

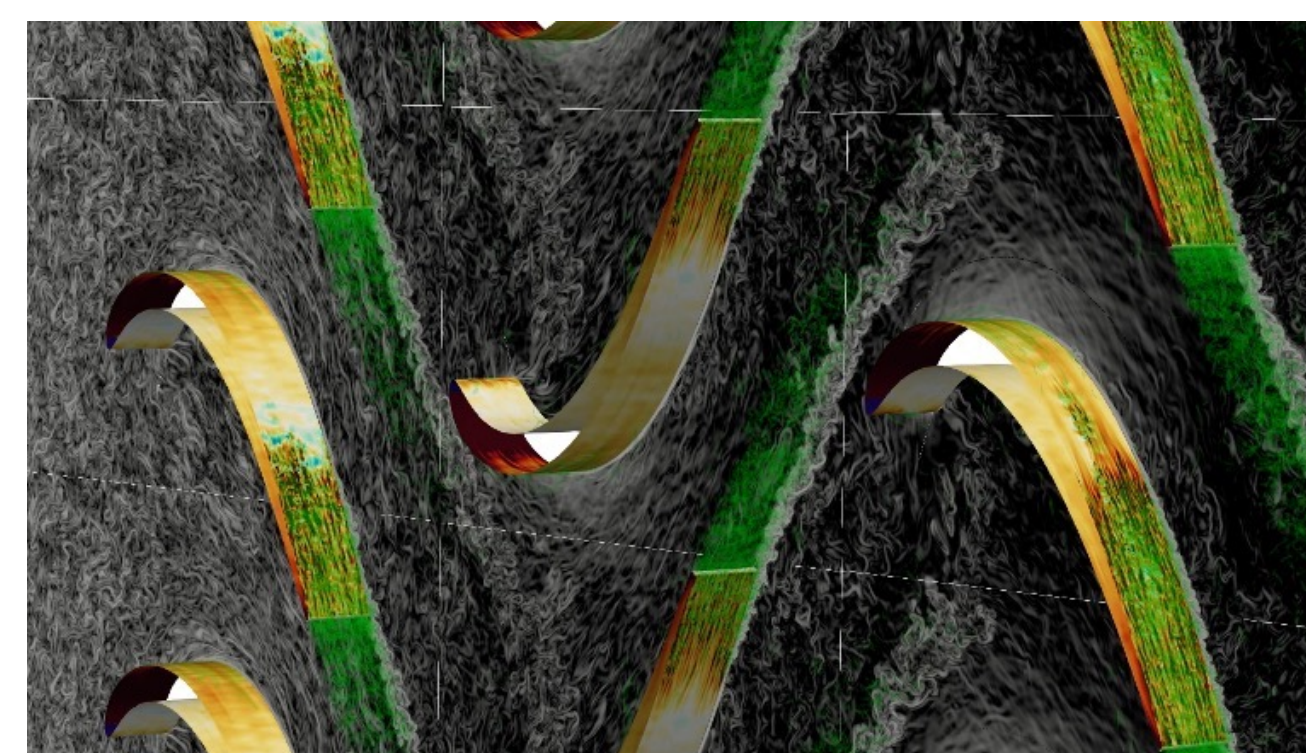
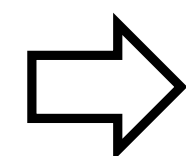
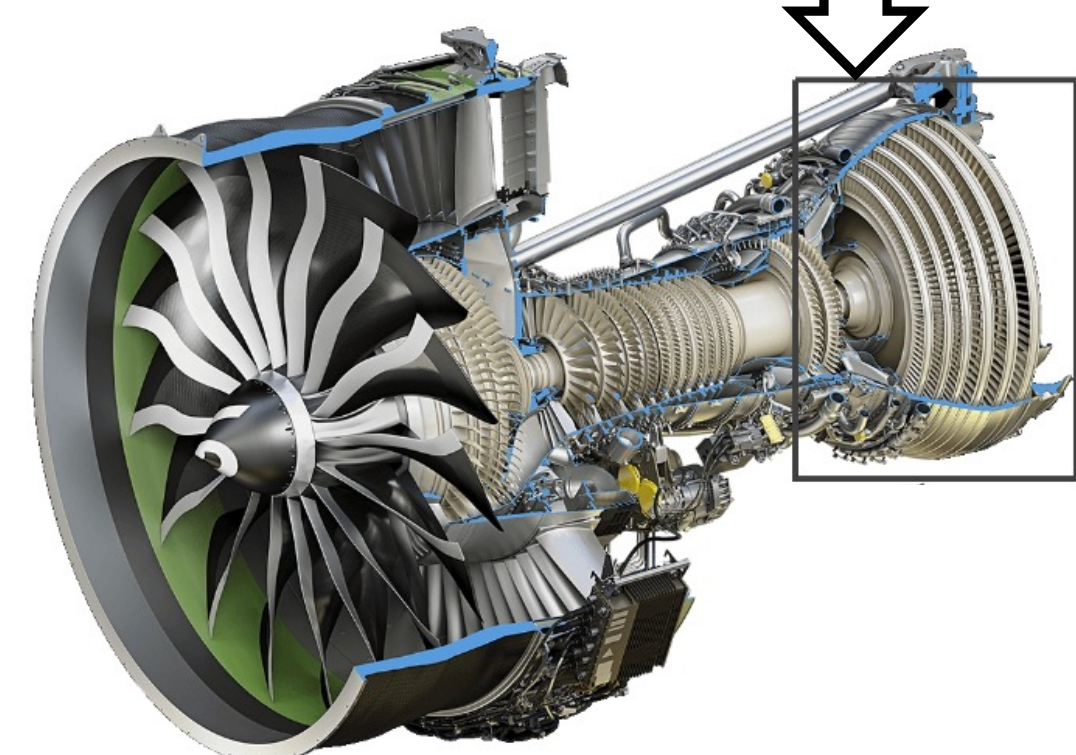
Machine-Learning Strategies for Aircraft Efficiency Enhancement with Unsteady Inflow Conditions

