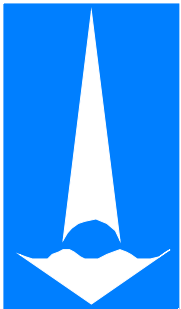


***Generation of  
Multiple Turbulent Flow States  
for the Simulations With  
Ensemble Averaging***



***B. Krasnopolsky***

***[krasnopolsky@imec.msu.ru](mailto:krasnopolsky@imec.msu.ru)***

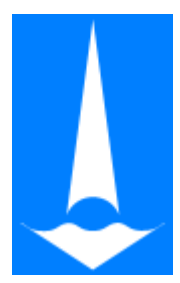
***Institute of Mechanics,  
Lomonosov Moscow State University***



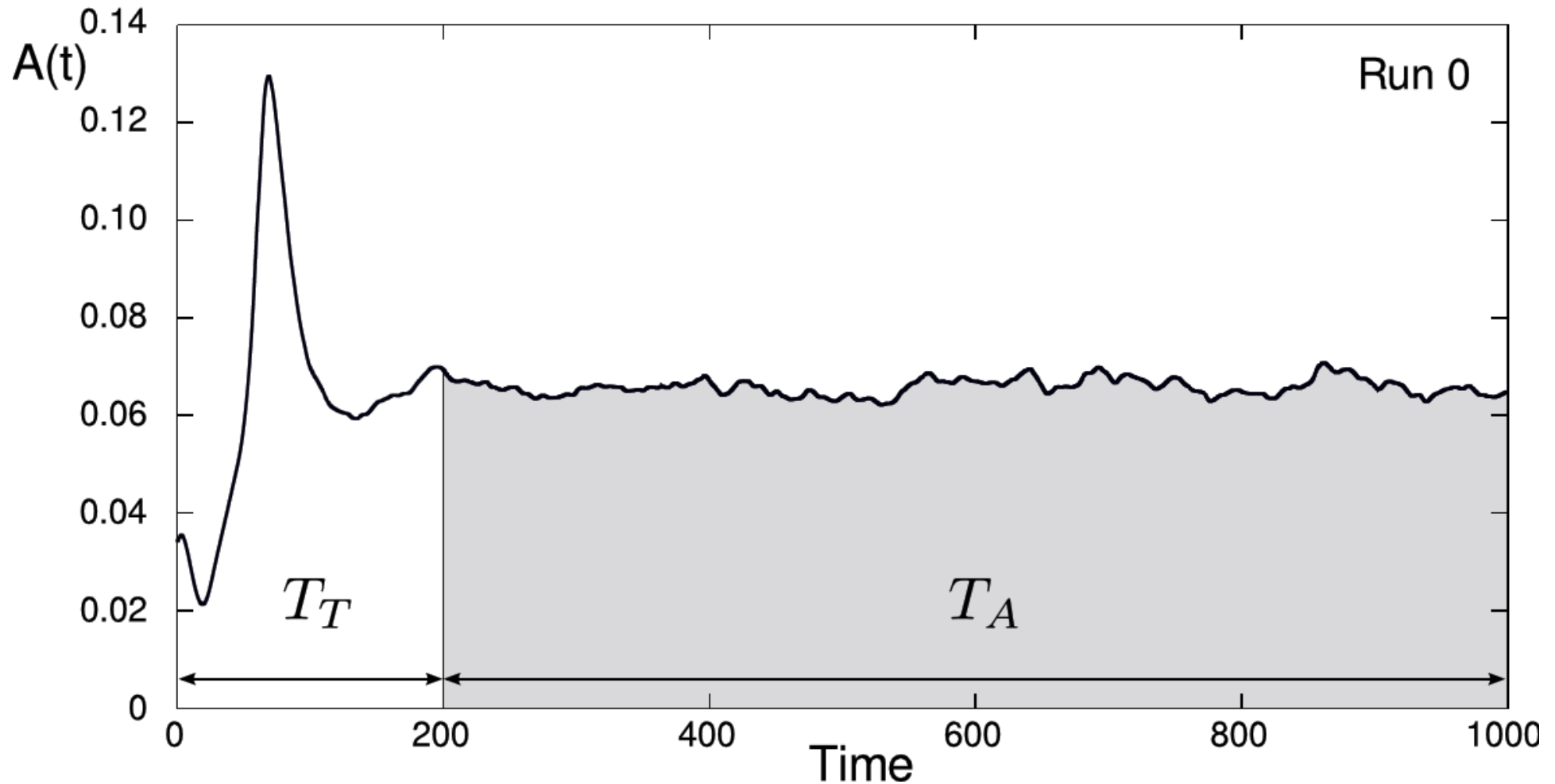
# Motivation

***High-fidelity turbulent flow simulations assumes:***

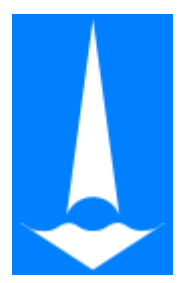
- ***Eddy-resolving methods (DNS / LES / DES)***
- ***Huge computational grids ( $10^6$ - $10^{10}$ -...)***
- ***Long time integration to collect turbulent statistics ( $10^4$ -... time steps)***



