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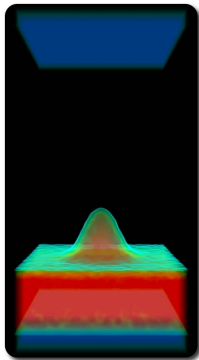
Center for
Nonlinear Science



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theoretische physik

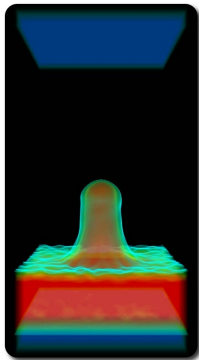
Using PDF Equations to describe Rayleigh–Bénard Convection

Contents



- ▶ Introduction
- ▶ Temperature Statistics and PDF Equations
 - (a) Periodic Boundary Conditions 3D
 - (b) Periodic Boundary Conditions 2D
 - (c) Cylindrical Vessel
- ▶ Summary

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► Introduction

Temperature Statistics and PDF Equations

(a) Periodic Boundary Conditions 2D

(b) Periodic Boundary Conditions 3D

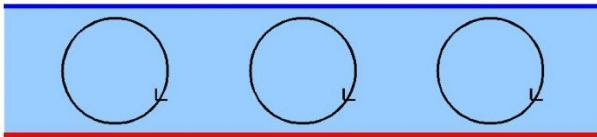
(c) Cylindrical Vessel

Summary

Phenomenon

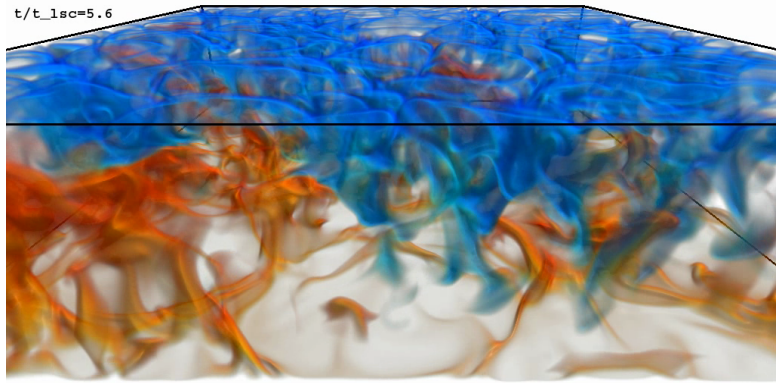
Rayleigh–Bénard Convection:

- ▶ Heated from below, cooled from above
- ▶ Ubiquitous in nature: Atmosphere, oceans, plate tectonics, ...
- ▶ Different patterns, from **stable laminar** to **highly turbulent** flows
- ▶ Turbulent flows **common** in nature and applications, yet **hard to handle analytically**
- ▶ Our focus: **Statistical Description** that connects to the **Dynamics**



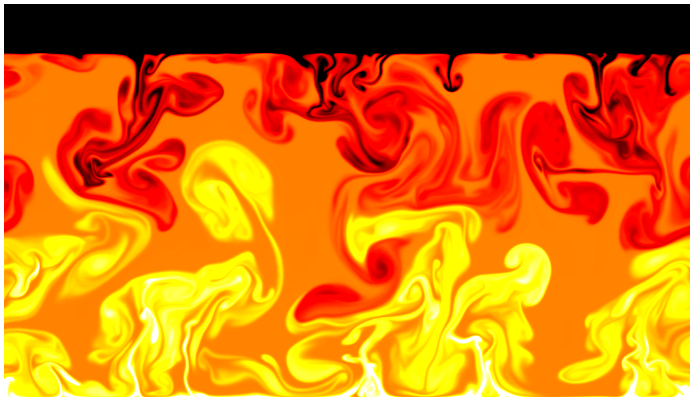
Phenomenon

Turbulent Rayleigh–Bénard Convection



Phenomenon

Turbulent Rayleigh–Bénard Convection



Governing Equations

Oberbeck-Boussinesq Equations in Non-dimensional Form

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

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

Control Parameters

- ▶ Ra – Rayleigh number ($\propto$ temperature difference)
- ▶ Pr – Prandtl number ($= \frac{\text{kinematic viscosity}}{\text{thermal diffusivity}}$, material parameter)
- ▶ Γ – Aspect ratio (geometry parameter)

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Goal: A Statistical Description from First Principles

Laminar convection: Analytical solution of basic equations is possible

Turbulent convection: Analytical solution is (up to now) impossible

But:

- ▶ Analytical solution not necessarily needed
- ▶ Compare ideal gas: We can't predict 10^{23} particles, but we still can predict temperature, pressure, energy, ...

