



西湖大學  
WESTLAKE UNIVERSITY

## MATLAB Application in Intelligent and Bio-inspired Fluid Mechanics

*Dixia Fan, Westlake University*

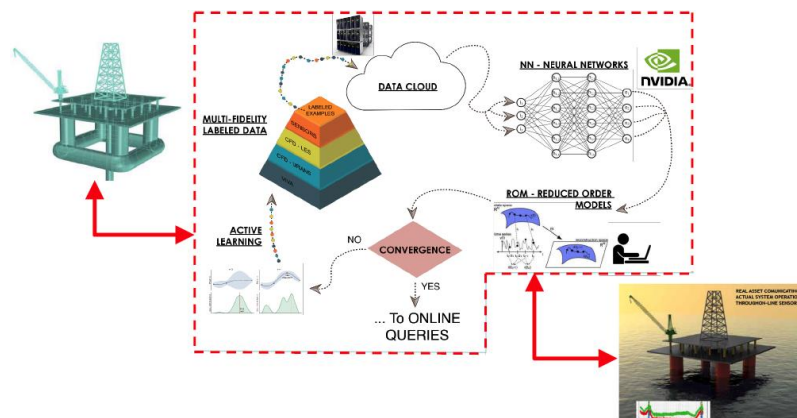


MATLAB EXPO

# # - FSI Lab at Westlake Univ.



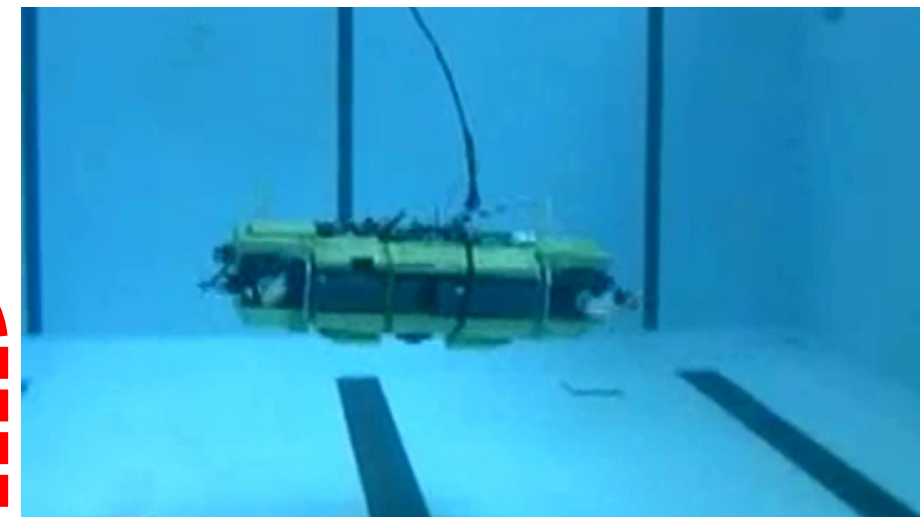
Intelligent Towing Tank



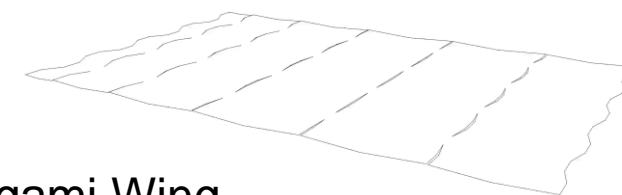
Digital Twin for Marine Risers

Invited ISOPE keynote

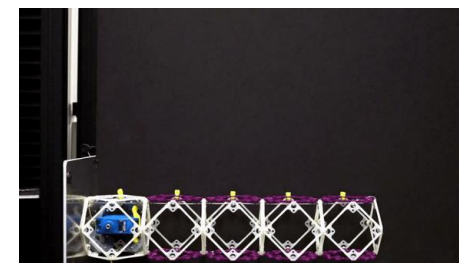
Intelligent,  
Informational,  
Integrative,  
Interdisciplinary  
**Fluid-Structure  
Interaction**



MIT Roboturtle



Origami Wing

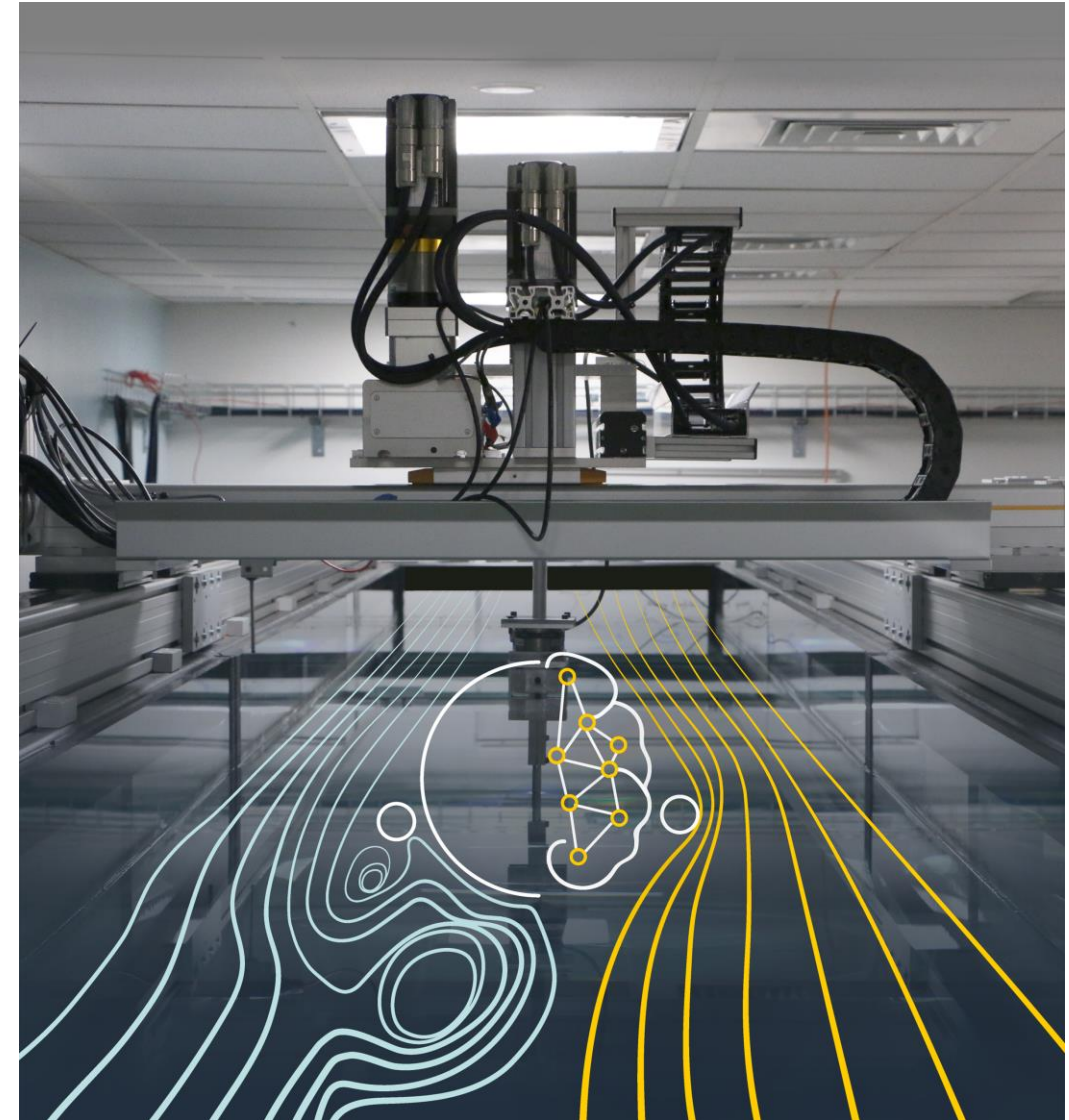


Discrete  
Voxel  
Robot



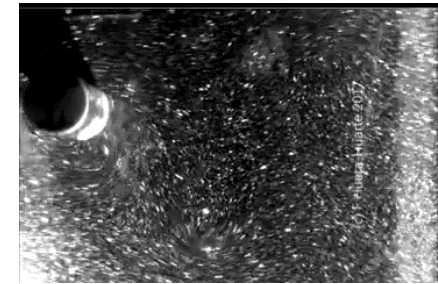
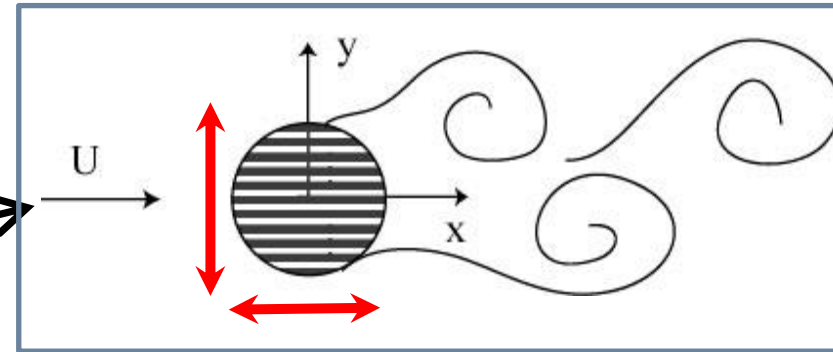
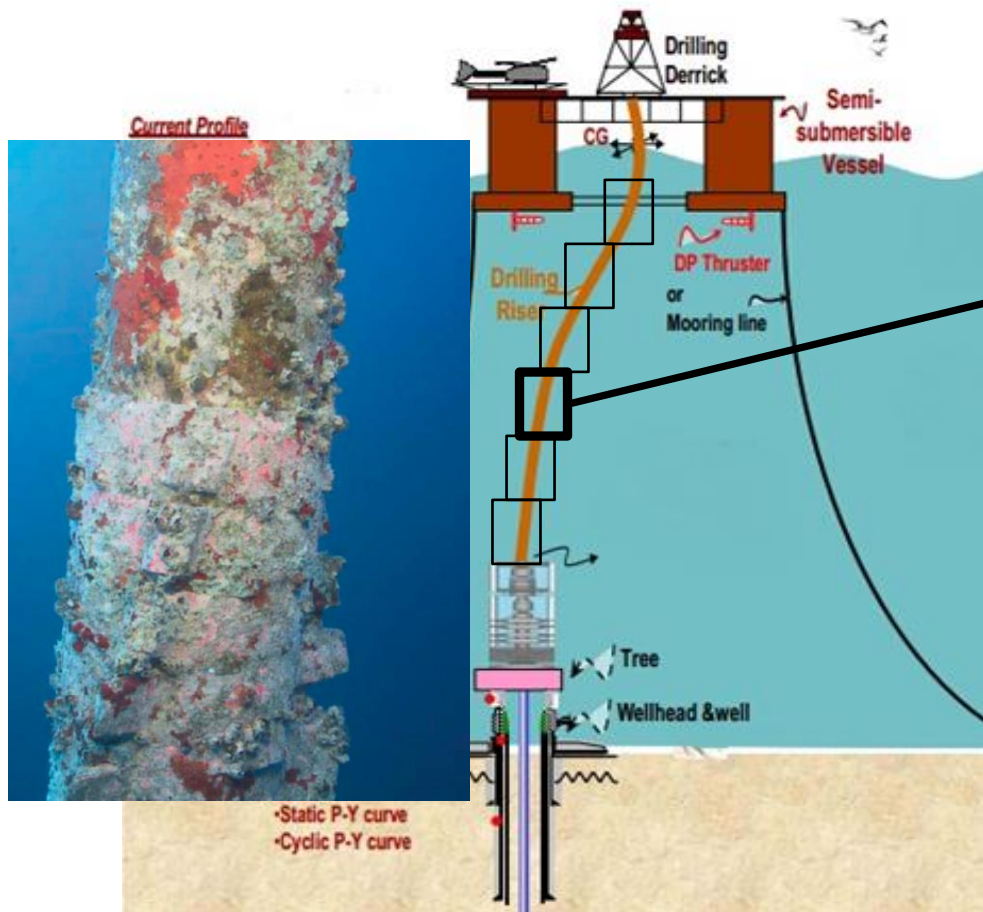
# Outline