# Typical DNS / LES simulation

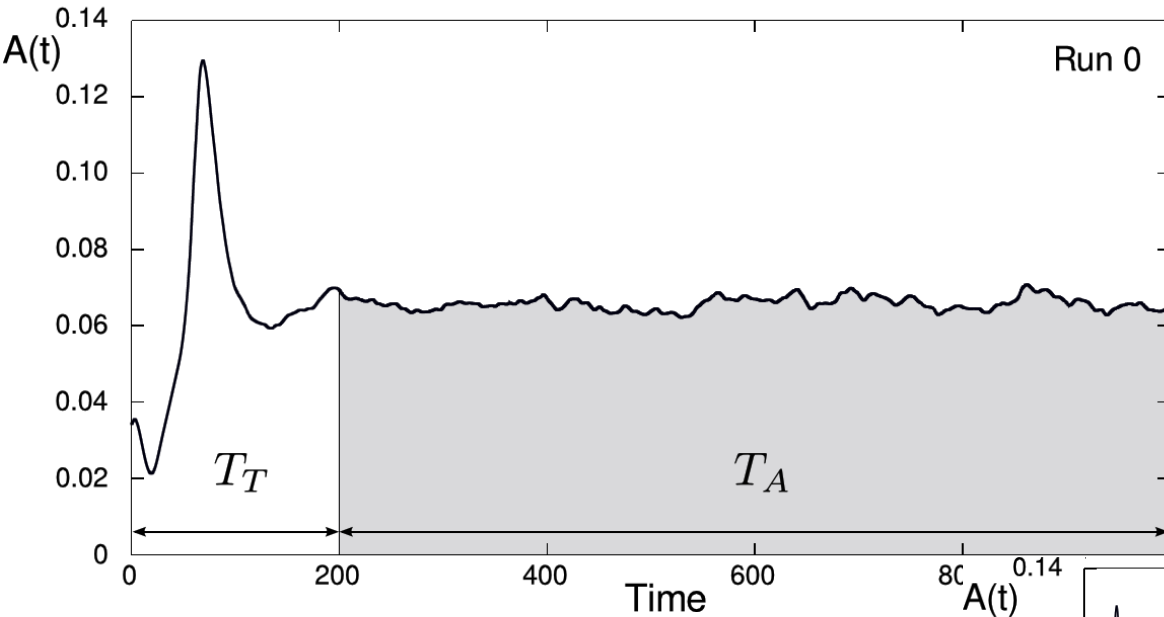


**Overall simulation:**  $T = T_T + T_A$



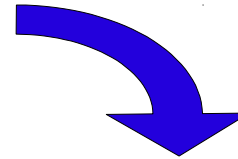
# Parallelization in time

## Simulation with two different initial states



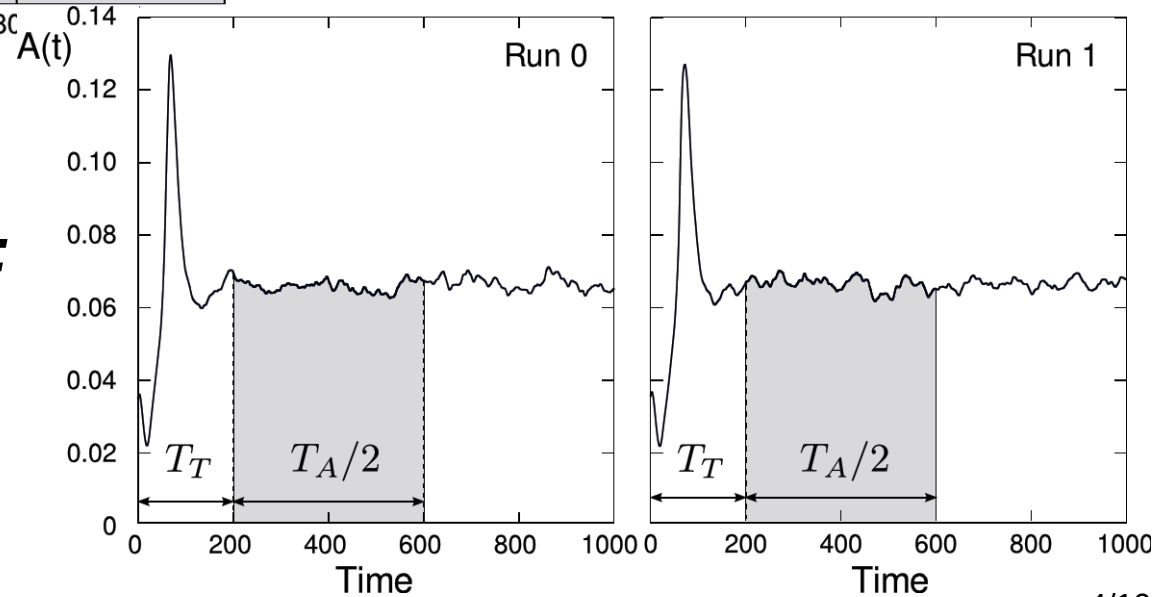
**Overall time:**

$$T_{total} = 2T_T + T_A$$



**Simulation time per each run:**

$$T_1 = T_T + T_A/2$$



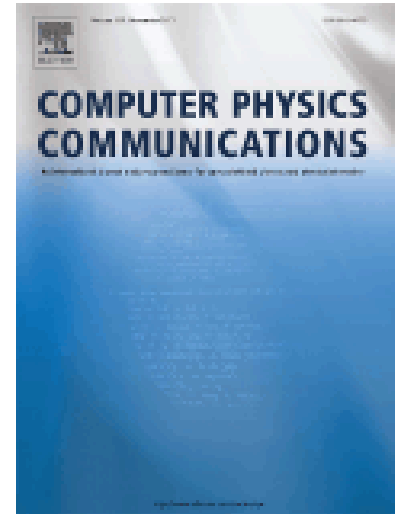


# ***Ensemble averaging (1)***

*V. Makarashvili, E. Merzari, A. Obabko, A. Siegel, P. Fischer.*  
**A performance analysis of ensemble averaging for high fidelity turbulence simulations at the strong scaling limit //**  
*Computer Physics Communications*, vol. 219, 2017, p. 236-245

- ***m** independent runs*

- *Speedup due to increase of computational resources*





# *Time integration (1)*

***Typical methods for modelling incompressible turbulent flows with eddy-resolving models:***

- ***High-order Runge-Kutta time integration schemes (one of substeps):***

$$\frac{\mathbf{u}^* - \mathbf{u}^n}{\Delta t} = - (\mathbf{u}^n \cdot \nabla) \mathbf{u}^n + \frac{1}{Re} \nabla^2 \mathbf{u}^n$$

$$\mathbf{u}^{n+1} = \mathbf{u}^* - \Delta t \nabla p^{n+1}$$

$$\nabla^2 p^{n+1} = \frac{1}{\Delta t} \nabla \cdot \mathbf{u}^*$$