Goal:

- ▶ Achieve statistical description for turbulent Rayleigh–Bénard convection in terms of **probability density function (PDF)** of temperature!

Statistical Description in Terms of Temperature PDF

Deriving an Evolution Equation for Temperature PDF:

- ▶ Define temperature PDF as **ensemble average** $\langle \cdot \rangle$ of δ -distribution: $f(T, \mathbf{x}, t) = \langle \delta(T - T(\mathbf{x}, t)) \rangle$
- ▶ Calculate and put together **derivatives** of PDF
- ▶ Introduce **conditional averages** $\langle \cdot | T, \mathbf{x}, t \rangle$
- ▶ Plug in **Oberbeck-Boussinesq** equations

Evolution Equation for Temperature PDF

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

Method of Characteristics yields average behaviour

Evolution Equation for Temperature PDF

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

- ▶ Apply **Method of Characteristics** to evolution equation of temperature PDF
- ▶ One obtains characteristic curves, i. e. **trajectories** along which the evolution equation transforms from a PDE into an ODE

Method of Characteristics

- ▶ Characteristics follow the **vector field** that is **determined by the conditional averages**:

Vector Field of Characteristics

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

- ▶ Solutions / characteristics $\begin{pmatrix} T(t) \\ \mathbf{x}(t) \end{pmatrix}$ show **average behavior** of a **fluid particle in T - $\mathbf{x}$ -phase space**
- ▶ This general framework is now applied to **3 different RB settings** with different symmetries;
 $\langle \cdot | T, \mathbf{x} \rangle$ are estimated from 3 different DNS

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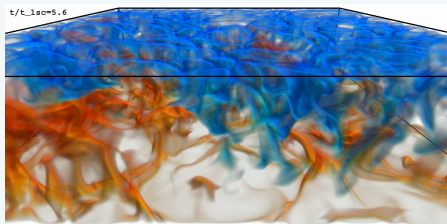
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Summary

Periodic Boundary Conditions 3D

Rayleigh–Bénard System

- ▶ 3D convection, **homogenous** in horizontal direction
- ▶ **No-slip** bottom and top plates $\mathbf{u} = \mathbf{0}$
- ▶ Parameters: $Ra = 2 \cdot 10^7$, $Pr = 1$, $\Gamma = 4$
- ▶ Numerics: Pseudospectral and Volume Penalization



Periodic Boundary Conditions 3D

Symmetries

- ▶ Statistics do not depend on horizontal coordinates:

$$f(T, \mathbf{x}) = f(T, z)$$

$$\langle \cdot | T, \mathbf{x} \rangle = \langle \cdot | T, z \rangle$$

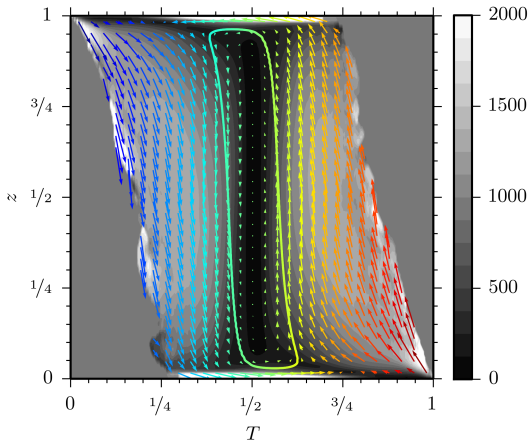
- ▶ Phase space becomes 2D, spanned by T and z
- ▶ Characteristics simplify to:

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

Periodic Boundary Conditions 3D

Integrating characteristics for arb. initial positions: **Convergence towards Limit Cycle!**

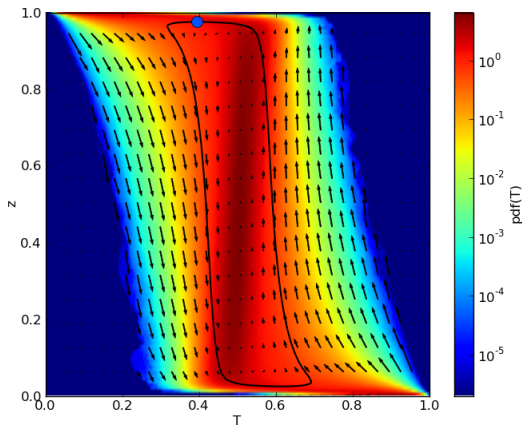
- ▶ Blue→red:
Temperature
- ▶ Arrows:
vector field of
characteristics, i.e.
 $\left(\begin{array}{l} \langle \Delta T | T, z \rangle \\ \langle u_z | T, z \rangle \end{array} \right)$
- ▶ Black→white:
Norm of vector field
(i.e., phase space
speed)