- **Automated Science with Intelligent Towing Tank**
  - **Problem to Solve: Marine Risers Vortex-Induced Vibration**
  - Making Friends with Uncertainty: Gaussian Process Regression
  - A Peak into the Future with Robotic Scientists
- **Next-Gen Bio-Inspired Aero/Aquatic Vehicles**
  - Challenges in Dual Aerial / Aquatic Propulsion
  - Flapping foil vortical flow control
  - Inspired by nature: a peak into the future flapping foil/wing actuator
- **Bottom up: AI for Fluid Experimentation**





# Motivation: Marine Riser Vortex-Induced Vibration (1/3)

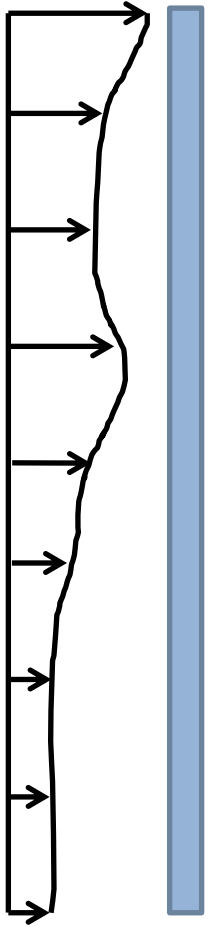


Key hydrodynamic coefficients  $C_d$  ,  $C_{lv}$  ,  $C_{my}$  , is affected by many parameters, such as

1. amplitude; 2. frequency; 3. roughness; 4. Reynolds number

$$C = \mathbf{C}(f_x, f_y, A_x, A_y, \theta, Re \dots, x_n)$$

## Motivation: Curse of Dimensionality (2/3)



$$C = \mathbf{C}(f_x, f_y, A_x, A_y, \theta, Re \dots, x_n)$$

If  $n = 8$ , and 10 experiments each  $x_n$ :

$$\underbrace{10 \times 10 \times \dots \times 10}_{8 \text{ times}} = 10^8$$

*950 Years for 5 min each  
experiment.*

## Motivation: Dream of a lazy fluid enthusiast (3/3)



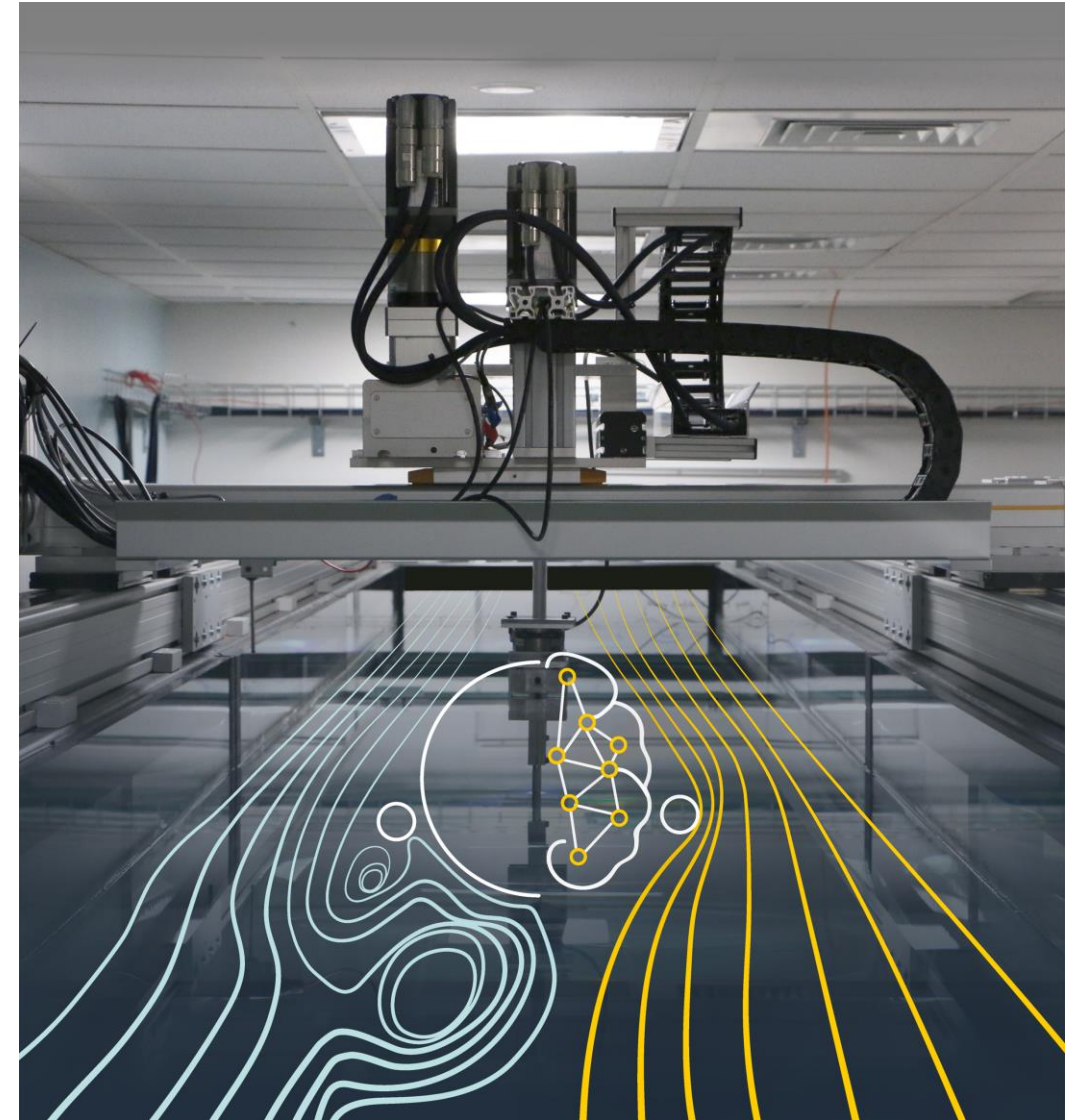
Confession by a “lazy” fluid enthusiast

Once He dreamed a smart machine that can replace him to

Perform, analyze and **design**  
experiments ***smartly and automatically...***

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# A Reflection on Research (1/4)



$y$        $x$

$$k(x, x') = \sigma_f^2 \exp\left(-\frac{(x, x')^2}{2\sigma_l^2}\right)$$

$$\begin{bmatrix} y \\ f^* \end{bmatrix} \sim \mathcal{N} \left( 0, \begin{bmatrix} K(X, X) + \sigma_n^2 I & K(X, X_*) \\ K(X, X_*) & K(X_*, X_*) \end{bmatrix} \right)$$

$$f^* | X, y, X_* \sim \mathcal{N} \left( \underbrace{\bar{f}^*}_{\text{prediction}}, \underbrace{\text{cov}(f^*)}_{\text{uncertainty}} \right)$$