- ***Krylov subspace & Multigrid methods for solving pressure Poisson equations***



## *Time integration (2)*

***Typical methods for modelling incompressible turbulent flows with eddy-resolving models:***

- ***High-order Runge-Kutta time integration schemes (one of substeps):***

$$\frac{\mathbf{U}^* - \mathbf{U}^n}{\Delta t} = - (\mathbf{U}^n \cdot \nabla) \mathbf{U}^n + \frac{1}{Re} \nabla^2 \mathbf{U}^n$$

$$\mathbf{U}^{n+1} = \mathbf{U}^* - \Delta t \nabla P^{n+1}$$

$$\nabla^2 P^{n+1} = \frac{1}{\Delta t} \nabla \cdot \mathbf{U}^*$$

- ***«Generalized» velocity & pressure:***

$$\mathbf{U} = \{\mathbf{u}_1, \mathbf{u}_2, \dots, \mathbf{u}_m\} \quad P = \{p_1, p_2, \dots, p_m\}$$

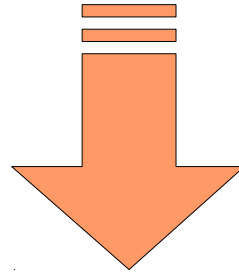
- ***Pressure Poisson equation with multiple right-hand sides***



# ***PPE with multiple RHSs***

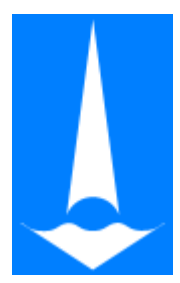
## ***Basic aspects for Krylov subspace & Multigrid methods:***

- ***Sparse matrix storage formats (e.g., CSR)***
- ***Operations with vectors (linear operations, scalar products)***
  - ◆ *memory bound (e.g., STREAM benchmark)*
- ***Sparse Matrix-Vector multiplications (SpMV)***
  - ◆ *memory bound*



- ***Generalized SpMV with multiple RHSs allows to significantly increase the performance due to increase of the computational intensity (flop per byte ratio)***

