



# Control of Large-Scale Motions in Turbulent Boundary Layers

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# What is a Large-Scale Motion?

- Coherent motions in wall-bounded turbulent flows
- Characteristics:
  - Size in the order of the boundary layer thickness
  - Large fraction of the turbulent kinetic energy
  - Significant contribution to average Reynolds shear stresses
- Consist of smaller structures (e.g. hairpin vortices)



### **Control Scheme**



#### Re-energize the boundary layer by moving LSMs toward the wall

### **Turbulent Boundary Layer DNS**



Q Criterion isosurfaces colored by height

Direct numerical simulation of a turbulent boundary layer at  $Re_{\theta} = 1100 - 2000$  using the spectral element code **Nek5000** | Boundary layer is tripped with random streamwise forcing

### A Closer Look at Velocity Fluctuations



 $\delta_{99}$ 

 $Re_{\theta}$  = 1800 | Isosurfaces at u' = ±0.1U<sub>inf</sub>

– -0.15 – -2.0e-01

### Side View of Positive Fluctuations



### Side View of Negative Fluctuations



### Model Predictive Control of LSMs





### **Detect an LSM**



Use the 3D flowfield to directly detect LSMs (e.g. by low-pass filtering the streamwise velocity fluctuations)

### **Predict LSM Trajectory**



Use Taylor's hypothesis to predict the trajectory of an LSM

### **Creating Downwash**



## Force Field Distributions (x-y plane)





- 2.0e-01 - 0.15

- 0.1 - 0.05 Fx = -Fy

### **Plasma Actuators\***

**Body Forces of a Plasma Actuator** 



Figure 1. Sketch of the effect of a dielectric barrier discharge (DBD) plasma actuator in a quiescent ambient fluid (left) and in a boundary layer (right).



#### Experiment

#### Suzen & Huang Model

Figure 7. Spatial distribution of the wall-parallel (left) and wall-normal (right) components of the forcing term from the experimental data (top), from the Suzen & Huang model (bottom).

\*Brauner, T., Laizet, S., Benard, N. and Moreau, E., 2016. Modelling of dielectric barrier discharge plasma actuators for direct numerical simulations. In *8th AIAA Flow Control Conference* (p. 3774).

### Gaussian Jet: Mid-plane Wall-Normal Velocity



### Gamma Jet: Mid-plane Wall Normal Velocity



### **Optimal Output Tracking Control**

$$U_{k}^{*} = \underset{U_{k}}{\operatorname{argmin}} \|y(k+N|k) - y_{\operatorname{des}}(k+N|k)\|_{P}^{2}$$

$$+ \sum_{i=k}^{k+N-1} \|u(i|k)\|_{R}^{2} + \|y(i|k) - y_{\operatorname{des}}(i|k)\|_{Q}^{2}$$
Optimal Control Inputs
Jet Magnitude
Minimize Control Effort
Maximize Downwash

We need a model for predicting the downwash for a given input

### **Optimal Output Tracking Control**

$$U_{k}^{*} = \underset{U_{k}}{\operatorname{argmin}} \|y(k+N|k) - y_{\operatorname{des}}(k+N|k)\|_{P}^{2} \qquad \text{Minimize Control Effort} \\ + \sum_{i=k}^{k+N-1} \|u(i|k)\|_{R}^{2} + \|y(i|k) - y_{\operatorname{des}}(i|k)\|_{Q}^{2} \\ \text{subject to} \qquad z(i+1|k) = Az(i|k) + Bu(i|k) \\ y(i|k) = Cz(i|k) \\ 0 \le u(i|k) \le 1 \\ z(k|k) = z(k) \\ \text{ROM Dynamics} \\ + \\ \text{Input Constraints} \\ \end{bmatrix}$$

We need a model for predicting the downwash for a given input

### Sparsity-Promoting DMD with Control

DMDc Reduced-Order Model:

 $oldsymbol{\psi}_{k+1} = \Lambda oldsymbol{\psi}_k + \Gamma oldsymbol{u}_k$   $oldsymbol{y}_k pprox \Phi oldsymbol{\psi}_k$ 

Sparsity-Promoting Optimization:

$$\min_{\boldsymbol{\alpha}} \left\| \mathbf{Y}' - \Phi \operatorname{diag}\{\boldsymbol{\alpha}\} \mathbf{R} \right\|_{\mathrm{F}}^{2} + \varepsilon \left\| \boldsymbol{\alpha} \right\|_{0}$$

Use reweighted L1 norm instead

1.5 10 8 N 0.5 -6 1.5 2 2.5 3 3.5 х

Tsolovikos et al., Estimation and Control of Fluid Flows Using Sparsity-Promoting Dynamic Mode Decomposition, IEEE Control Systems Letters, 2021

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### Control of Fluid Volumes | Laminar Boundary Layer



Tsolovikos et al., Model Predictive Control of Material Volumes with Application to Vortical Structures, AIAA Journal, 2021

### Control of Synthetic LSMs | Laminar Boundary Layer



### Control of Synthetic LSMs



Change in **Vorticity Fluctuation RMS** when targeting a synthetic LSM

## Reduced-Order Models for Downwash Prediction



### Reinforcement Learning (No Model Needed)



Proximal Policy Optimization with LSTM policy and discrete actions (jet is on/off)

### **Next Steps**

- LSMs in an adverse pressure gradient turbulent boundary layer
- MPC control of LSMs for **separation delay**
- Large-eddy simulations to speed up computations
- Dynamic Mode Decomposition + Gaussian Processes for more accurate flowfield predictions
- **Reinforcement learning** for LSM control

### alextsolovikos.github.io