Yue Gu, Yuan Fang, Harshal D. Akolekar, Andrew S. H. Ooi, Richard D. Sandberg

Background



Commercial aviation burns over **360 billion liters of fuel** every year!

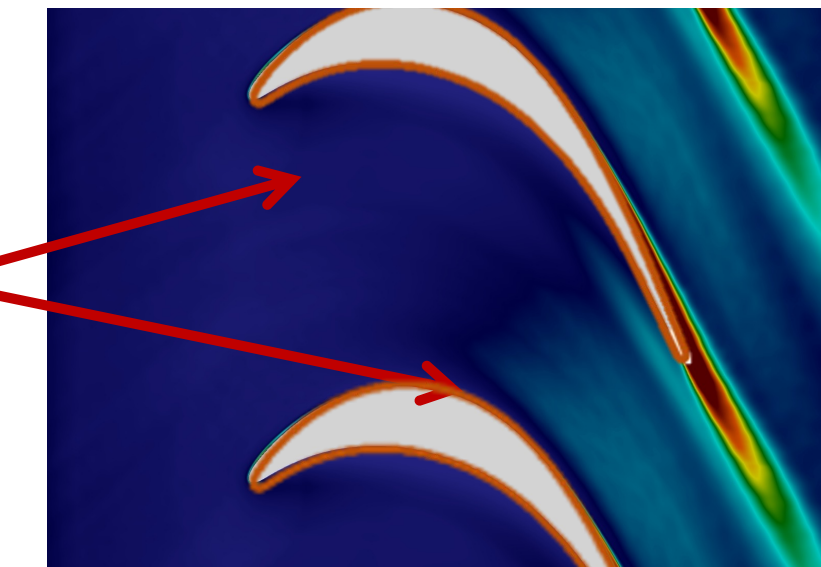


Unsteady flow leads to **higher loss and efficiency reduction!**

Motivation:

