

# Stochastic approach to the receptivity problem



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## Outline

- **Introduction & Background**
  - Receptivity problem
  - Motivation for stochastic approach
- **Stochastic initial condition**
  - By-pass transition
  - Realizability of optimal disturbances
  - Comparison with optimal IC
- **Stochastic forcing**
  - Uncorrelated forcing
  - Noise colouring
  - Results for boundary layers
- **Conclusions**



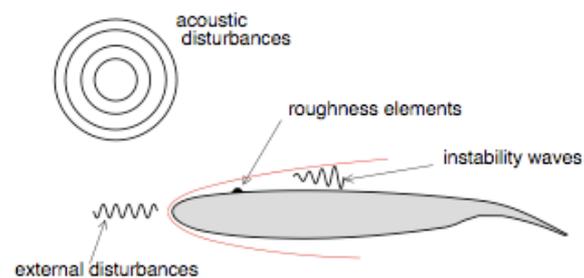
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# Boundary layer transition

- Transition is caused by breakdown of **growing disturbances** inside the boundary layer
- Instability theory can **accurately compute** growth or decay of perturbations
- **Initial amplitudes** of unstable waves need to be estimated to capture transition location:  
**Receptivity problem**



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# Stochastic Approach to Receptivity

## Motivation

- Predict the disturbance level for initial and external conditions, expected or modeled
- Estimate the realizability of optimal disturbances
- Robustness of deterministic results



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Use a stochastic approach assuming a statistic description of external perturbations

## Problem formulation

- Linear discrete governing equations

$$\dot{q} = \mathcal{A}q + f u(t), \quad q(x, t = 0) = q_0.$$



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- Covariance of the flow defined as

$$P(x, x', t) = \text{cov}(q(x, t), q(x', t)) = \langle qq^H \rangle$$

- Lyapunov equation for evolution of  $P$

$$\dot{P} = \mathcal{A}P + P\mathcal{A}^H + M, \quad P(0) = P_0$$

$P_0$ , the covariance of the initial condition, and  $M$ , covariance of the external forcing, are modeled.

$$P_0 = \langle q_0 q_0^H \rangle; \quad M = \langle f f^H \rangle; \quad \langle u(t_1) u(t_2) \rangle = \delta(t_1 - t_2)$$



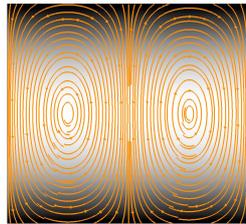
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## Stochastic initial value problem

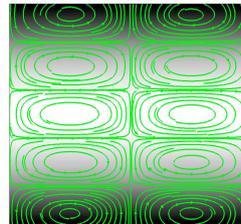
# Solution of the Lyapunov equation

$$\dot{P} = AP + PA^H$$

- Matrix equation: direct solution expensive  $P(t) = e^{At} P_0 e^{A^H t}$
- Use POD modes of  $P_0$ :  $[\phi_i, \lambda_i] = \text{eig}(P_0 Q)$



$i = 1$



$i = 10$

$Q$  defines the kinetic energy norm

Solve the equation for the most energetic modes  $\dot{\phi}_i = A\phi_i$

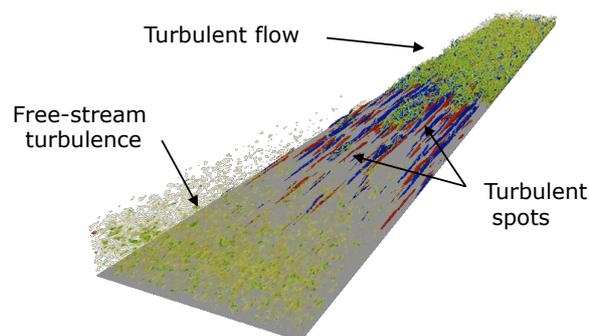
Reconstruct the covariance matrix  $P$  of the disturbance further downstream

$$P = \sum_i \phi(x) \lambda_i \phi_i(x)^H$$

# Application to bypass transition

Consider boundary layer subject to free-stream turbulence

Correlations from spectrum of homogeneous isotropic turbulence



## Disturbance description

Define covariance of initial free-stream perturbation:

