



**DEEP LEARNING** 

#### **MODAL DECOMPOSITION**

Pattern detection Reconstruction

**Prediction** 

**HOSVD** 

**Data Repairing** 

**HODMD** 

Pattern detection

**Autoencoders** 

Reconstruction

Superresolution

**Full DL** 

**Prediction** 

Hybrid

**HODMD** 

ModelFLOWs

**Superresolution** 



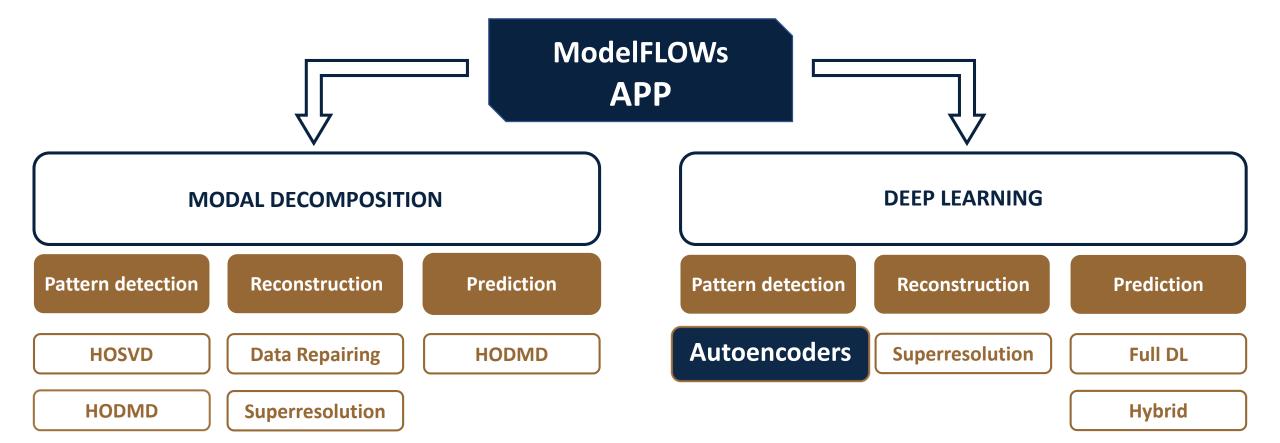
























## Motivation



## Extraction and analysis of flow features in planar synthetic jets using different machine learning techniques

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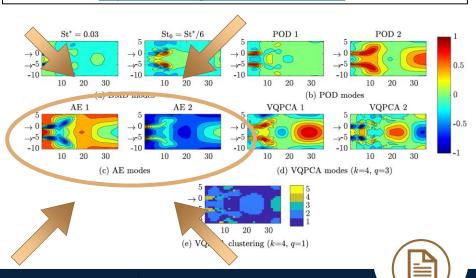
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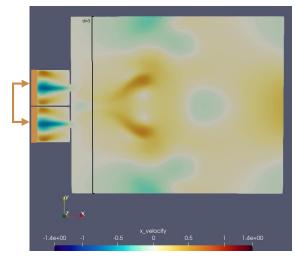
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### Two planar synthetic jets

Membrane or piston



(Muñoz & Le Clainche, 2022)

### Periodical movement:

- Injection phase
- Suction phase









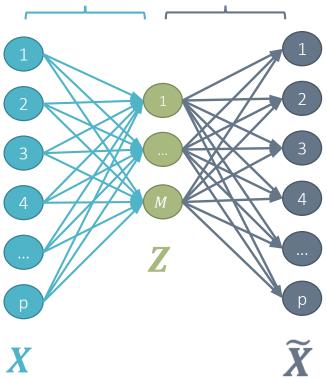




# Methodology



## **Encoder** Decoder



Autoencoder is a Deep Neural Network (DNN) that provides unsupervised feature extraction