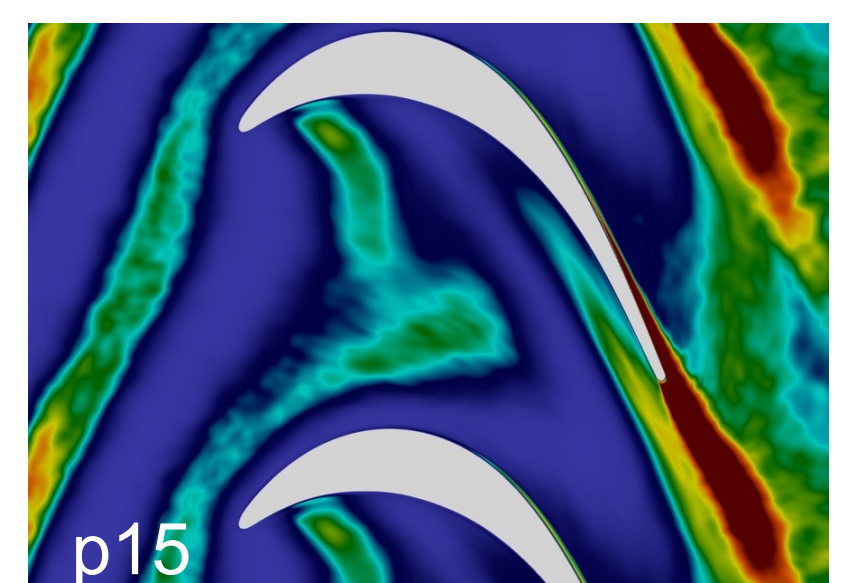
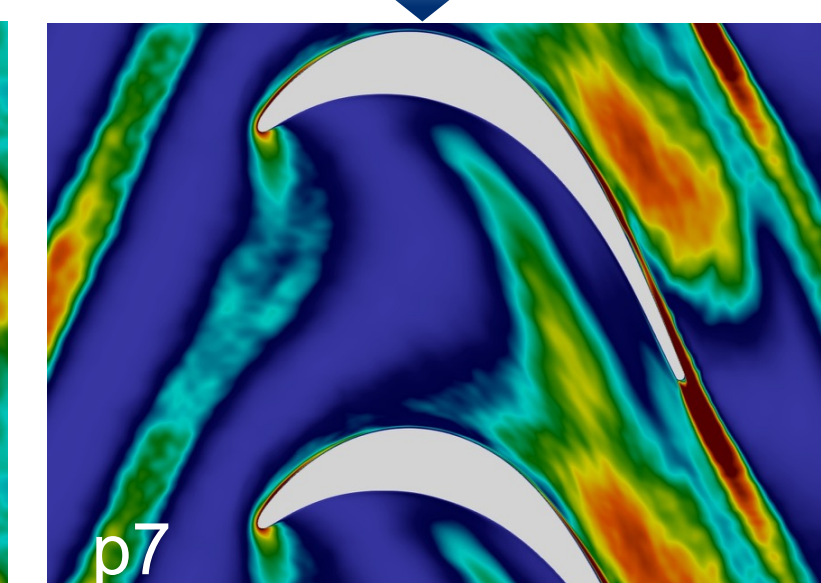
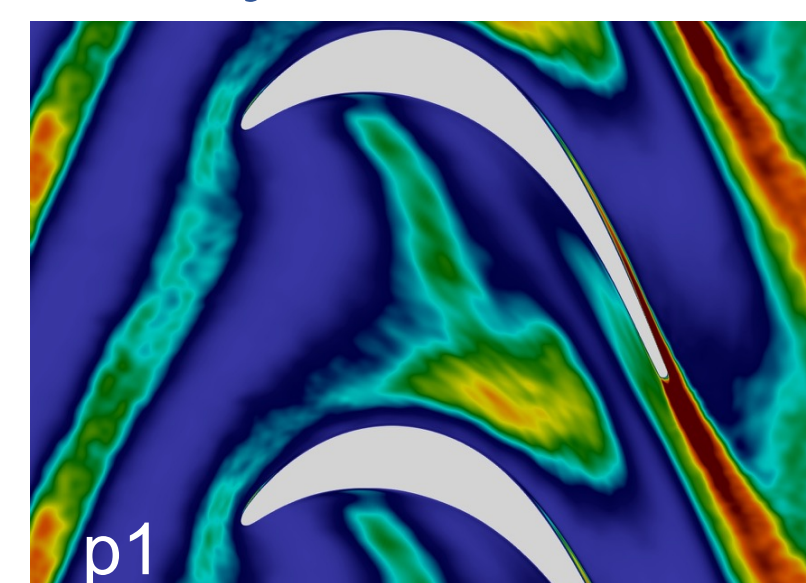
Time averaging data:

Missed wake distortion and impingement



Unsteady physics is averaged out!

Reality:



How can machine learning learn and retain unsteady flow information?