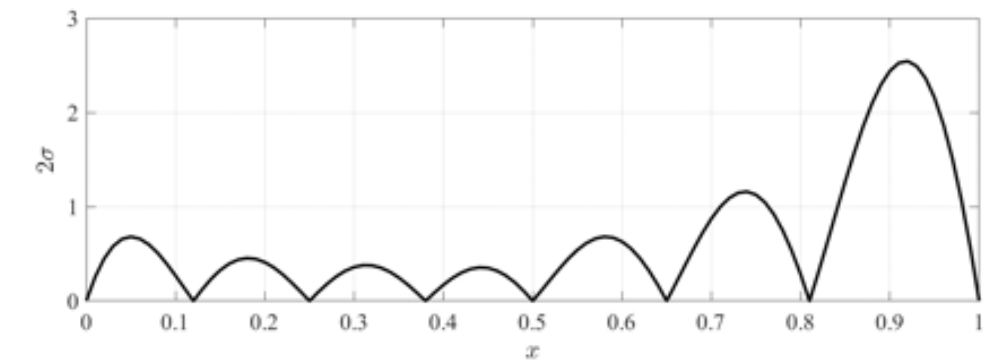
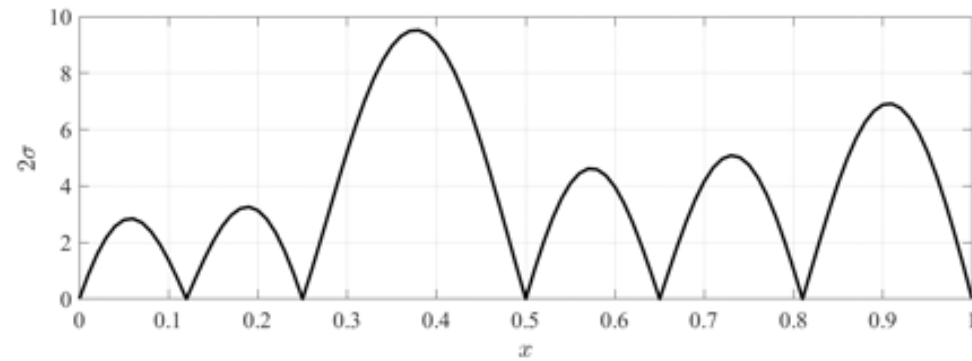
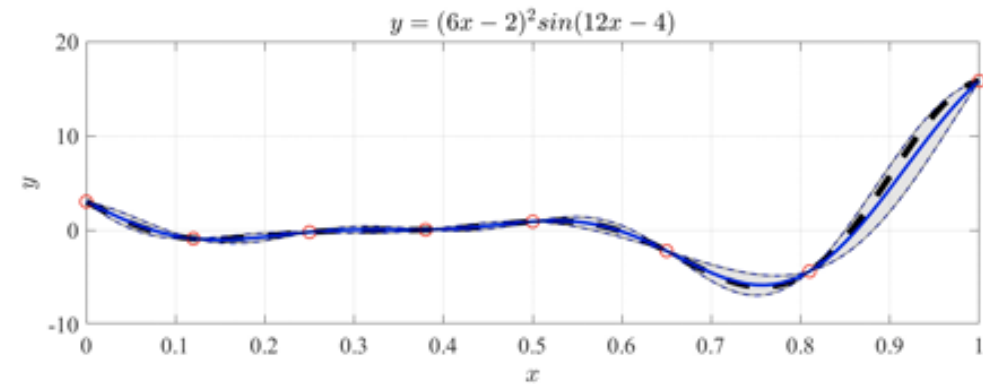
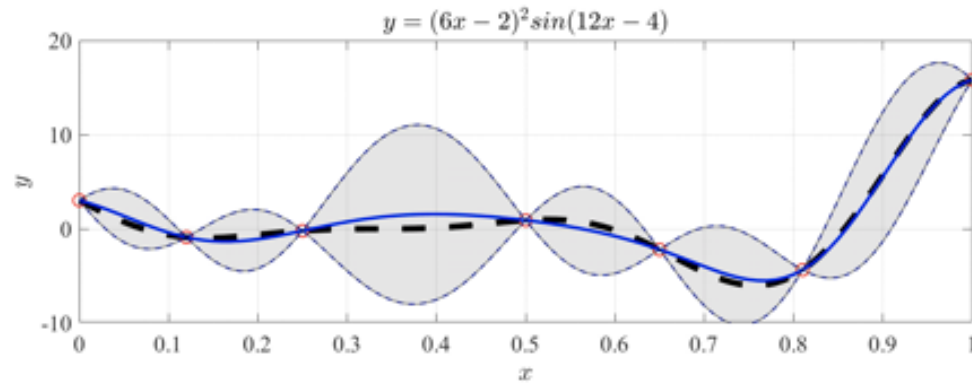
$y$

C. E. Rasmussen & C. K. I. Williams  
(2006)



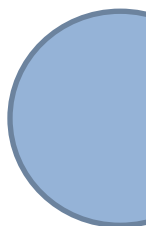
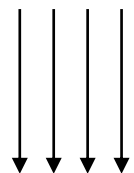
## A Quick Demo (2/5)

$$y = (6x - 2)^2 \sin(12x - 4)$$



Intelligence

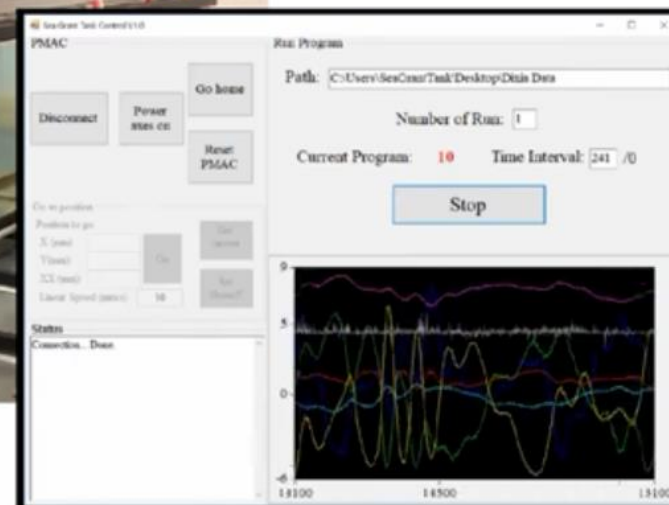
$$\varepsilon_t = \varepsilon_m$$



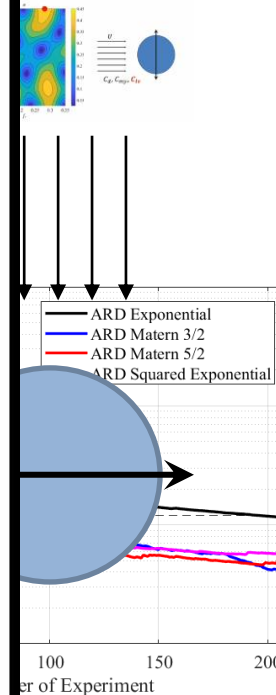
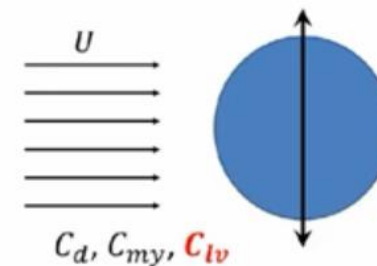
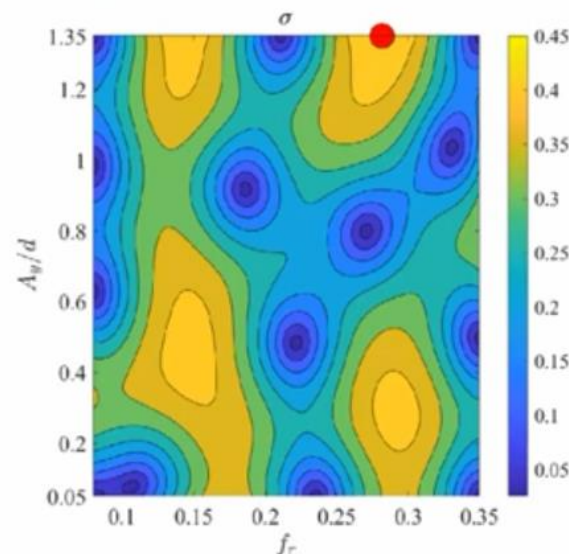
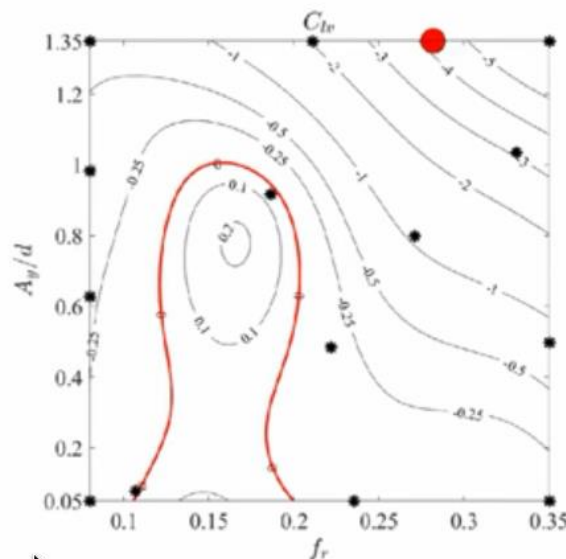
$C_d$



# MIT Intelligent Towing Tank



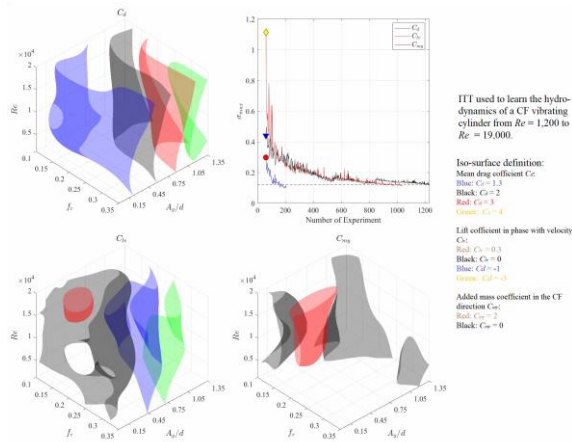
Current Run: 10, Samples: 14



$C_{my}$ ,  $C_{lv}$

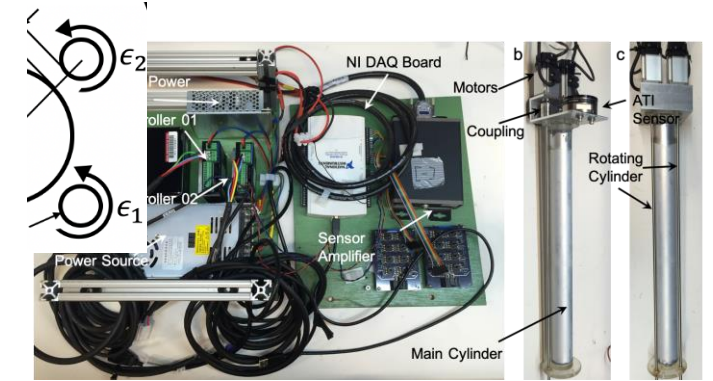
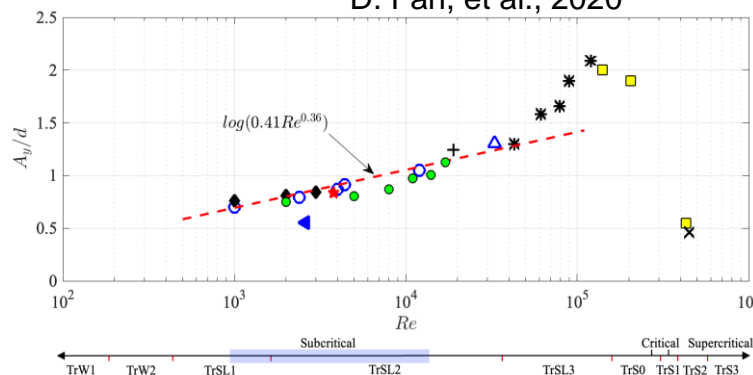
D. Fan, et al. 2019