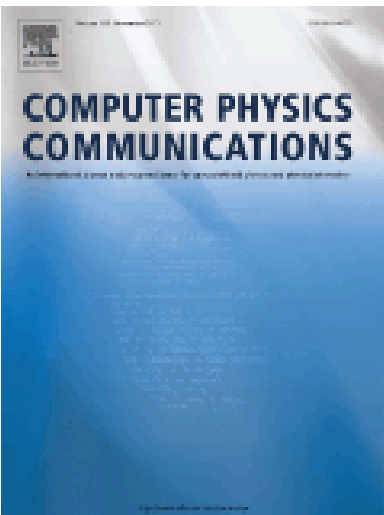
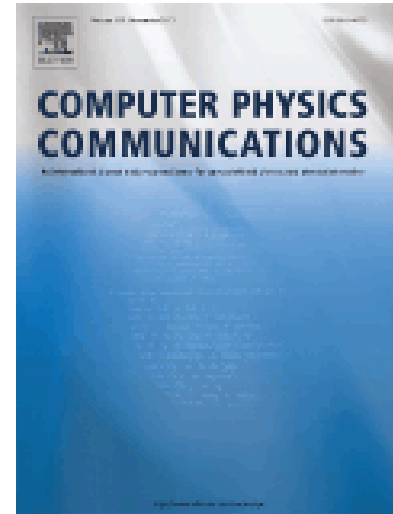




## ***Ensemble averaging (2)***

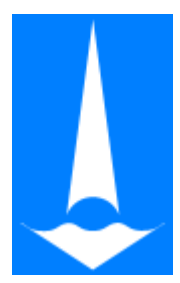
*V. Makarashvili, E. Merzari, A. Obabko, A. Siegel, P. Fischer.*  
**A performance analysis of ensemble averaging for high fidelity turbulence simulations at the strong scaling limit //**  
*Computer Physics Communications*, vol. 219, 2017, p. 236-245

- *$m$  independent runs*
- *Speedup due to increase of computational resources*



*B. Krasnopolsky.* **An approach for accelerating incompressible turbulent flow simulations based on simultaneous modelling of multiple ensembles //** *Computer Physics Communications*, vol. 229, 2018, p. 8-19

- *Simultaneous modelling of  $m$  states in a single run*
- *Speedup due to memory traffic reduction when solving pressure Poisson equation*