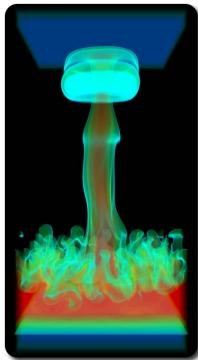
Periodic Boundary Conditions 3D

Integrating characteristics for arb. initial positions: **Convergence towards Limit Cycle!**

- ▶ Color: pdf of T
- ▶ Arrows: Vector field
- ▶ Colored Circle: Solution $\begin{pmatrix} T \\ z \end{pmatrix}$ following limit cycle; Temperature color coded



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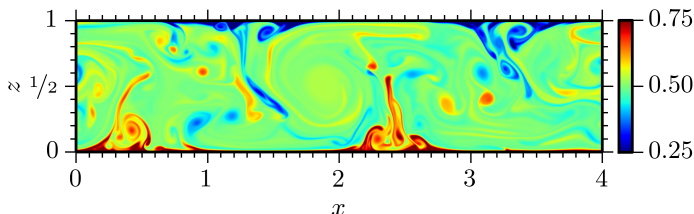
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Periodic Boundary Conditions 2D

RB System

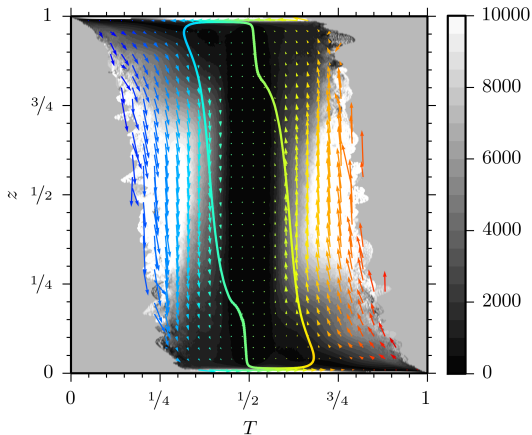
- ▶ 2D convection, **homogenous** in horizontal direction
- ▶ **No-slip** bottom and top plates $\mathbf{u} = \mathbf{0}$
- ▶ Parameters: $Ra = 5 \cdot 10^8$, $Pr = 1$, $\Gamma = 4$
- ▶ Symmetries: Identical to 3D periodic case



Periodic Boundary Conditions 2D

Integrating characteristics for arb. initial positions: **Convergence towards Limit Cycle!**

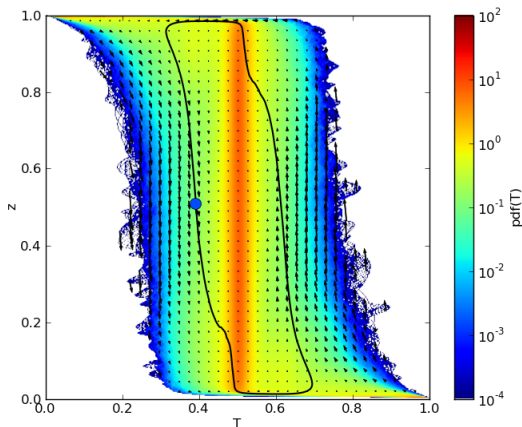
- ▶ Blue→red:
Temperature
- ▶ Arrows:
vector field of
characteristics
- ▶ Black→white:
Norm of vector field
(i.e., phase space
velocity)



Periodic Boundary Conditions 2D

Integrating characteristics for arb. initial positions: **Convergence towards Limit Cycle!**

- ▶ Color: pdf of T
- ▶ Arrows: Vector field
- ▶ Colored Circle: Solution $(\frac{T}{z})$ following limit cycle; Temperature color coded



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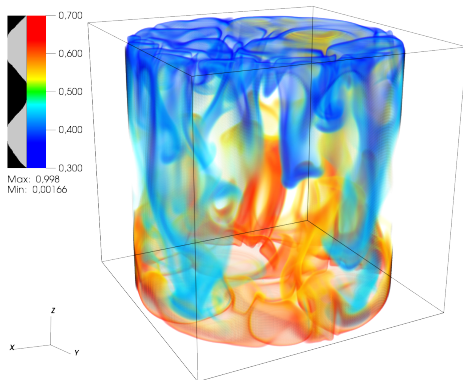