# ITT Applications (4/4)



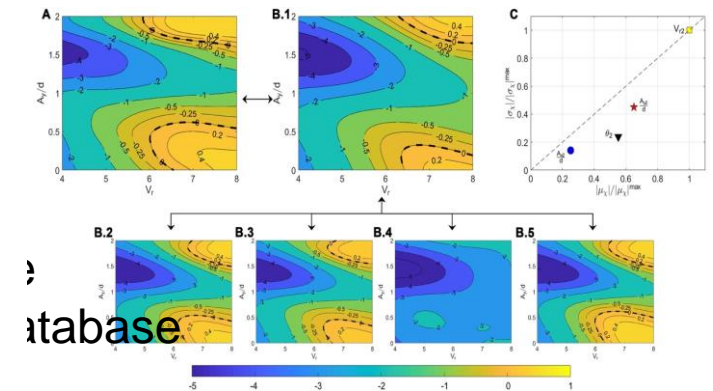
## 1. The first Reynolds effect CF database

D. Fan, et al., 2020



## 4. The first DRL application in bluff body active flow control

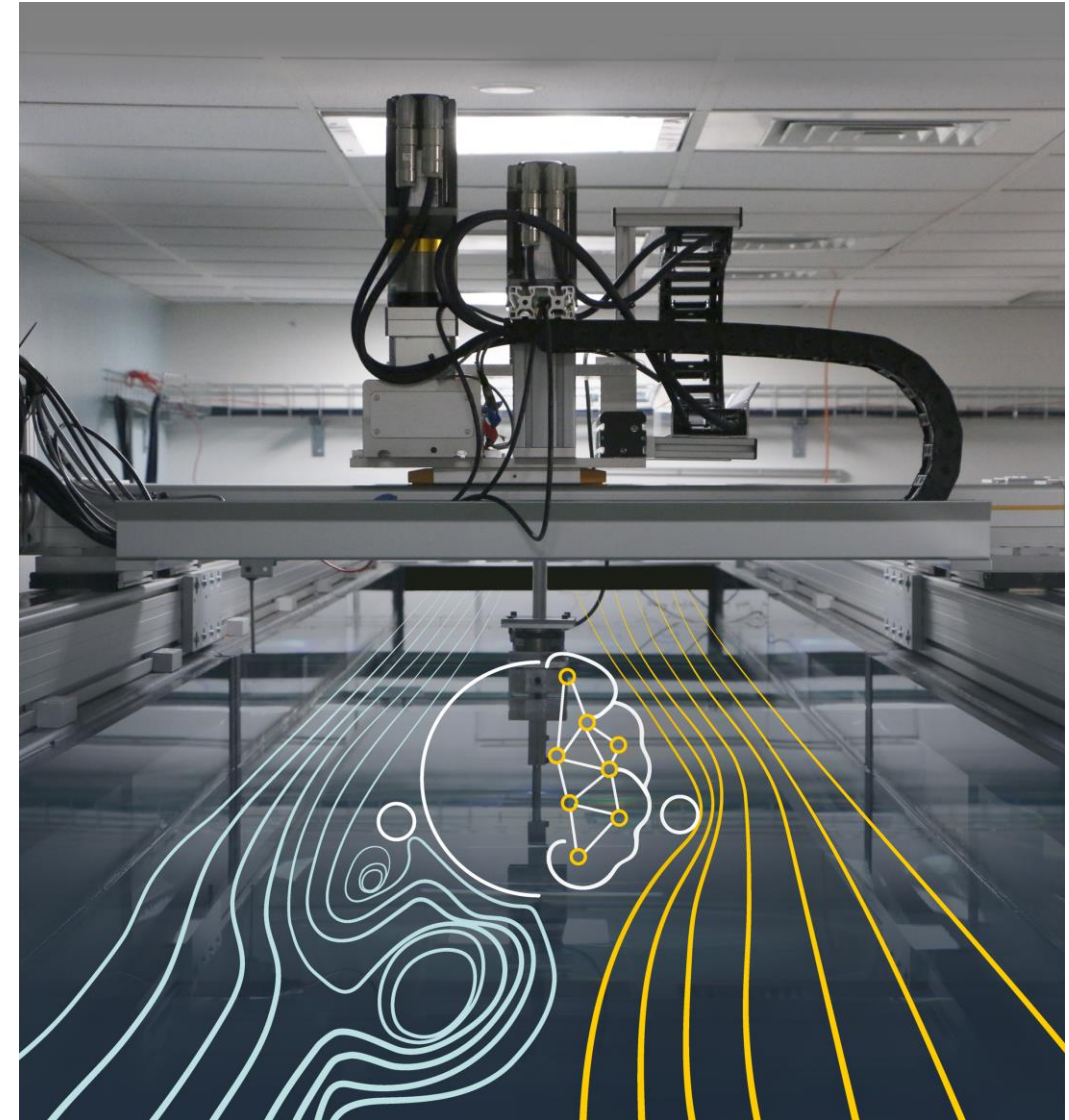
D. Fan, et al., 2020





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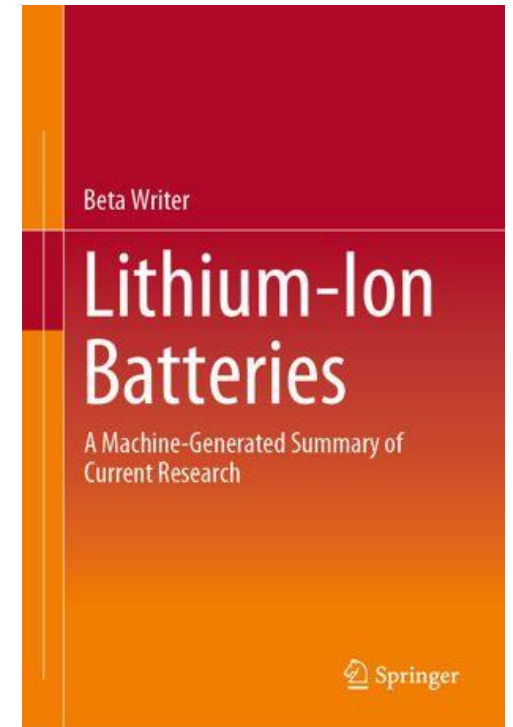
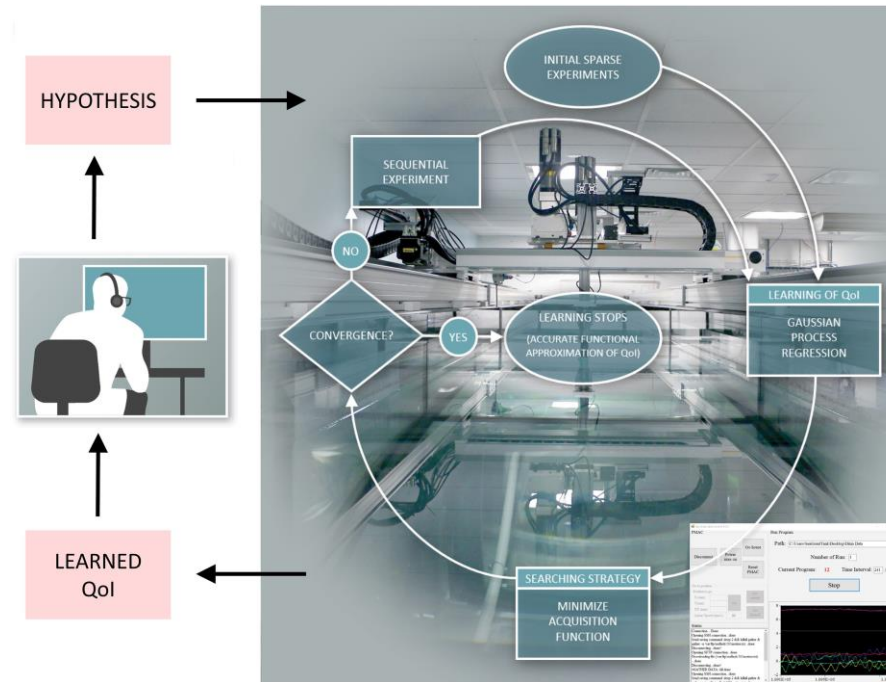