Von Karman spectrum of homogeneous isotropic turbulence



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$$E(k) = \frac{2}{3} \frac{a(kL)^4}{(b + (kL)^2)^{17/6}} Lq$$

Fourier transform of two-point velocity correlation

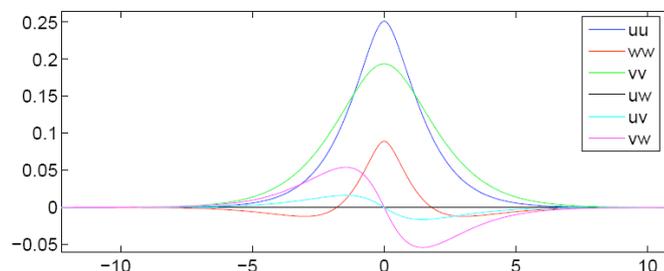
$$\langle u_i u_j \rangle = \frac{E(k)}{4\pi k^2} \left( \delta_{ij} - \frac{k_i k_j}{k^2} \right)$$

## Disturbance description

Covariance of initial free-stream perturbation  
Smoothly reduced to zero at the boundary-layer edge



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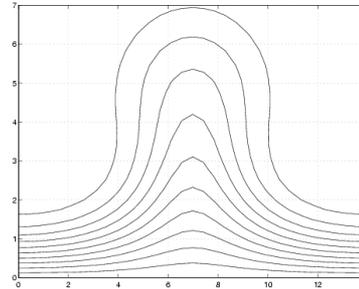
$$\langle u_i u_j \rangle (y, y'; \alpha, \beta)$$

Problem non-homogenous wall-normal direction  $y$

Fourier modes in the homogeneous directions  $(x,z)$

# Secondary instability of streaks

- Consider steady nonlinearly saturated streaks arising from optimally growing streamwise vortices at the leading edge



Cross-stream distribution of streamwise velocity

- Compute the largest possible energy amplification as function of time

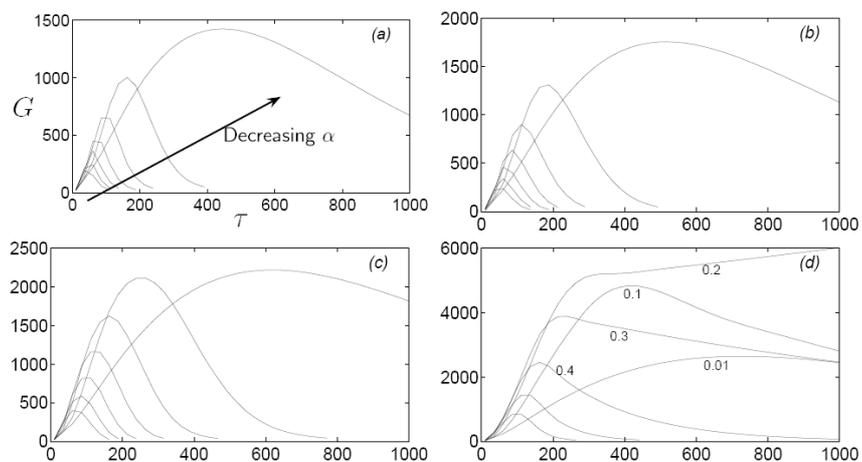
Høepffner, Brandt & Henningson (**JFM**, 2005)



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# Secondary transient growth