Novel ML Extension for Unsteady Inflow case

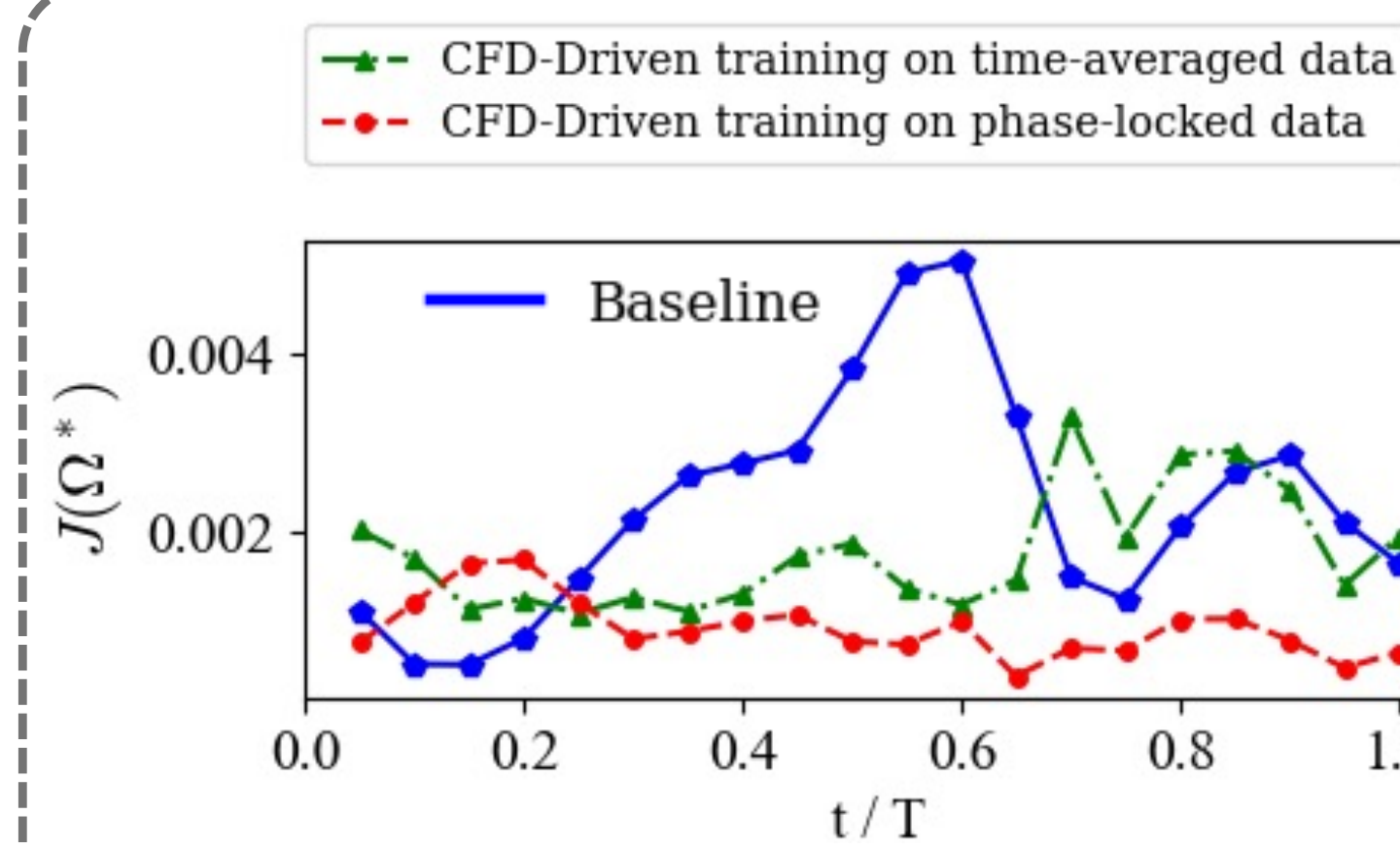
Model Correction

Gene Expression Programming

Unsteady
RANS

Model Evaluation

$J_{MOI}(|Q_{Truth} - Q_{URANS}|)$

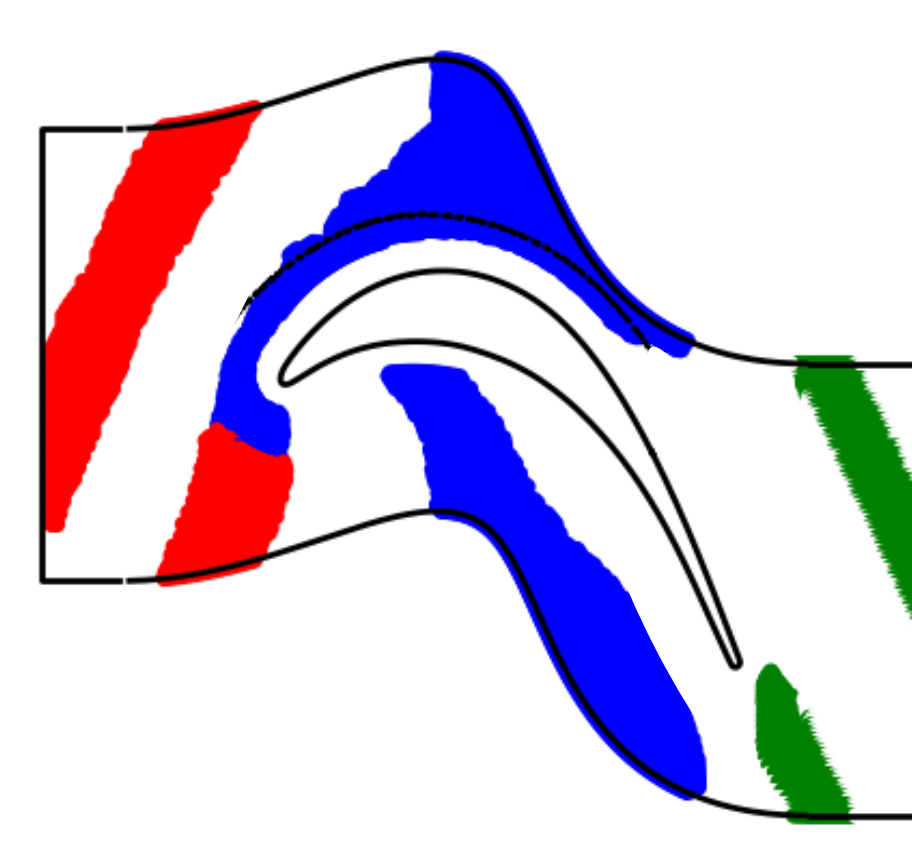


Phase-lock averaged
 $Q^* : J(\Omega^*)/J(\tau_w^*)$

➤ Transient information

Turbulence model:

$$g_n(I_1, I_2, \mathbf{N}_1, \mathbf{N}_2) \Rightarrow \Omega^*$$



Incoming
wake
Passage
wake
TE wake

➤ Zonal Differentiation by the various input features $\mathbf{N}_1, \mathbf{N}_2$

Transition model:

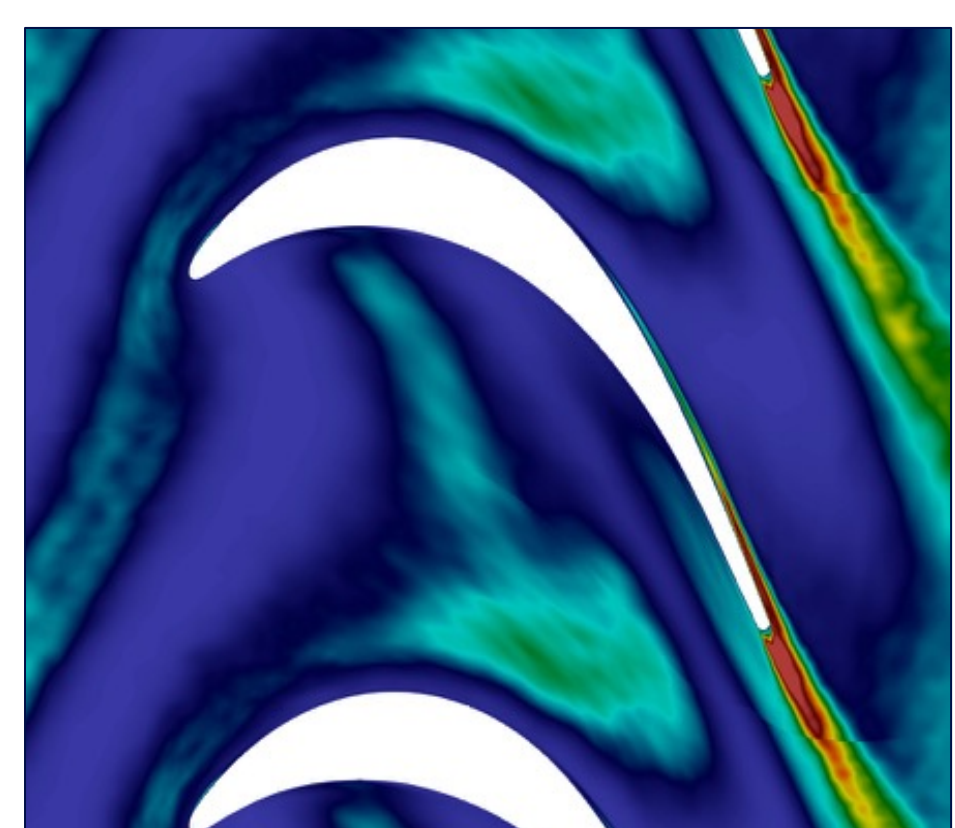
$$c_{ss}(f_{pg}, S/\Omega) \Rightarrow \tau_w^*$$

- shear-sheltering function:
 $f_{ss} = \exp(-(c_{ss}\Omega y/k)^2)$
- large-scale turbulent fluctuation contributes to LKE production:
 $k_{T,l} = (1 - f_{ss})k, \gamma = \frac{k_{T,s}}{k_l + k_{T,s}}$
- c_{ss} contains information of incoming wake disturbances