X = Input

**Z** = Compressed data

 $\widetilde{X}$  = Reconstructed input











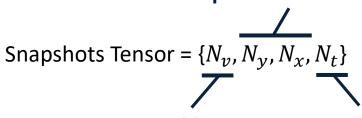


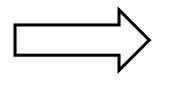


### **Autoencoders**

# Database & Data preparation



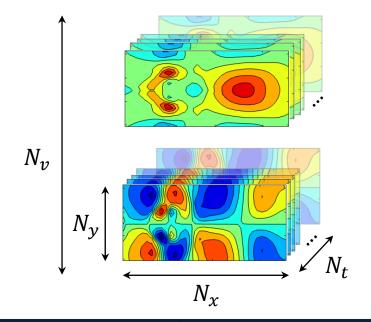




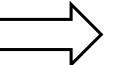
 $Matrix = \{N_v N_x N_y | N_t\}$ **Temporal Spatial Dimensionality** 

#### **Variables**

**Temporal dimensions** 



$$N_v = 2$$
 $N_x = 45$ 
 $N_y = 22$ 
 $N_t = 4369$ 



Spatial dimensionality = 1980

Temporal dimensionality = 4369











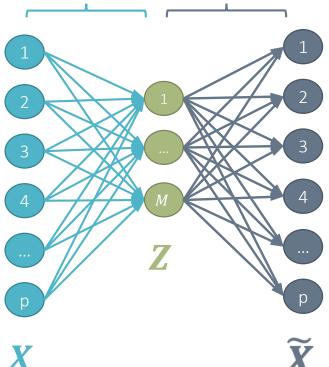




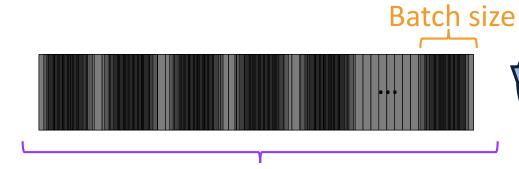
# Calibration

### Autoencoders

## **Encoder** Decoder



Hyperparameters		Restrictions	Recommendations
Training size	$p_{train}$	≤ 80 % <i>p</i>	≤ 80 %
Number of modes	M	$< p_{train}$	~10
Batch size	N <sub>batch</sub>	$< p_{train}$	32, 64, 128,
Epochs number	N <sub>epoch</sub>	_	100, 200, 500,



Epochs number

 $p_{train}$ 









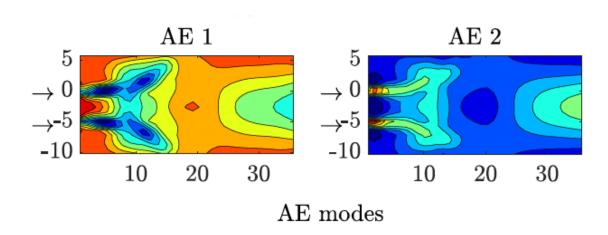


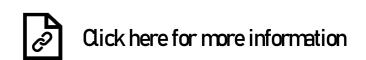


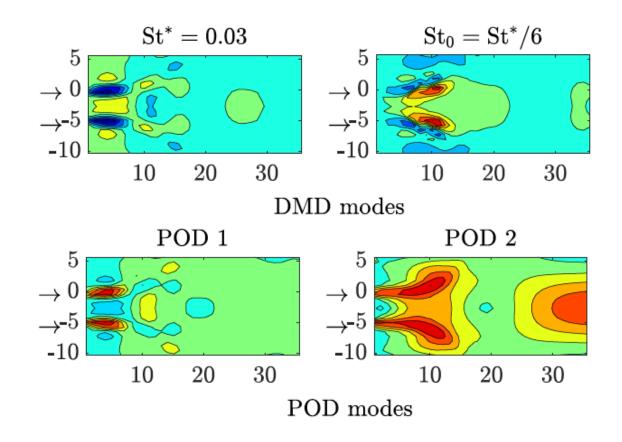


## Results

### Autoencoders







Also compared with local PCA clustering technique (VQPCA)













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