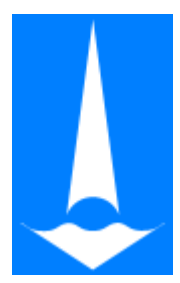


# *Simulation speedup theoretical estimates (1)*

$$P_m = \frac{1 + \beta}{m + \beta} \frac{5m}{5m - 3\theta(m - 1)}$$

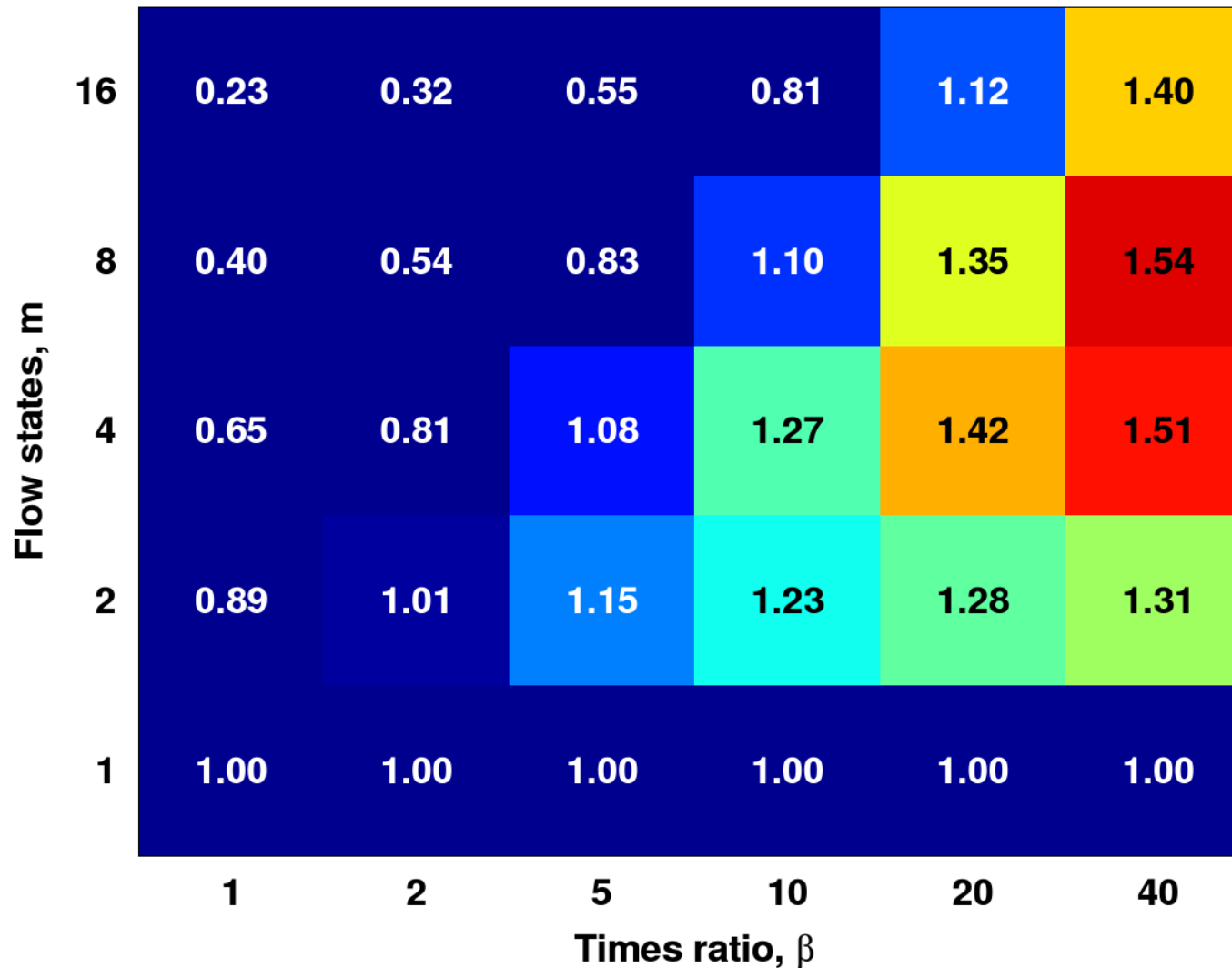
**Three parameters:**

|                   |  |
|-------------------|--|
| $\beta = T_A/T_T$ | <b><i>Time intervals ratio; determined by the problem statement</i></b>                      |
| $\theta$          | <b><i>SLAE solver time ratio; determined by the choice of the numerical methods used</i></b> |
| $m$               | <b><i>Number of simultaneously modelled flow states</i></b>                                  |



# *Simulation speedup theoretical estimates (2)*

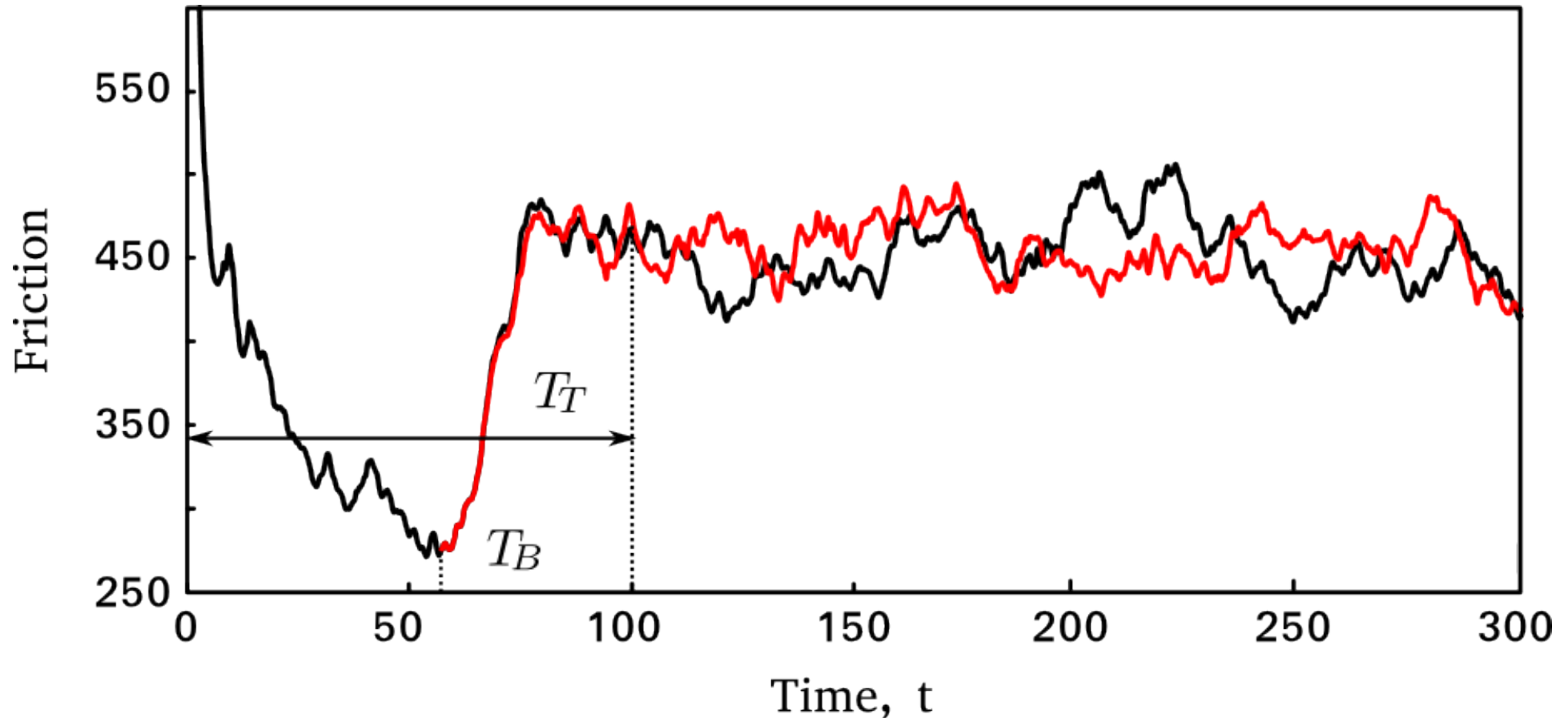
*Simulation speedup as a function of a number of flow states:*