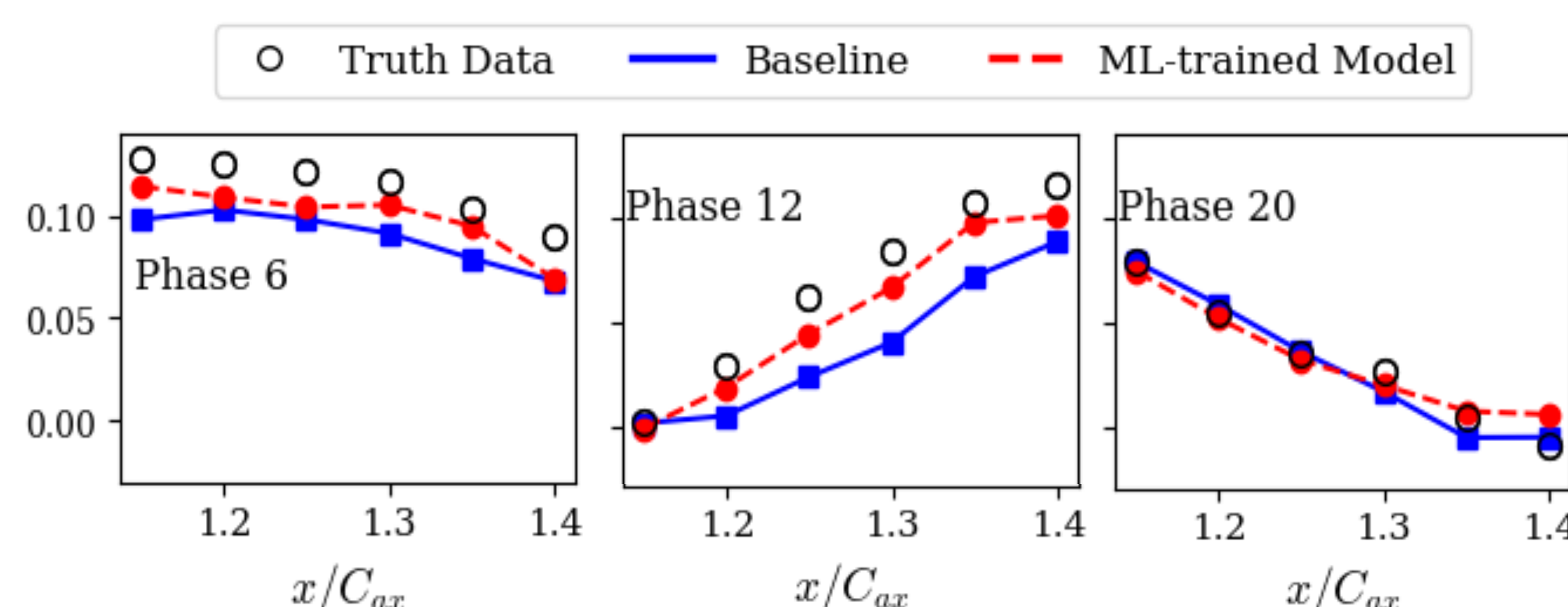
Model Training

I: Turbulent Model Development

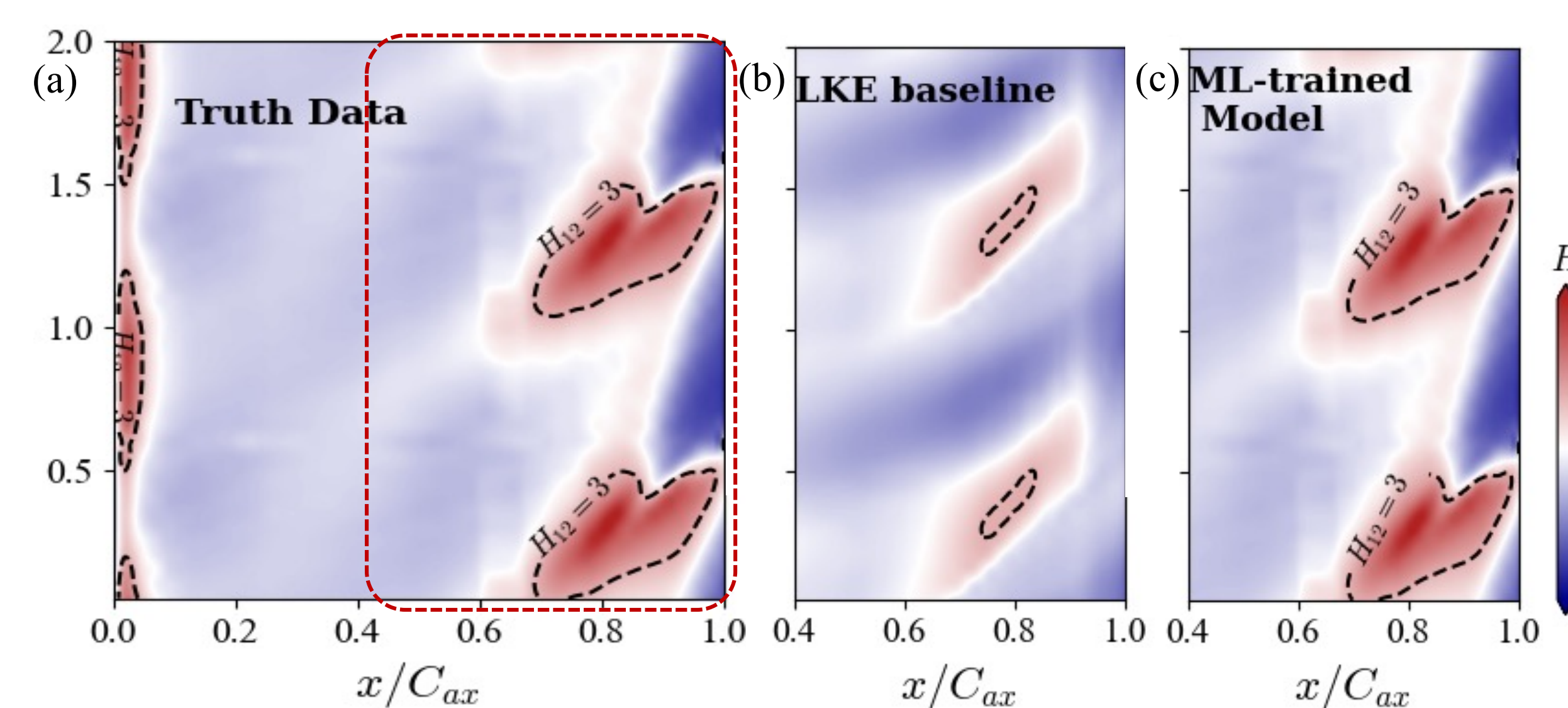
II: Transition Model Development



Flow Configuration of Training Case (one moving bar)

