

# PDF Equations in Turbulent Rayleigh–Bénard Convection

## Introduction



- › Rayleigh–Bénard convection is the buoyancy-driven flow of a fluid enclosed between two horizontal plates.
- › We investigate statistical properties of the fluctuating temperature field in the turbulent regime, i. e. at high Rayleigh number.
- › For this, we derive evolution equations determining the probability density function (PDF) of temperature from first principles.
- › Direct numerical simulation (DNS) of the basic equations governing the flow is used to obtain the statistical quantities.
- › The statistical framework allows to identify how heat is transported in different regions of the convection cell and shows the appearance of a limit cycle.
- › Analysis is performed for RB convection in periodic horizontal boundaries (2nd column) and in a cylindrical vessel (3rd column).

## Governing Equations

- › The nondimensionalized equations governing the Rayleigh–Bénard system in Oberbeck–Boussinesq approximation read

$$\frac{\partial}{\partial t} \mathbf{u} + \mathbf{u} \cdot \nabla \mathbf{u} = -\nabla p + \text{Pr} \Delta \mathbf{u} + \text{Pr} \text{Ra} T \mathbf{e}_z, \quad \nabla \cdot \mathbf{u} = 0$$

$$\frac{\partial}{\partial t} T + \mathbf{u} \cdot \nabla T = \Delta T$$
(1)

with the velocity field  $\mathbf{u}(\mathbf{x}, t)$ , the temperature field  $T(\mathbf{x}, t)$  and the pressure field  $p(\mathbf{x}, t)$ .

- › The nondimensional control parameters are the Rayleigh number  $\text{Ra}$ , the Prandtl number  $\text{Pr}$  and the aspect ratio  $\Gamma$

$$\text{Ra} = \frac{\alpha g \delta T h^3}{\nu \kappa}, \quad \text{Pr} = \nu / \kappa, \quad \Gamma = d/h$$

with thermal expansion coefficient  $\alpha$ , gravitational acceleration  $g$ , outer temperature difference  $\delta T$ , vertical distance of top and bottom plate  $h$ , diameter of cylindrical cell  $d$ , kinematic viscosity  $\nu$  and heat conductivity  $\kappa$ .

## Deriving Evolution Equations for PDFs

- › Within the framework of PDF equations, we derive evolution equations for PDFs from first principles, i. e. from the basic RB equations (1).
- › Following the steps suggested in [1, 2, 3], we define the temperature PDF as an ensemble average over all possible realizations of the temperature field  $T(\mathbf{x}, t)$ :

$$f(T, \mathbf{x}, t) = \langle \delta(T - T(\mathbf{x}, t)) \rangle$$
(2)

- › Calculating spatial and temporal derivatives of the PDF and plugging in the **basic RB equations** (1) leads to an evolution equation for the temperature PDF  $f = f(T, \mathbf{x}, t)$ :

$$\frac{\partial}{\partial t} f + \nabla \cdot (\langle \mathbf{u} | T, \mathbf{x}, t \rangle f) = -\frac{\partial}{\partial T} \left( \left\langle \frac{\partial}{\partial t} T + \mathbf{u} \cdot \nabla T \middle| T, \mathbf{x}, t \right\rangle f \right)$$

$$= -\frac{\partial}{\partial T} \left( \langle \Delta T | T, \mathbf{x}, t \rangle f \right)$$
(3)

Here, unclosed terms have been expressed as conditional averages, denoted as  $\langle \cdot | T, \mathbf{x}, t \rangle$ , which are later estimated from DNS.

- › To solve the above first order PDE (3), the Method of Characteristics is used to obtain most probable evolution of a fluid parcel in phase space, described by trajectories through phase space (the so-called characteristics); the characteristics follow the vectorfield of the conditional averages, i. e. are solutions  $\begin{pmatrix} T(t) \\ \mathbf{x}(t) \end{pmatrix}$  to

$$\begin{pmatrix} \dot{T} \\ \dot{\mathbf{x}} \end{pmatrix} = \begin{pmatrix} \langle \Delta T | T, \mathbf{x}, t \rangle \\ \langle \mathbf{u} | T, \mathbf{x}, t \rangle \end{pmatrix}$$
(4)