## Sinusoidal modes



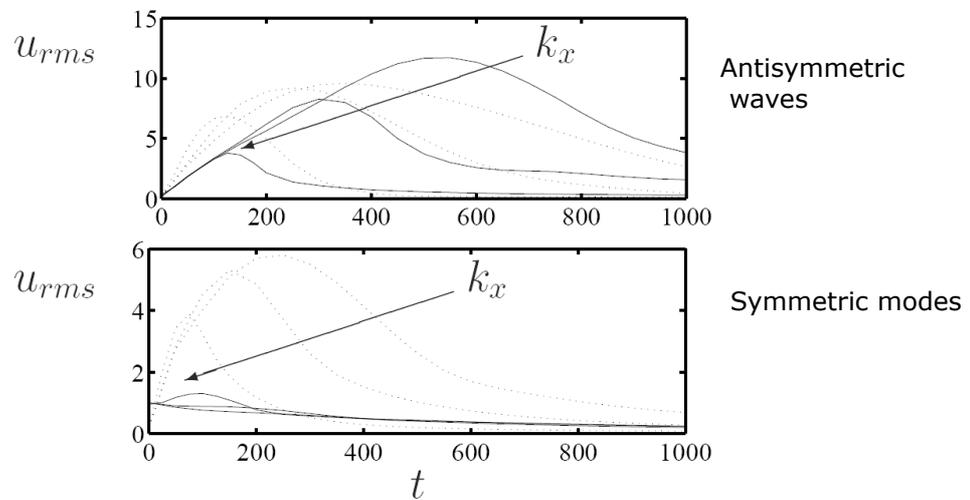
$\alpha = 0.01, 0.1, 0.2, \dots, 0.6$

(a),(b),(c),(d): Amplitudes:  $A=0.14, 0.2, 0.25, 0.29$ .



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# Response to stochastic initial conditions



Stochastic noise in the free stream  $u_{rms}$ : —  
Maximum possible growth  $1/5\sqrt{E/E_0}$ : ····

Høeffner & Brandt (**Phys Fluid**, 2008)



# Stochastic forcing

# Stochastic forcing

Steady-state Lyapunov equation:  $0 = \mathcal{A}P + P\mathcal{A}^H + M$



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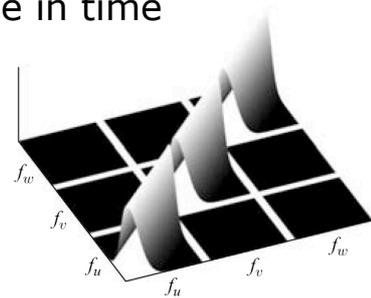
- Uncorrelated white noise  $M = \langle f f^H \rangle = \mathbf{I}$