$$\theta = 0.85$$



# Generation of multiple flow states

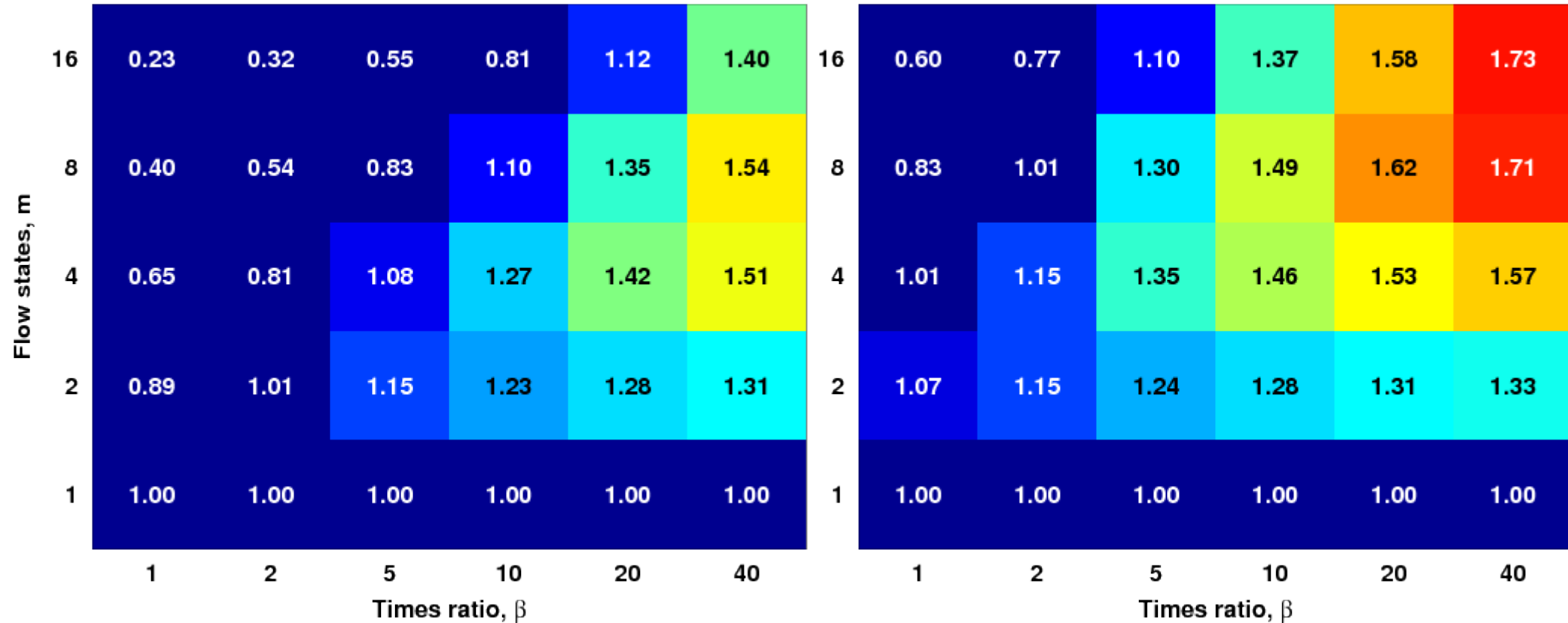


**Introducing perturbations at the transition stage ( $T_B$ ):**

$$T_T - T_B \gtrsim T_{corr}$$



# *Influence on the simulation speedup*



$$T_B = 0$$

$$T_B/T_T = 0.75$$

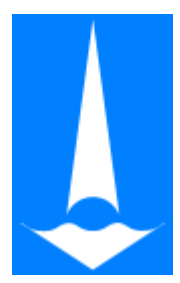


# Computational codes

## **Software:**

- **Linear solver for SLAEs with multiple RHSs: BiCGStab + Algebraic Multigrid (hybrid MPI + Posix Shared Memory programming model)**
- **In-house code for Direct Numerical Simulation of turbulent flows, allowing simultaneous modelling of multiple flow states\***