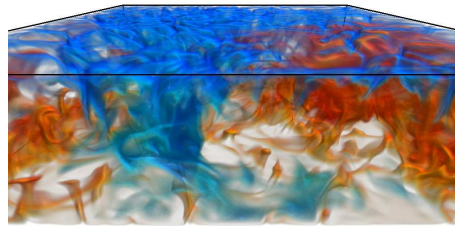
- › This framework is applied to different RB systems with different geometries and different symmetries that allow for simplifications:

- › Stationary convection with periodic horizontal boundaries: No dependence of statistics on horizontal coordinates or time (2nd column)
  - › Stationary convection in cylindrical vessel: No dependence of statistics on azimuthal coordinate or time (3rd column)
- In the following, these two systems will be handled individually.

## References

- [1] J. Lüff, M. Wilczek, and R. Friedrich. *New Journal of Physics*, 13(1):015002, 2011
- [2] J. Lüff. *Diploma thesis, Westfälische Wilhelms-Universität Münster*, 2011
- [3] R. Friedrich, A. Daitche, O. Kamps, J. Lüff, M. Voßkuhle, and M. Wilczek. *Comptes Rendus Physique*, 13(9–10):929, 2012
- [4] Vapor home page. <http://www.vapor.ucar.edu/>
- [5] Visit home page. <https://wci.llnl.gov/codes/visit/>
- [6] R. Verzicco and R. Camussi. *Journal of Fluid Mechanics*, 477:19–49, 2003

## Periodic Horizontal Boundaries (2D Phase Space)



- › Volume rendering of a snapshot of the temperature field, done with *Vapor* [4]
- › Homogenous in horizontal direction
- › No-slip bottom and top plates  $\mathbf{u} = \mathbf{0}$
- › Parameters:  $\text{Ra} = 2 \cdot 10^7$ ,  $\text{Pr} = 1$ ,  $\Gamma = 4$
- › Numerics: Pseudospectral and volume penalization methods [2]
- › For a video of the flow, scan this QR code:



## Symmetries and Evolution Equation (2D)

- › Statistical quantities can not depend on horizontal coordinates or time but only on  $T$  and  $z \Rightarrow$  phase space becomes 2D
- › Evolution equation (3) simplifies to

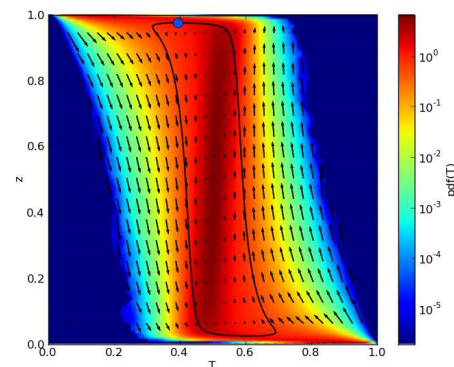
$$\frac{\partial}{\partial z} \left( \langle u_z | T, z \rangle f \right) = -\frac{\partial}{\partial T} \left( \langle \Delta T | T, z \rangle f \right)$$
(5)

- › Characteristics, i. e. solutions  $\begin{pmatrix} T(t) \\ z(t) \end{pmatrix}$ , follow the vector field defined by the conditional averages:

$$\begin{pmatrix} \dot{T} \\ \dot{z} \end{pmatrix} = \begin{pmatrix} \langle \Delta T | T, z \rangle \\ \langle u_z | T, z \rangle \end{pmatrix}$$
(6)

## Characteristic Curves and Limit Cycle (2D)

- › Conditional averages are estimates from snapshots of numerical simulation
- › Integrating (6) for arbitrary initial conditions: All characteristics converge towards limit cycle!