# The Robot Scientists Are Coming. But That's Not a Bad Thing

---- By Discover Magazine

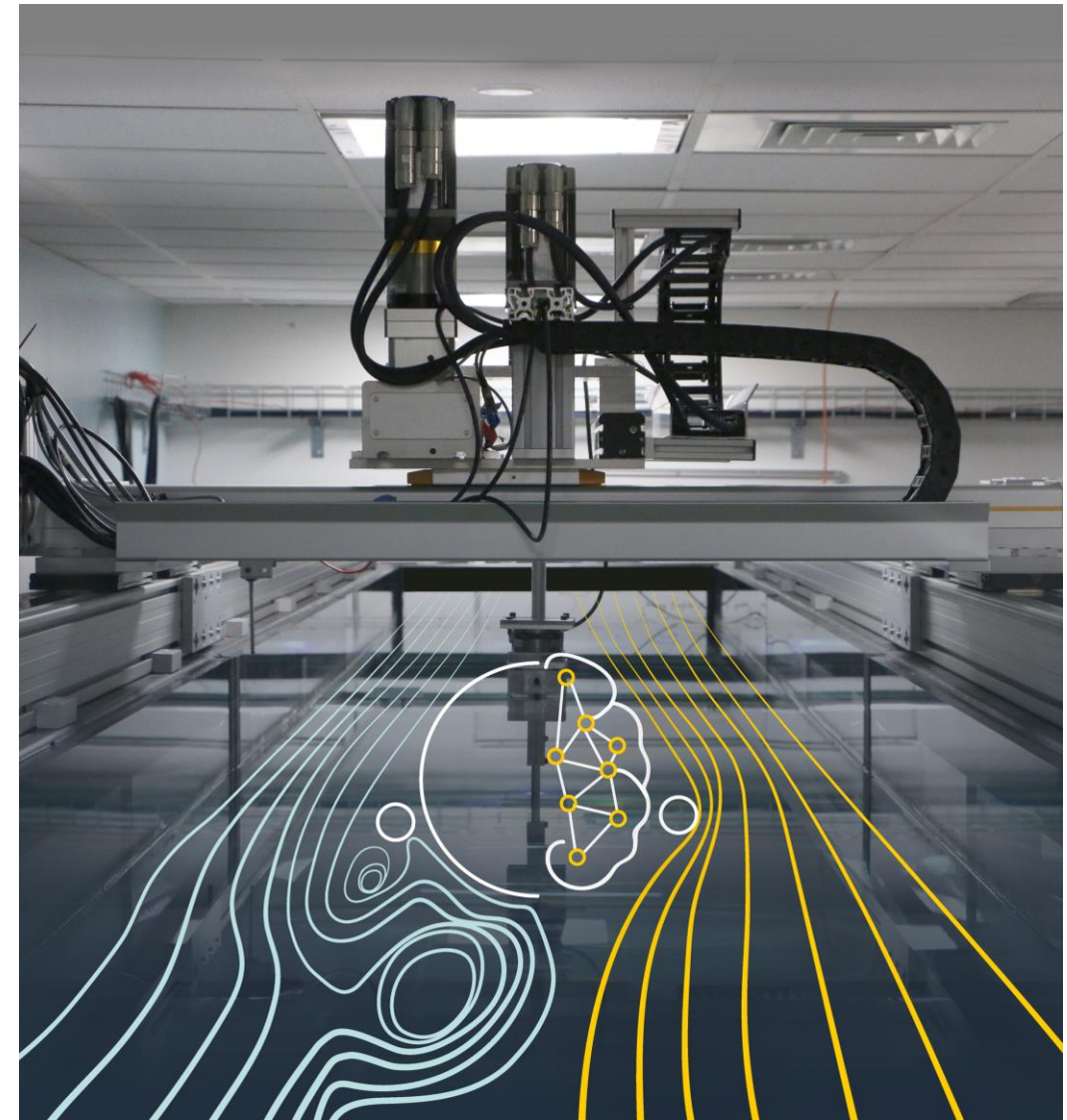
Dictator



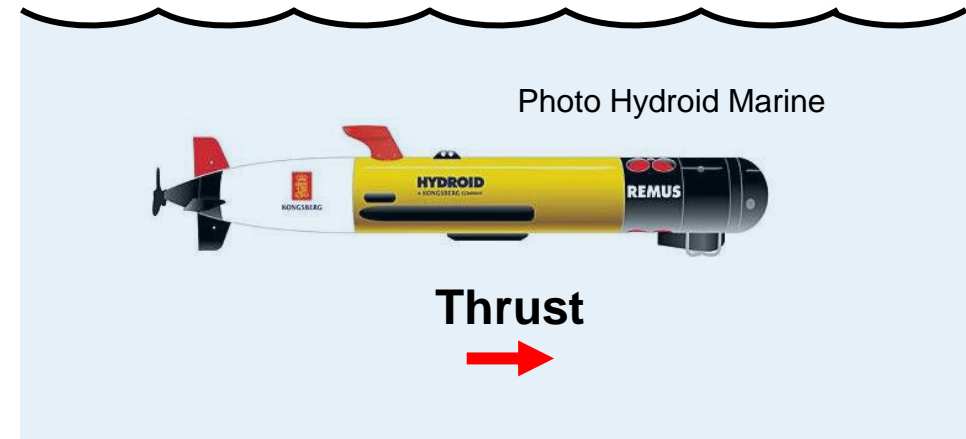
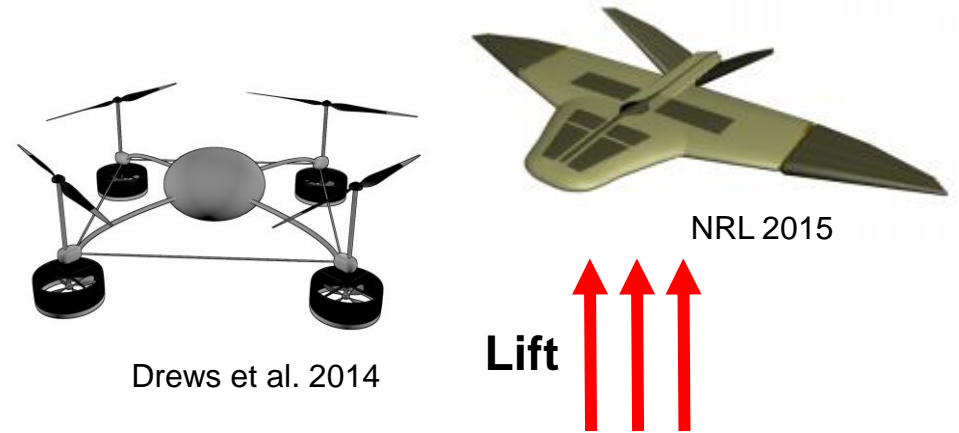
Collaborator → Counselor

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# Motivation: Aerial / Aquatic Transportation





# Inspiration from Nature

Flying-Only



Swimming-Only



Dual Aerial/Aquatic





# Flying Underwater



# Puffin's Strategy on Flapping Wings

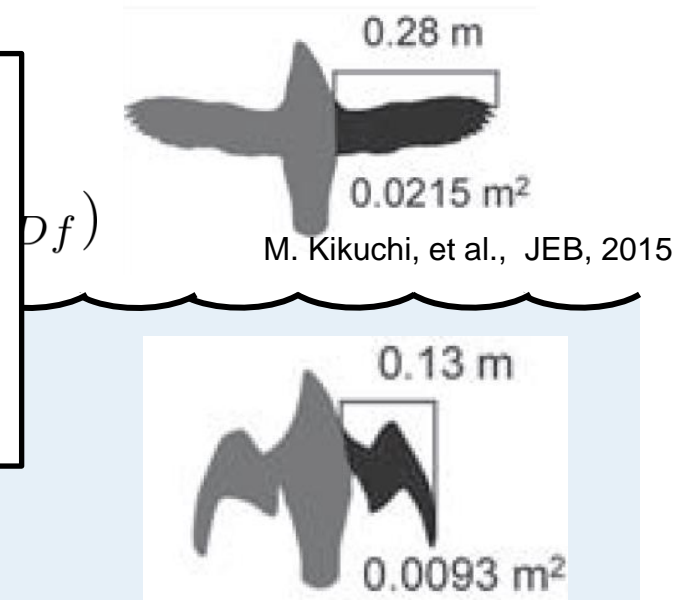
- Air: enough lift to balance weight (undersized wing)
- Water: enough thrust to overcome drag (oversized wing)

Wing Trajectory Figure-Of-Merit:

$$\frac{F_L \sim A_{\text{air}} C_{L,\text{air}}}{F_T \sim A_{\text{water}} C_{T,\text{water}}} \geq 10$$

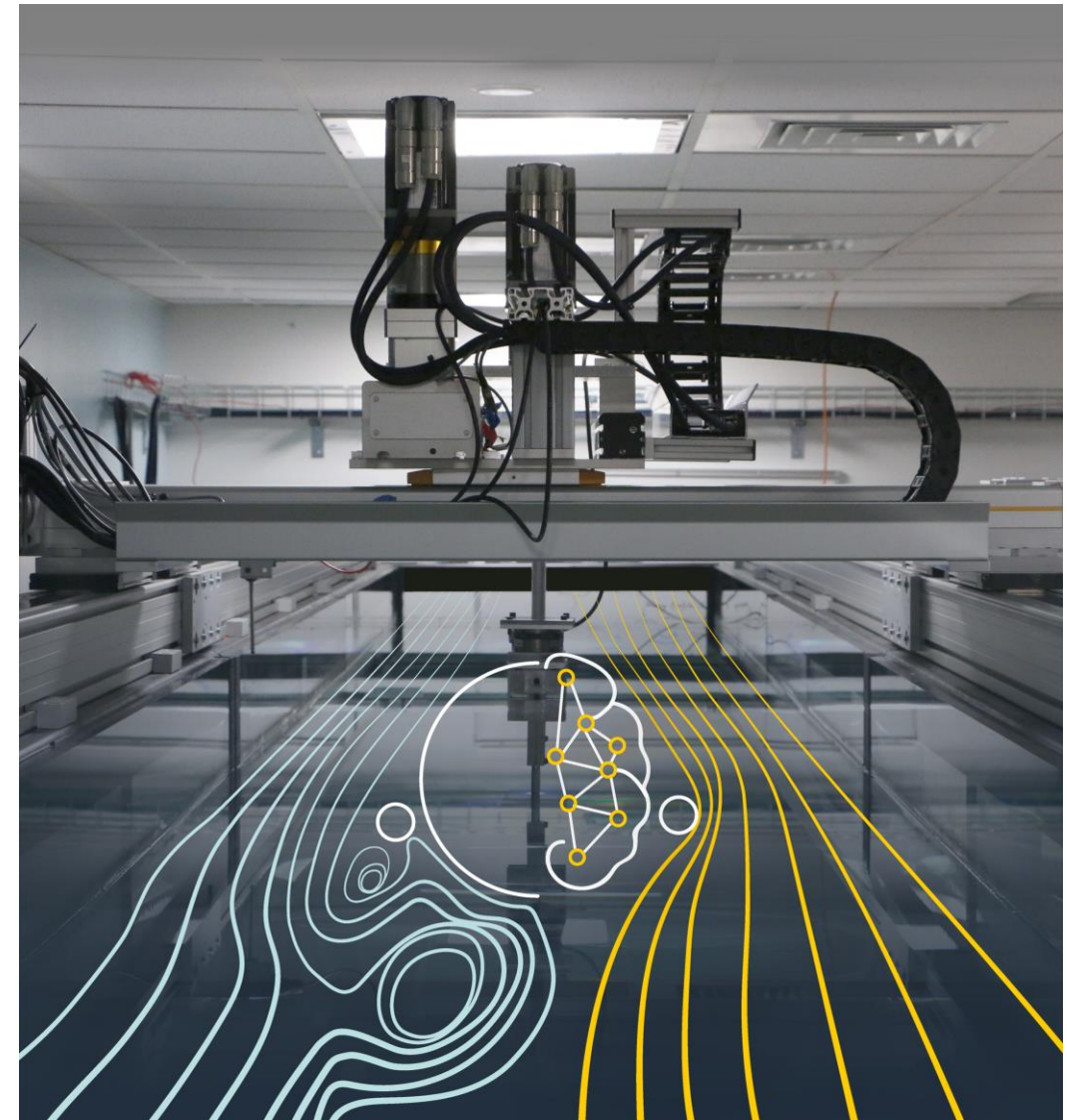
$\sim 3 - 5$

$$\text{Thrust} = \frac{1}{2} \rho_{\text{water}} U_{\text{water}}^2 A_{\text{fuselage}} C_{Df}$$