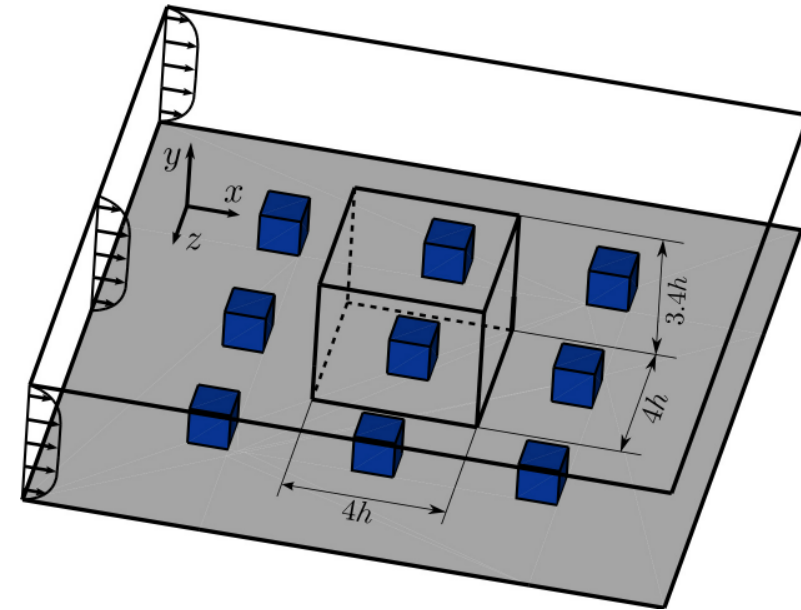
\* N. Nikitin. Finite-difference method for incompressible Navier-Stokes equations in arbitrary orthogonal curvilinear coordinates // JCP, 217(2), 759-781, 2006.



# Test problem

## Flow in a channel with a matrix of wall-mounted cubes:

- No-slip bc at the channel and cube walls
- Periodic bc at lateral faces
- Reynolds number:  $Re_b = \frac{U_b h}{\nu} = 3854$
- Integration intervals:  $T_T = 100$ ;  $T_A = 2000$



|              | Grid 1             | Grid 2             | Grid 3             |
|--------------|--------------------|--------------------|--------------------|
| Grid size    | 144 x 112 x 144    | 240 x 168 x 240    | 360 x 252 x 360    |
| Cube         | 52 x 38 x 52       | 100 x 74 x 100     | 150 x 120 x 150    |
| $h_x, h_z$   | $0.0065h - 0.054h$ | $0.0031h - 0.038h$ | $0.0024h - 0.023h$ |
| $h_y$        | $0.0054h - 0.07h$  | $0.003h - 0.044h$  | $0.0023h - 0.03h$  |
| Overall size | 2.32 M             | 9.68 M             | 32.7 M             |