- › Horizontal axis: temperature coordinate  $T$ , vertical axis: vertical coordinate  $z$
- › Background color: PDF of temperature
- › Black arrows: vector field
- › Black curve: limit cycle
- › For a video of a fluid parcel traveling along the limit cycle, scan this QR code:



## Features of Limit Cycle (2D)

- › Main movement through phase space in horizontal direction near the boundary layers, i. e. cold fluid heating near the bottom plate and hot fluid cooling near the top plate
- › Main movement through phase space in vertical direction in the bulk, i. e. hot fluid moving up and cold fluid moving down
- › Additionally, slight horizontal movement in the bulk, i. e. hot fluid beginning to cool while moving down and vice versa

- ⇒ Typical Rayleigh–Bénard cycle of hot fluid moving up, cooling down at the top plate, falling down and heating up again at the bottom plate

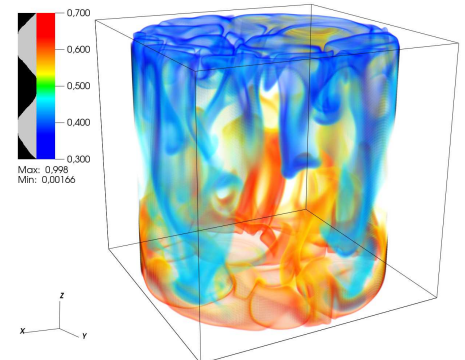
## Acknowledgements



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## Cylindrical Vessel (3D Phase Space)



- › Volume rendering of a snapshot of the temperature field, done with *Visit* [5]
- › Insulating sidewalls, all surfaces no-slip  $\mathbf{u} = \mathbf{0}$
- › System described in cylindrical coordinates,  $\mathbf{x} = (r, \varphi, z)$
- › Parameters:  $\text{Ra} = 2 \cdot 10^8$ ,  $\text{Pr} = 1$ ,  $\Gamma = 1$
- › Numerics: Finite differences on a staggered cylindrical grid w/ grid-point clustering [6]

## Symmetries and Evolution Equation (3D)

- › Statistical quantities can not depend on azimuthal coordinate  $\varphi$  or time but only on  $T$ ,  $r$  and  $z \Rightarrow$  phase space becomes 3D
- › Evolution equation (3) simplifies to

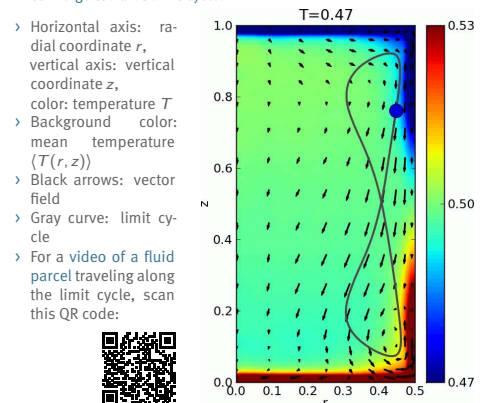
$$\frac{1}{r} \frac{\partial}{\partial r} \left( r \langle u_r | T, r, z \rangle f \right) + \frac{\partial}{\partial z} \left( \langle u_z | T, r, z \rangle f \right) = -\frac{\partial}{\partial T} \left( \langle \Delta T | T, r, z \rangle f \right)$$
(7)

- › Characteristics follow vector field defined by conditional averages:

$$\begin{pmatrix} \dot{T} \\ \dot{r} \\ \dot{z} \end{pmatrix} = \begin{pmatrix} \langle \Delta T | T, r, z \rangle \\ \langle u_r | T, r, z \rangle \\ \langle u_z | T, r, z \rangle \end{pmatrix}$$
(8)

## Characteristic Curves and Limit Cycle (3D)

- › Integrating (8) for arbitrary initial conditions: All characteristics converge towards limit cycle!



## Features of Limit Cycle (3D)

- › Heating and cooling near the bottom and top plate
- › Vertical and slight inward movement in the bulk
- › Outward movement near the plates
- › Cornerflows

- ⇒ Typical Rayleigh–Bénard cycle of hot fluid moving up, cooling down at the top plate, falling down and heating up again at the bottom plate; additional inward and outward movement

## Conclusions and Future Work

- › We derived an evolution equation for the PDF of temperature from first principles
- › Unclosed terms are expressed via conditional averages, which are estimated from DNS
- › The Method of Characteristics is used to link statistics and dynamics of the system
- › The framework allows to identify a limit cycle, which shows the average transport processes in Rayleigh–Bénard convection in both cases (2D/3D phase space)
- › Outlook: Further investigation of limit cycle