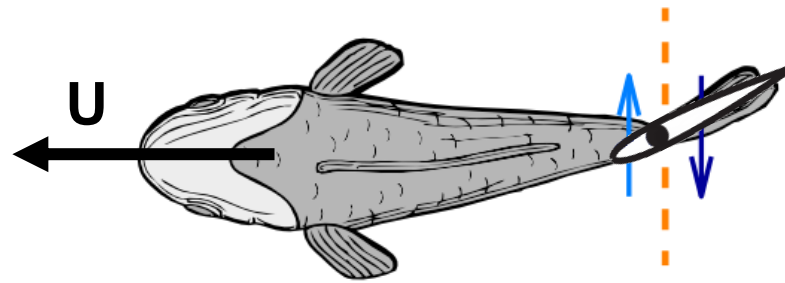


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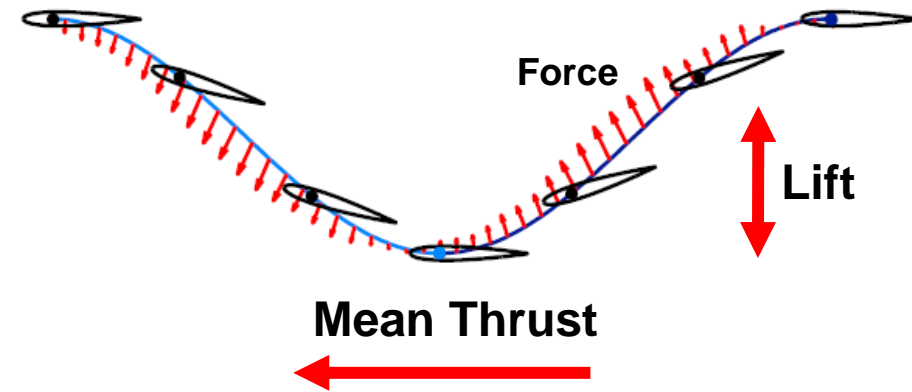
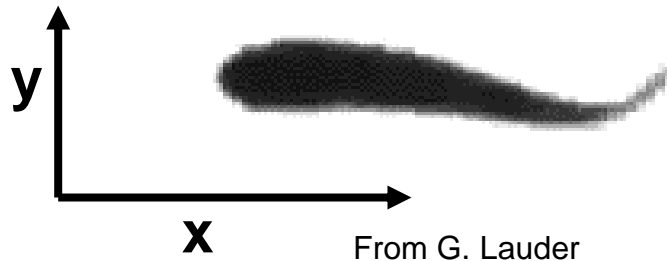
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# One Minute Flapping Foil Theory: Symmetric Flapping



Heaving &  
Pitching Foil Tail

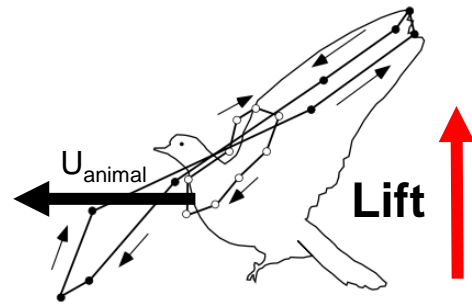


$$\text{rms}(\text{Lift}) \approx \text{mean}(\text{Thrust})$$

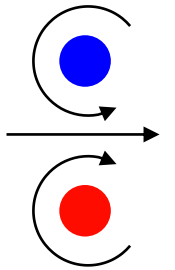
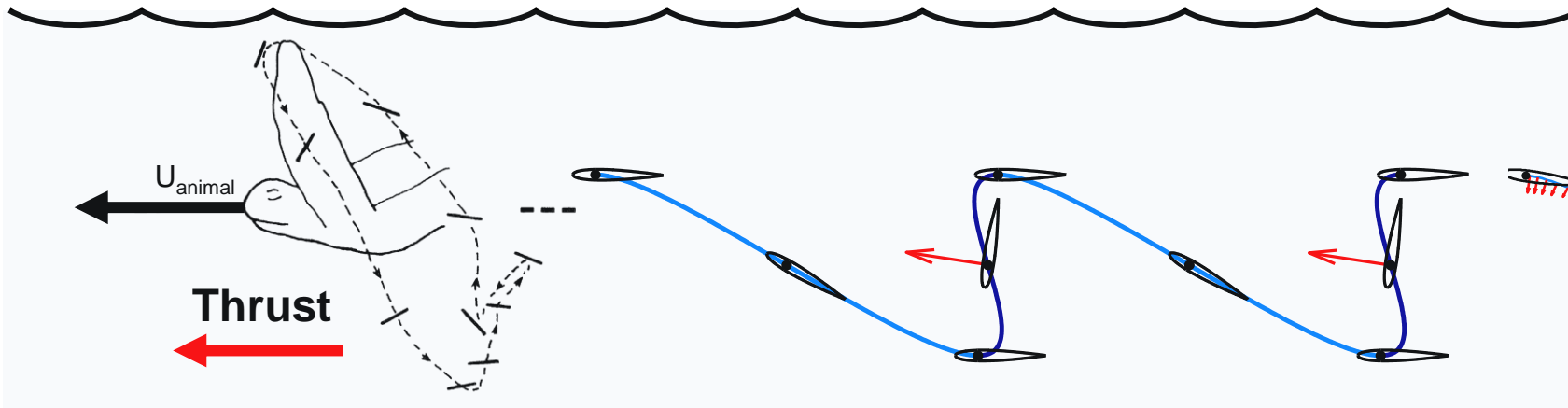
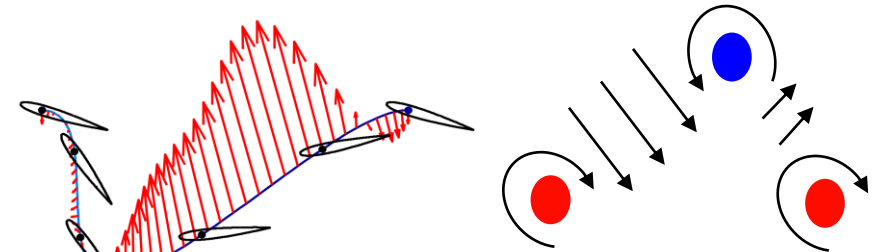
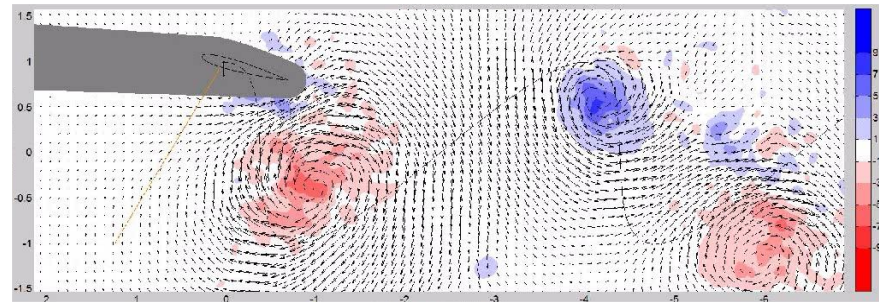


# Non-Symmetric Flapping

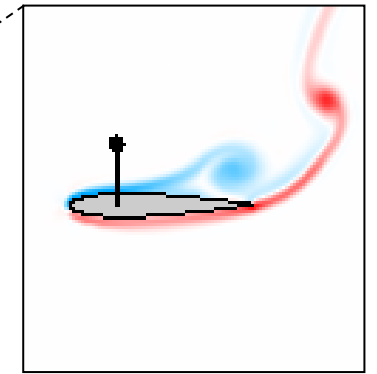
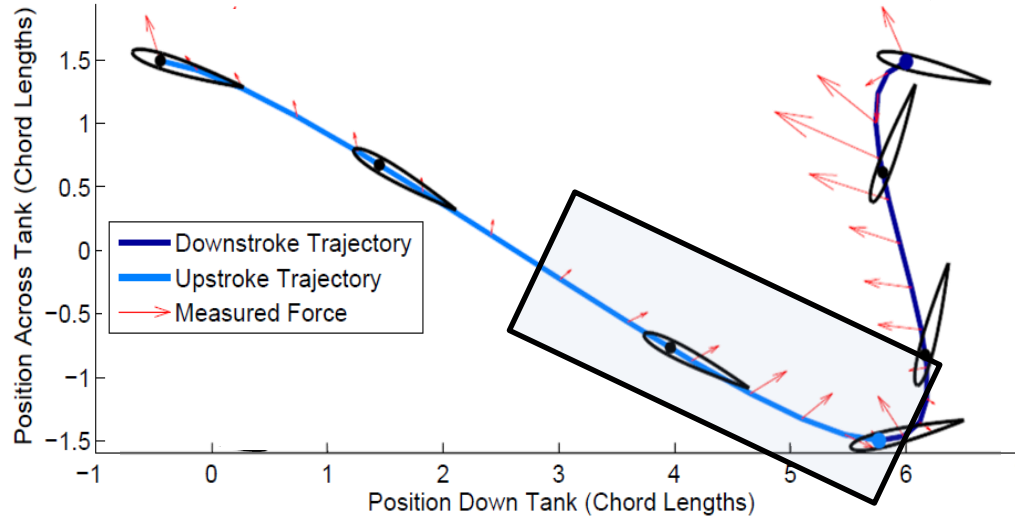
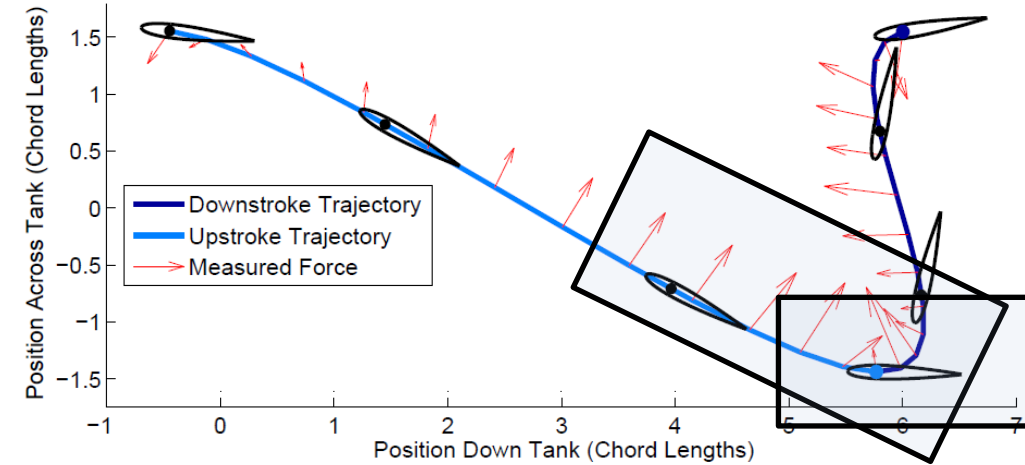
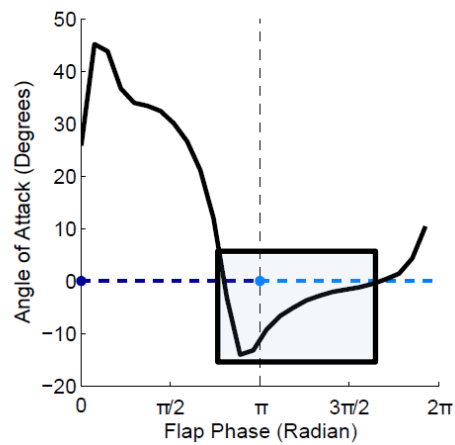
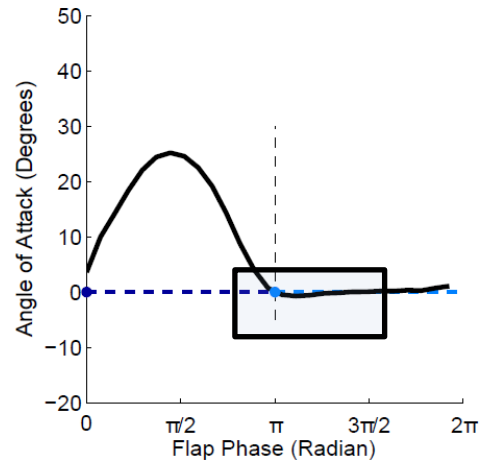
Animal Coordinate