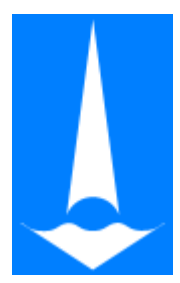
# Simulation results

**Test case: Grid 1, 2.32 M cells**

■ **32 nodes, “Lomonosov-2” (448 cores)**

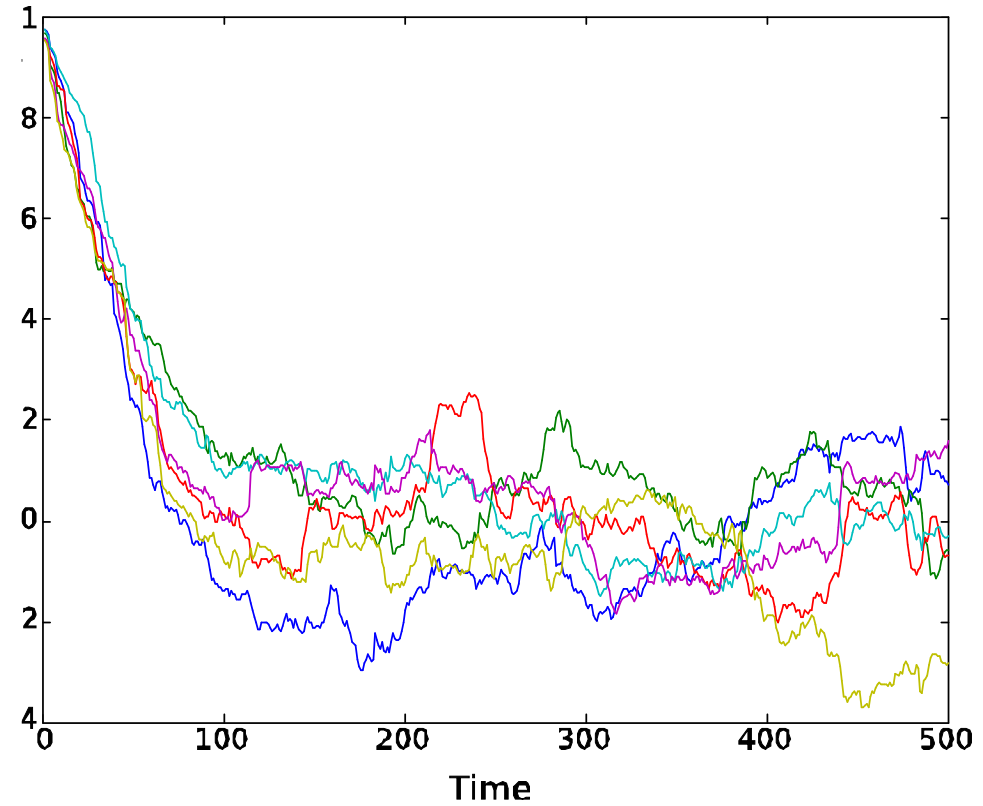
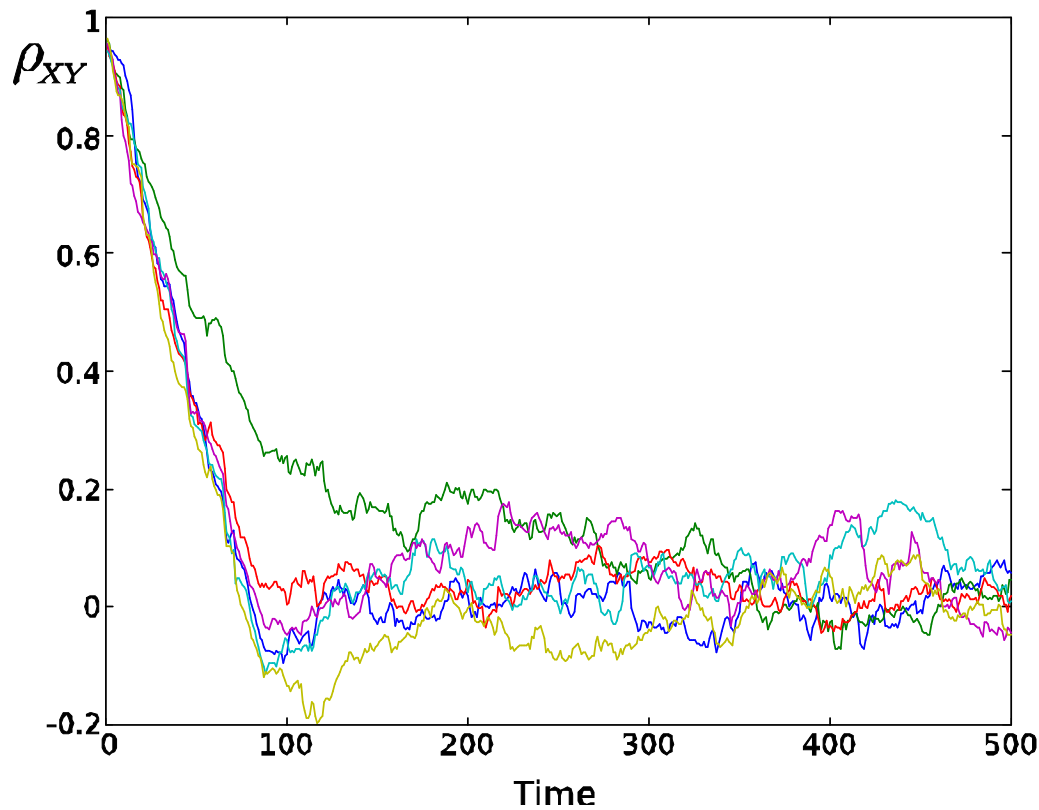
| Flow states, m | $T_B / T_T$ | CPU time, min | Expected speedup | Actual speedup |
|----------------|-------------|---------------|------------------|----------------|
| 1              | -           | 1088          | -                | -              |
| 4              | 0           | 790           | 1.42             | 1.38           |
| 4              | 0.77        | 729           | 1.53             | 1.49           |
| 8              | 0.77        | 695           | 1.63             | 1.57           |





# *Cross-correlation for different flow states*

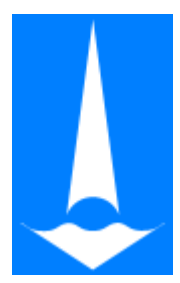
*Cross-correlation of the time series for the longitudinal velocity components of 4 flow states*





# Conclusion

- *The methodology of generation multiple uncorrelated turbulent flow states based on introducing perturbations during the transition stage has been investigated*
- *The performance gain theoretical estimate has been extended to cover the simulation scenario of interest*
- *Actual simulation speedup agrees with the proposed estimates*
- *The proposed methodology:*
  - ◆ *Extends the range of applicability for the ensemble averaging approach*
  - ◆ *Provides additional 20% simulation speedup*



# *List of publications*

- ***B. Krasnopolsky. An approach for accelerating incompressible turbulent flow simulations based on simultaneous modelling of multiple ensembles // Computer Physics Communications, v. 229, 2018, p. 8–19.***
- ***B. Krasnopolsky. Optimal strategy for modelling turbulent flows with ensemble averaging on high performance computing systems // Lobachevskii Journal of Mathematics. v. 39 (4), 2018, p. 533–542.***
- ***B. Krasnopolsky. Generation of multiple turbulent flow states for the simulations with ensemble averaging // Supercomputing Frontiers and Innovations, v. 5 (2), 2018, p. 55–62.***