Farrel & Ioannou, Jovanovic & Bamieh

- Spatially correlated white noise in time

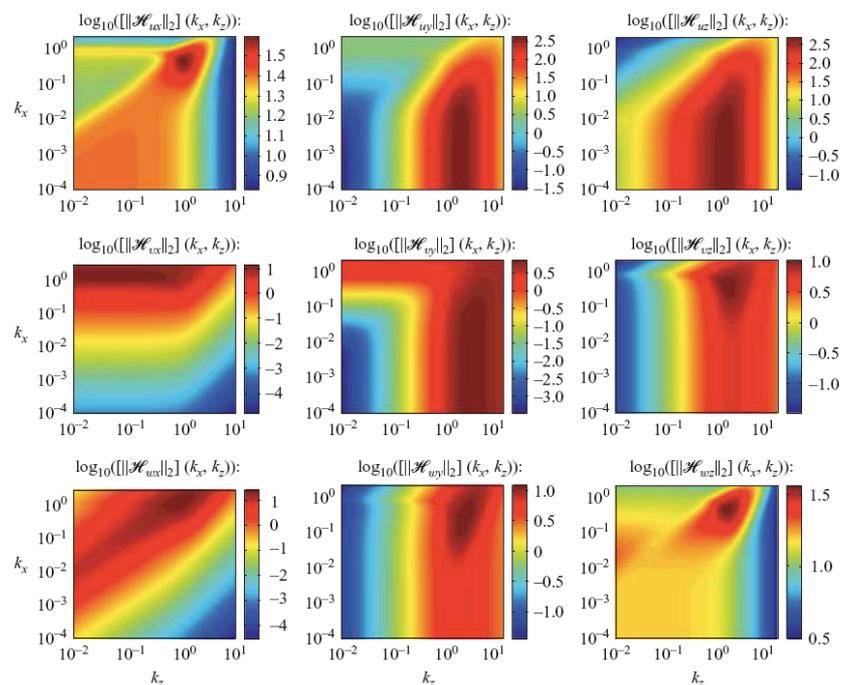
Hoepffner et al, Chevalier et al

- Colored noise



# Stochastic uncorrelated forcing

Component-wise analysis (Jovanovic & Bamieh 2005)



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# Stochastic forcing

Steady-state Lyapunov equation:  $0 = \mathcal{A}P + P\mathcal{A}^H + M$



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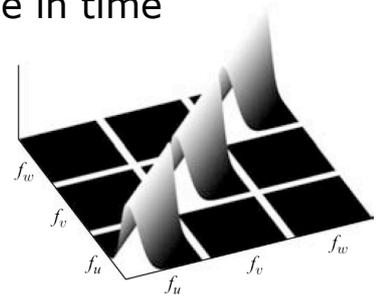
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# Stochastic time-correlated noise

Lyapunov equation assumes white noise



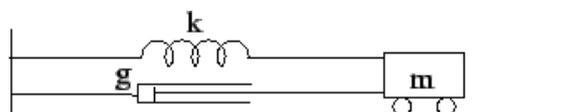
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$$\begin{pmatrix} \dot{q} \\ \dot{w} \end{pmatrix} = \begin{pmatrix} \mathcal{A} & f \\ 0 & F \end{pmatrix} \begin{pmatrix} q \\ w \end{pmatrix} + \begin{pmatrix} 0 \\ \mathbf{I} \end{pmatrix} u(t)$$

Time-correlated noise obtained by augmented system

$F$  filter for white noise: determines the forcing features

*2 x 2 system with complex conjugate eigenvalues*

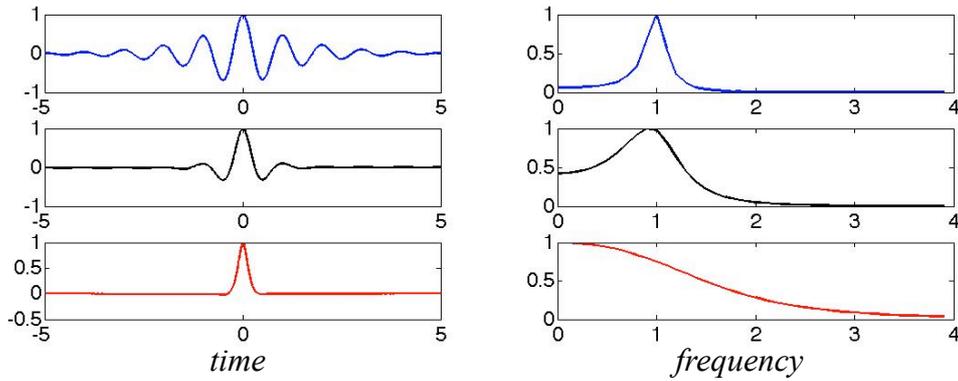


# Noise coloring

Two DOF filter:

dominant frequency  
peak dominance

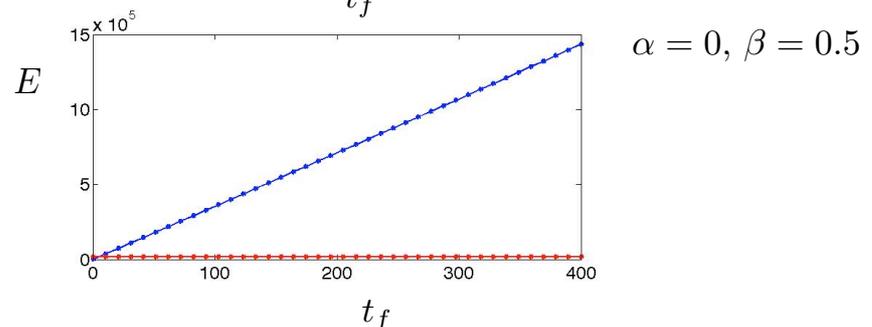
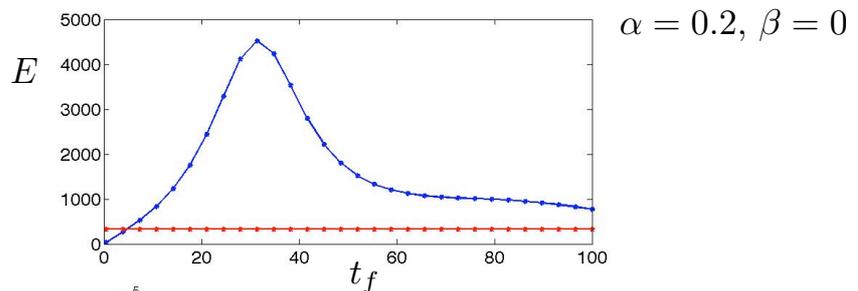
$f=1$   
 $d=6, 2, 0.5$



*More complicated model designed in similar way*

# Energy of flow response

- Comparison with uncorrelated forcing, parallel Blasius at  $Re=500$



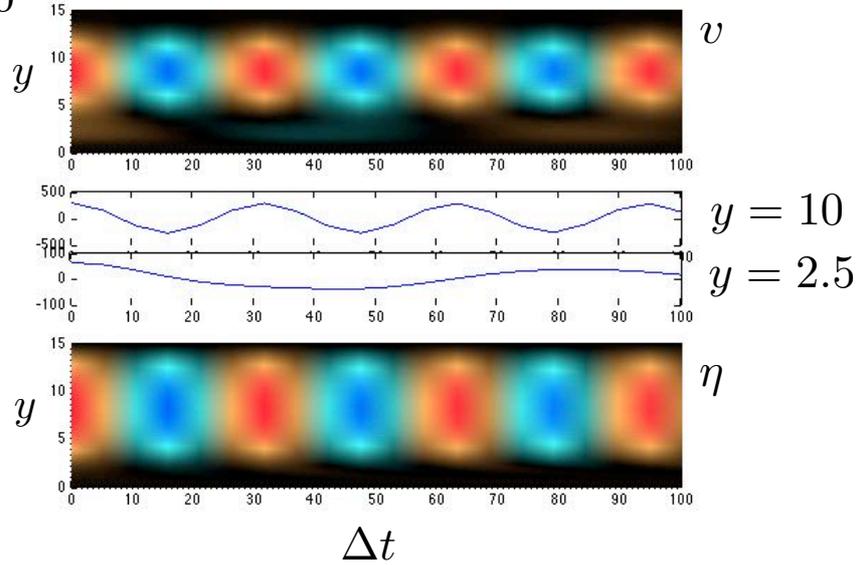
*Spatial- and time-correlated noise:  $\gamma_f=3, \gamma_d=5, t_d=2*t_f$*