Earth Coordinate

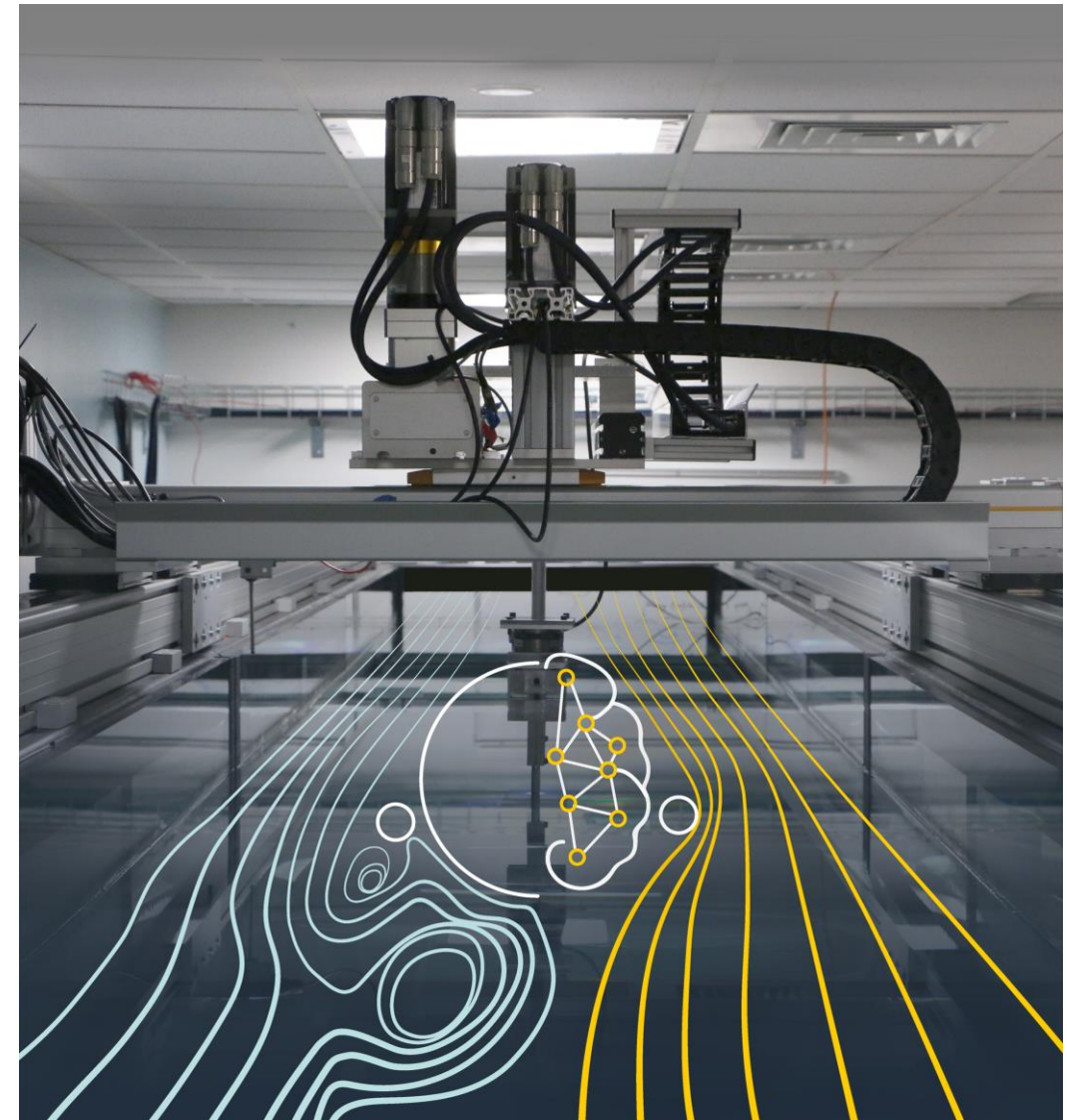


# Challenges in Flapping Foil Vortical Flow Control

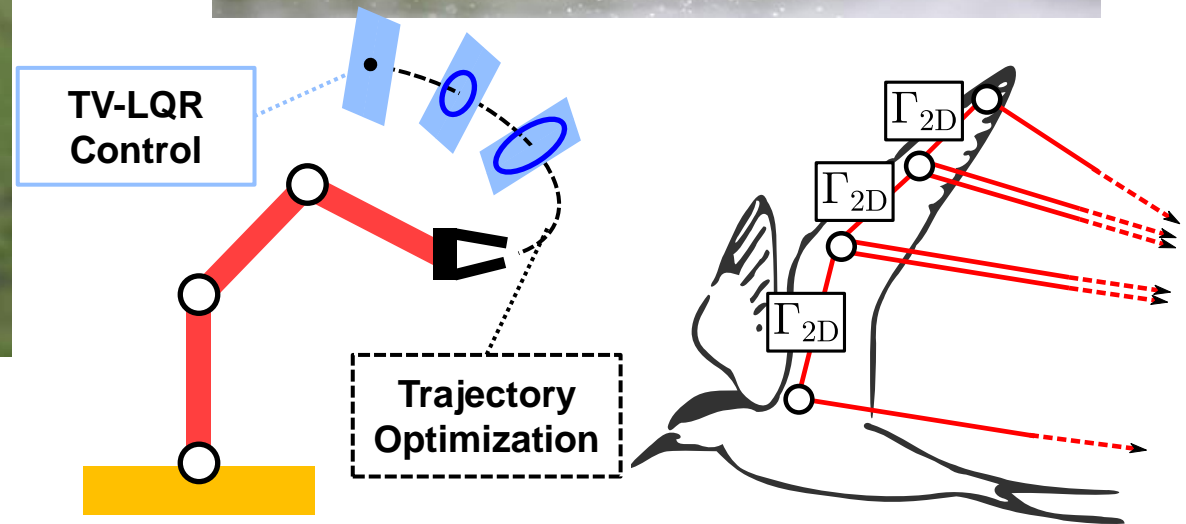


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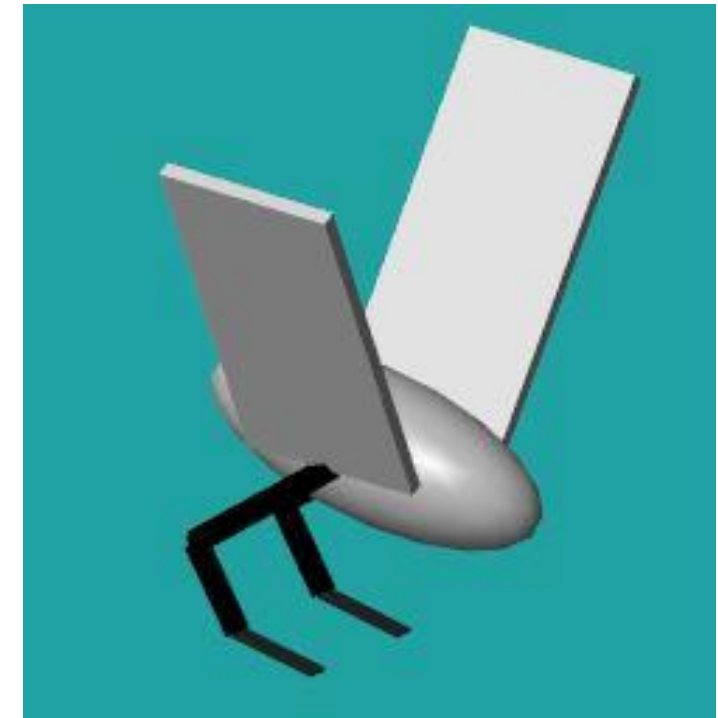
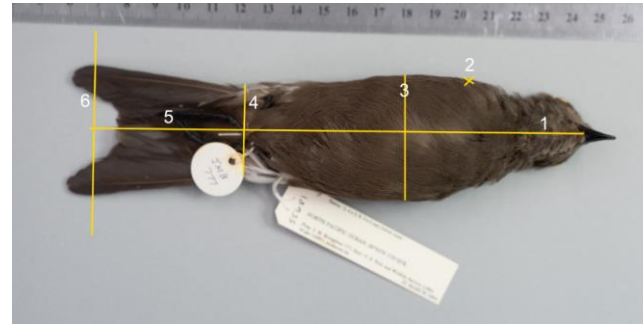


