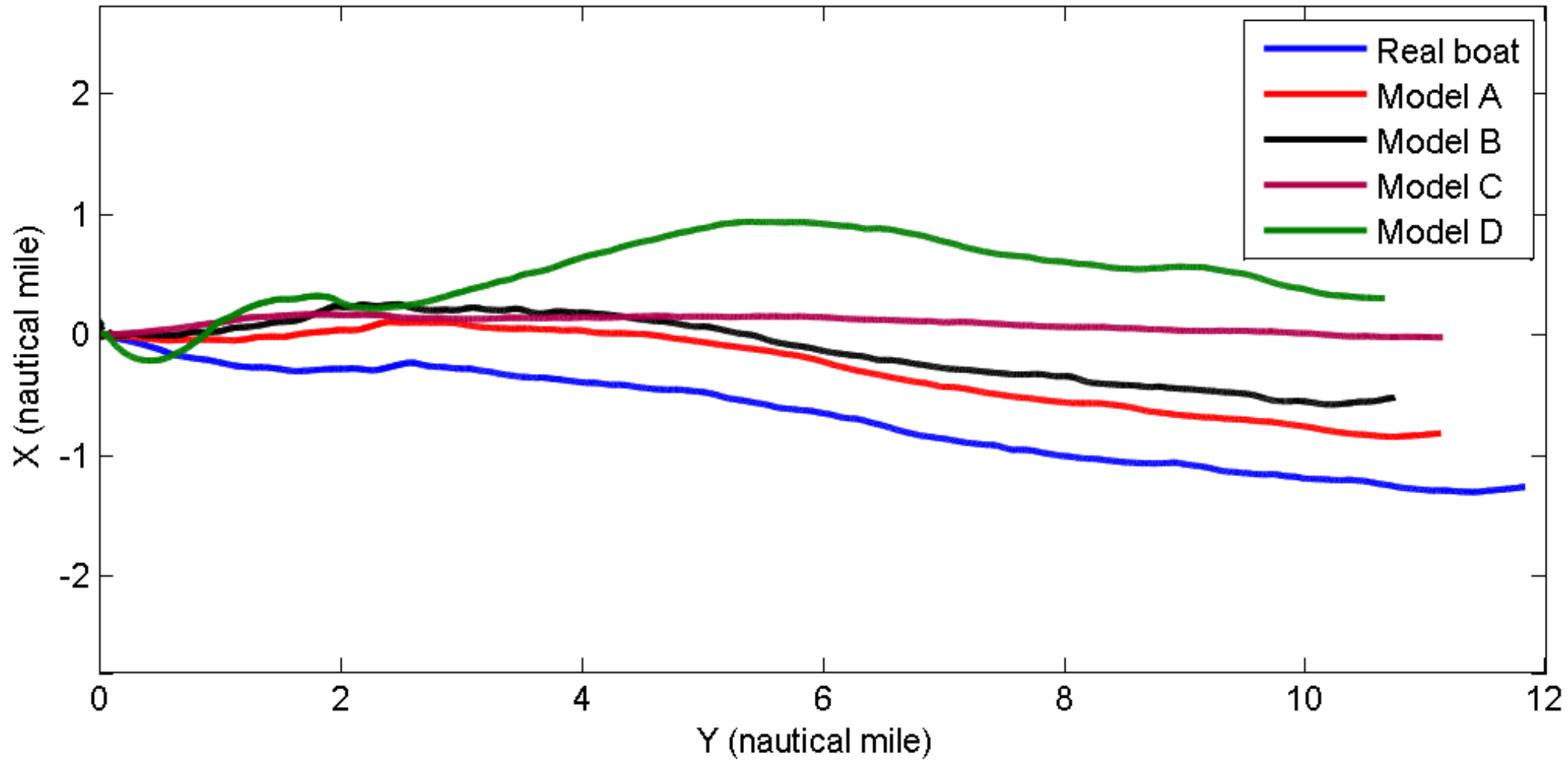
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# Simulated trajectories



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# Conclusion and Future works

- Solution to simulate the system behavior
- Choice between accurate and versatile model

## Future works

- Models with new inputs : new sensors on the boat
- Other measurements to validate the model
- Automation of regime detection
- Automation of optimal model setting

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# Any question ?

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