## Correlation of flow response

- Two-time correlation from correlated forcing, parallel Blasius at  $Re=500$

$$\alpha = 0.2, \beta = 0$$

$$t_d = 30$$



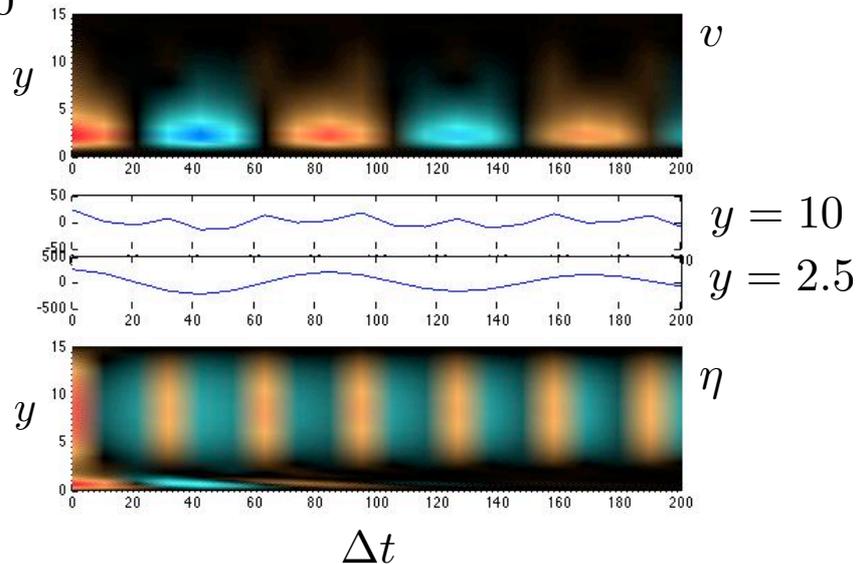
Spatial- and time-correlated noise:  $y_f=3, y_d=5, t_d=30, t_d=2*t_f$

## Correlation of flow response

- Two-time correlation from correlated forcing, parallel Blasius at  $Re=500$

$$\alpha = 0.2, \beta = 0$$

$$t_d = 80$$



Spatial- and time-correlated noise:  $y_f=3, y_d=5, t_d=80, t_d=2*t_f$

## Correlation of flow response

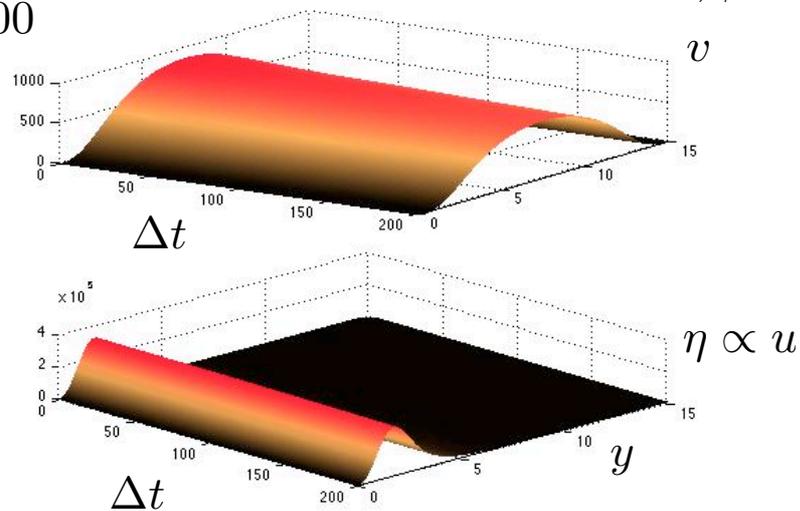
- Two-time correlation from correlated forcing, parallel Blasius at  $Re=500$

$$\alpha = 0, \beta = 0.5$$

$$t_d = 100$$



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*Spatial- and time-correlated noise:  $y_f=3, y_d=5, t_d=100, t_d=2*t_f$*

## Conclusions

- Introduction & Background
  - Relevance of the receptivity problem
- Stochastic initial condition
  - Bypass transition: ability of free-stream to trigger streak breakdown
  - Sinuous modes most receptive
- Stochastic forcing
  - Time-correlated noise
  - Different time and length scales excited
- Parameter study



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# FLOW Graduate School

- **Summer school on FLOW Control, June 29-July 3 2008**  
(week after IUTAM Symposium Laminar-Turbulent Transition)



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**Optimal control, Feedback Control, Model Reduction,  
Numerical Methods, Applications**

Invited lecturers:

Clancy Rowley, Peter Schmid, Bernd Noack