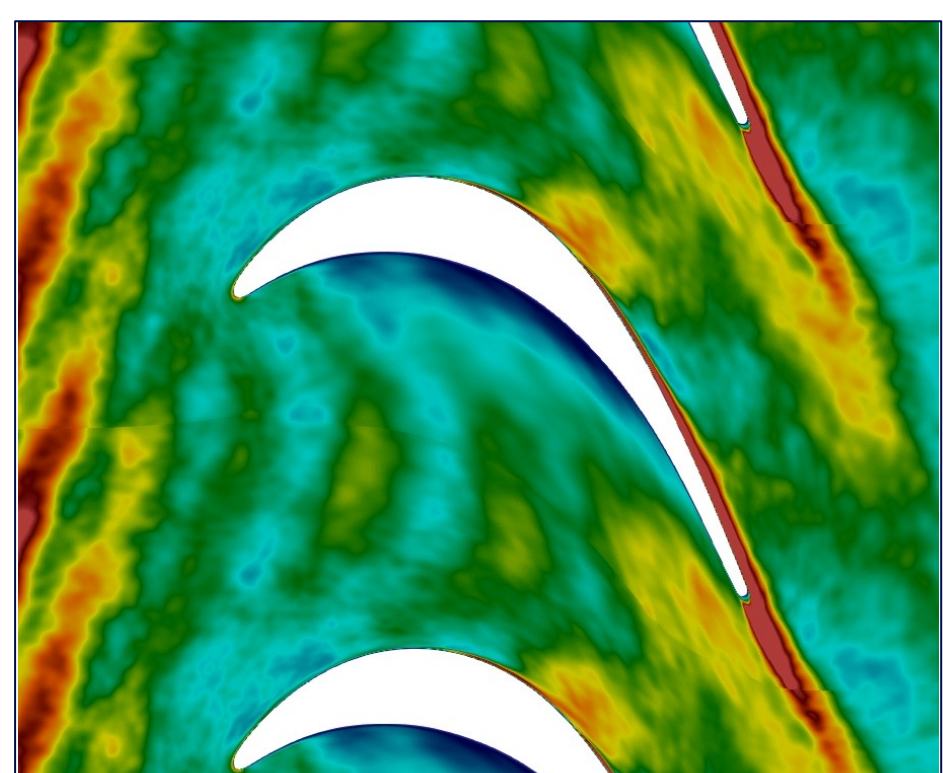


Wake Mixing Downstream of Training Edge

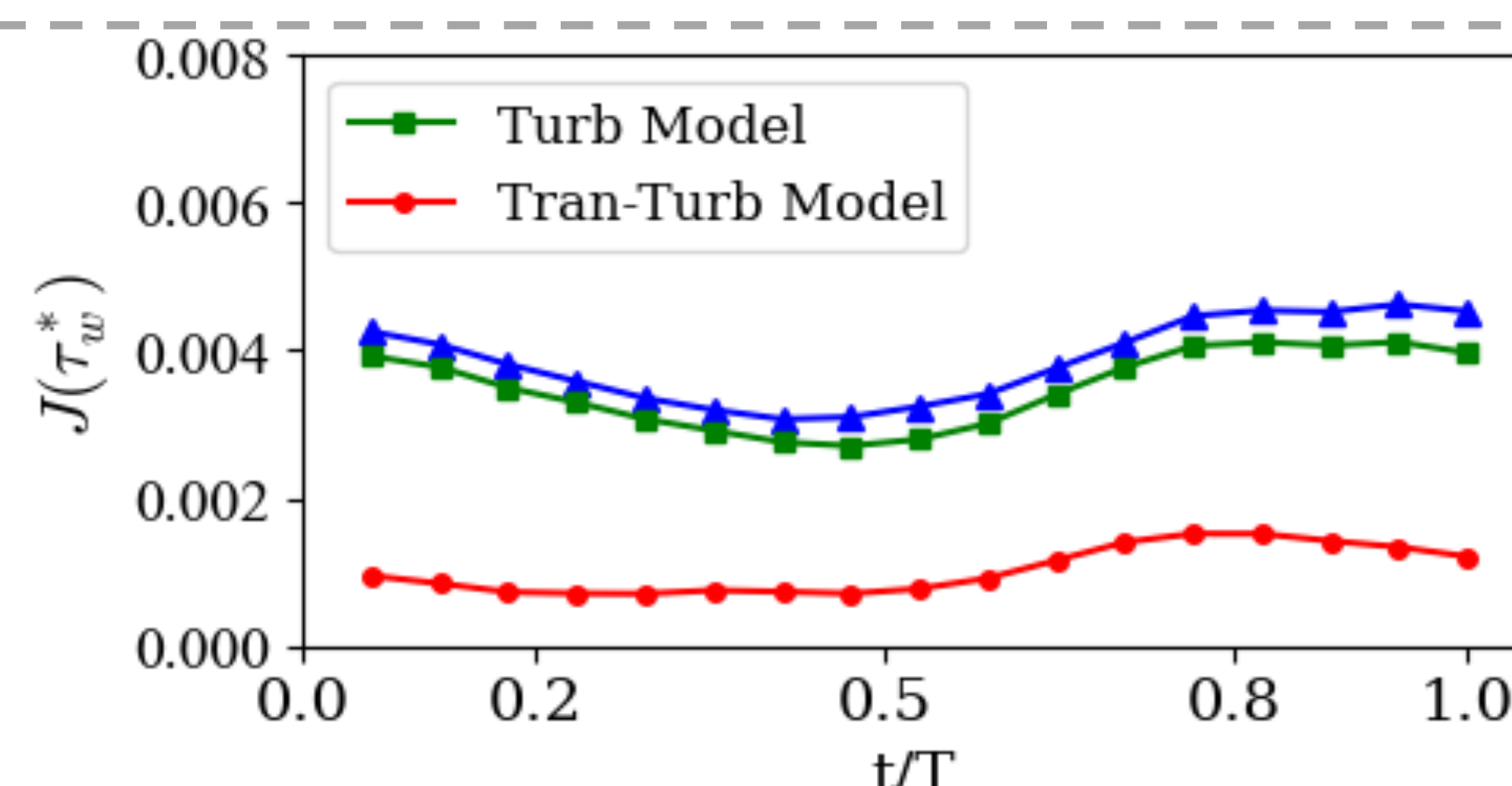


Space-Time Diagram of Shape Factor

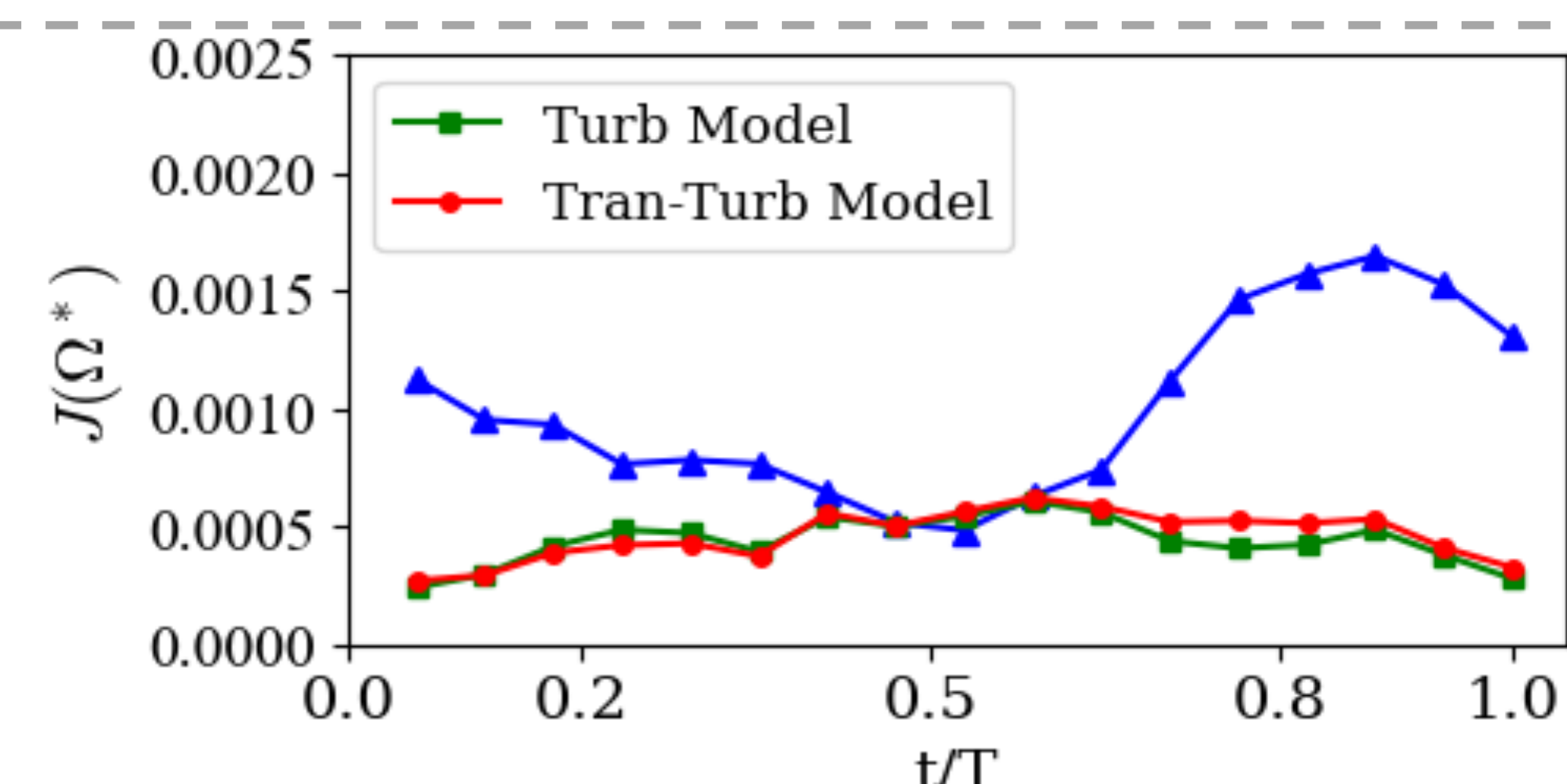
Model Testing



Flow Configuration of Testing Case (two moving bars)



Phase-locked Error of Wall Shear Stress (left) and Wake Loss (right)



Conclusion

- The ML-trained models significantly **improved predictive accuracy**, reducing errors to roughly **20%** of the baseline.
- These improvements **generalize well across** a range of incoming wake dynamics.