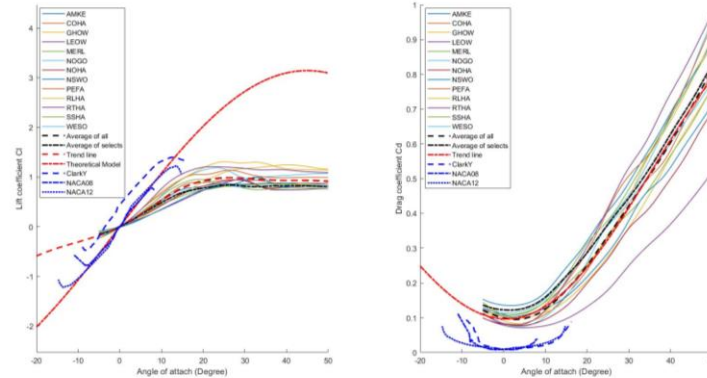
# Future challenges: Robotic Control



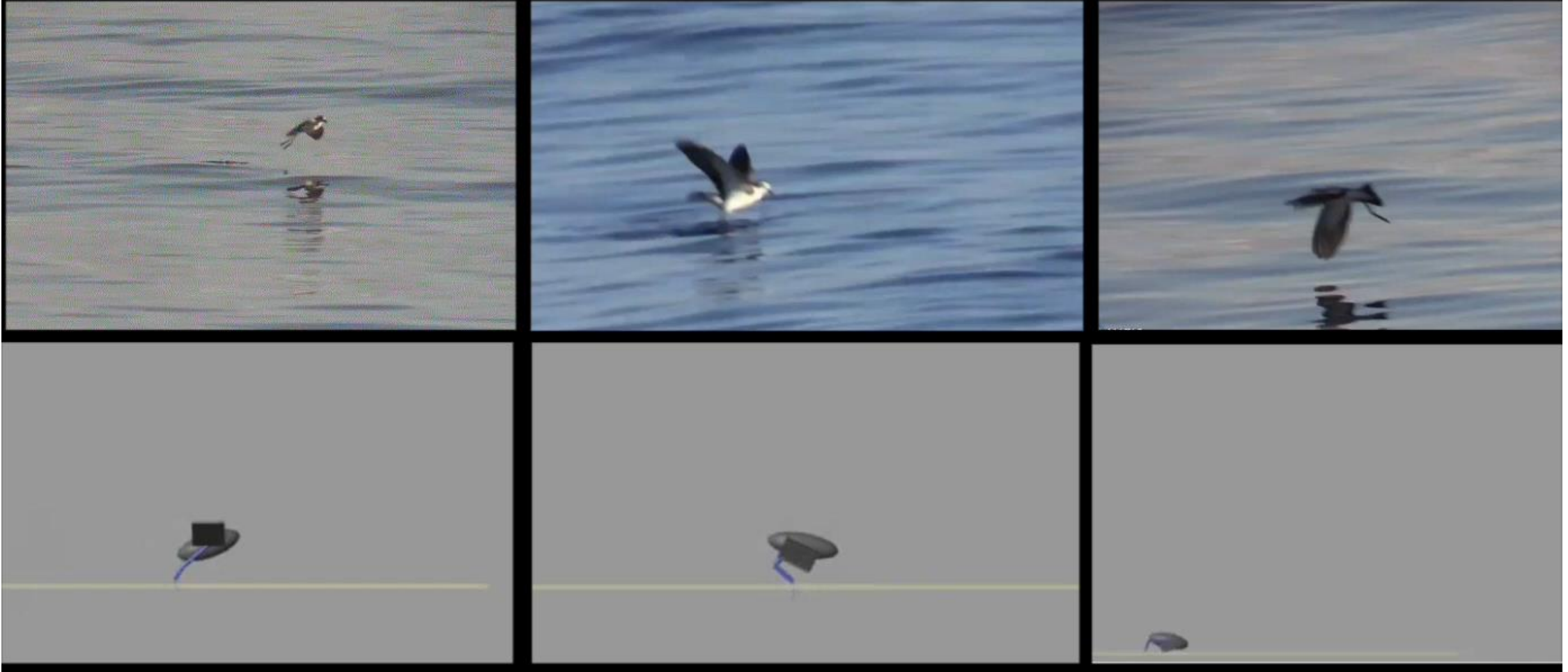


## A cute example: a gentle touch on the water





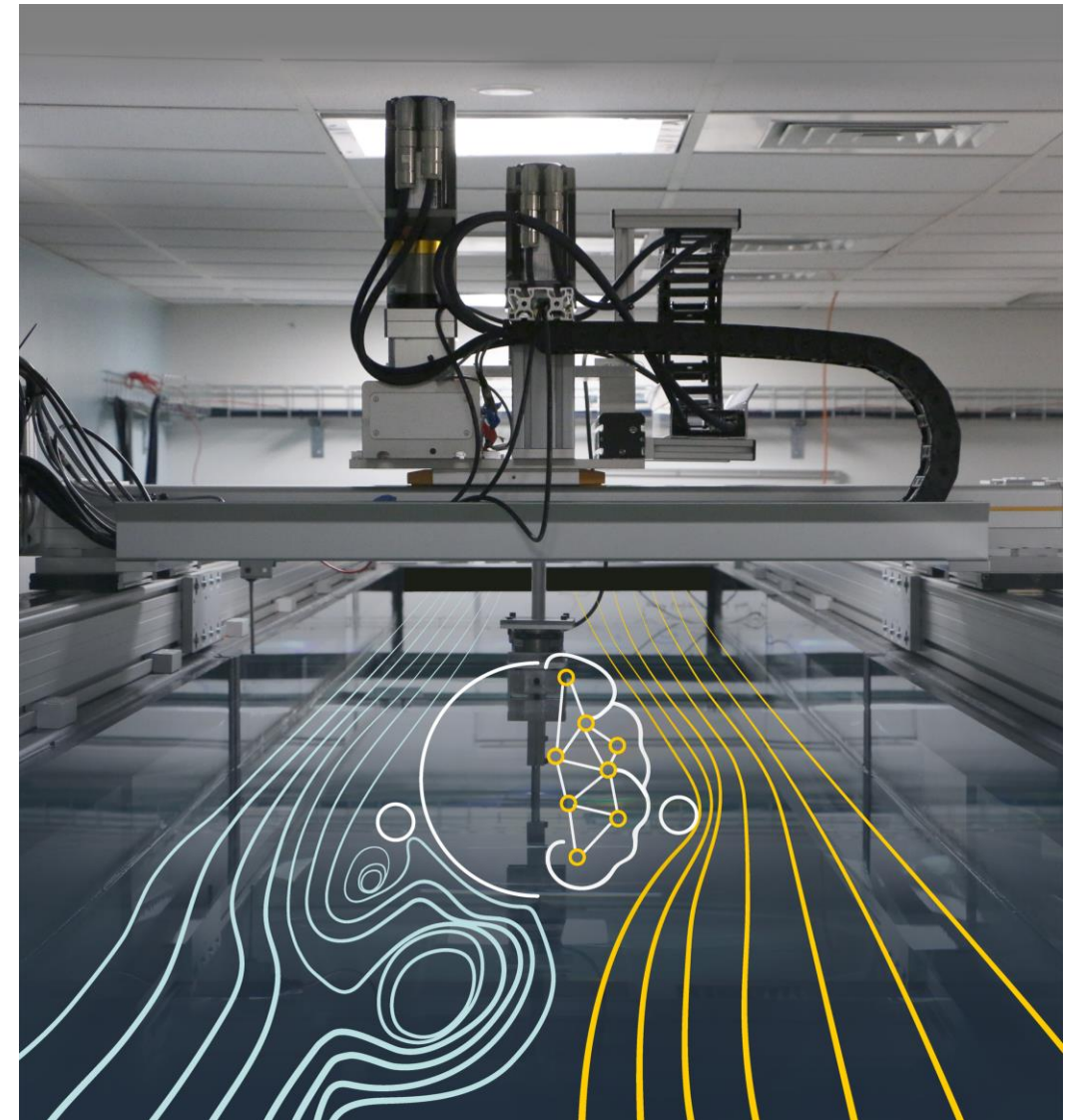
## A cute example





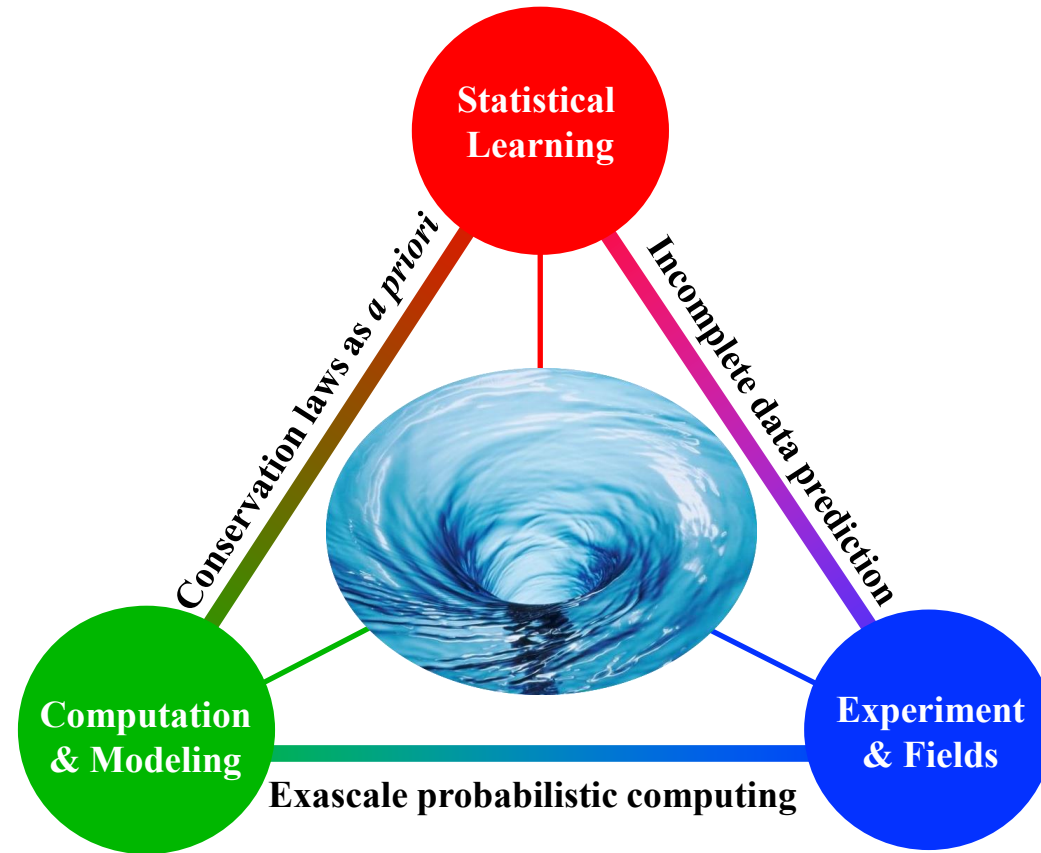
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# Physics-informed (and -informative) Learning for Fluid Mechanics



# MATLAB EXPO

Thank you



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