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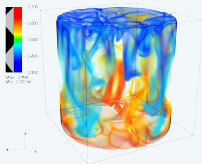
Cylindrical Vessel



- Cylindrical Vessel with **insulating sidewalls**
- Cylindrical coordinates:
 $\mathbf{x} = (r, \varphi, z)$
- All surfaces are **no-slip** $\mathbf{u} = \mathbf{0}$
- Parameters:
 $Ra = 2 \cdot 10^8$, $Pr = 1$,
 $\Gamma = 1$
- Numerics: **Finite differences** w/
gridpoint clustering

Cylindrical Vessel

Symmetries



- Homogeneous in azimuthal (φ -) direction:

$$f(T, \mathbf{x}) = f(T, r, z)$$

$$\langle \cdot | T, \mathbf{x} \rangle = \langle \cdot | T, r, z \rangle$$

Vector field of Characteristics

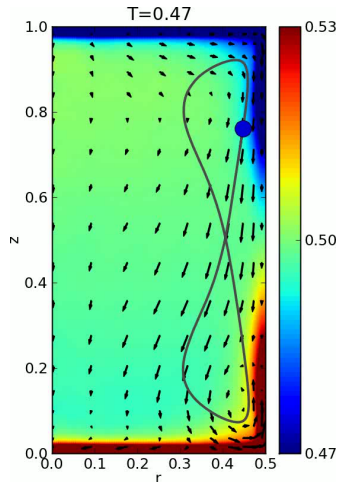
$$\begin{pmatrix} \dot{T} \\ \dot{r} \\ \dot{z} \end{pmatrix} = \begin{pmatrix} \langle \Delta T | T, r, z \rangle \\ \langle u_r | T, r, z \rangle \\ \langle u_z | T, r, z \rangle \end{pmatrix}$$

- Additional phase space dimension (radial movement)

Cylindrical Vessel

Again, Limit Cycle is found!

- ▶ RB Cycle:
 - ▶ Heating up / moving outwards at the bottom
 - ▶ Moving up / inwards in the bulk
 - ▶ Cooling down / moving outwards at the top, ...
- ▶ Cornerflows w/o need for a LSC
- ▶ Limit Cycle lies in outer regions, $0.3 < r < 0.5$, and around the mean temperature, $0.47 < T < 0.53$



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► Summary

Summary

- ▶ 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 for three different cases ($2 \times 2D$ / $1 \times 3D$ phase space)
- ▶ Outlook: Further investigation of limit cycle

Summary

Methods

- ▶ PDF methods, conditionally averaged fields
- ▶ Method of Characteristics

Advantages

- ▶ from first principles
- ▶ description of average temperature-resolved behavior in different parts of cell
- ▶ results intuitive and insightful

Summary

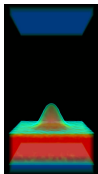
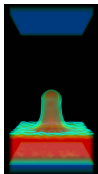
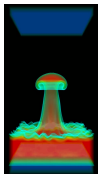
Disadvantages / Problems

- ▶ full information $\mathbf{u}(\mathbf{x})$, $\Delta T(\mathbf{x})$ needed
- ▶ no *direct* description of heat transport, i.e., in terms of $Nu(Ra, Pr)$
- ▶ results could be expected *a priori*?
- ▶ limit cycle?!

Literature

- ▶ PDF Methods in general:
 - > S. B. Pope, AIAA Journal 22, 896 (1984)
 - > S. B. Pope, Turbulent Flows (Cambridge Univ. Press, 2000)
 - > M. Wilczek and R. Friedrich, Phys. Rev. E 80, 016316 (2009)
 - > M. Wilczek, A. Daitche, and R. Friedrich, J. Fluid Mech. 676, 191 (2011)
 - > R. Friedrich et al., Compt. Rend. Phys. 13, 929 (2012)
- ▶ PDF Methods in Rayleigh–Bénard convection:
 - > J. Lülff, M. Wilczek, and R. Friedrich, New J. Phys. 13, 015002 (2011)
 - > J. Lülff, M. Wilczek, R. Stevens, R. Friedrich and D. Lohse (*to be published...*)
- ▶ Volume Penalization:
 - > K. Schneider, Comput. Fluids 34, 1223 (2005)
 - > G. H. Keetels et al., J. Comput. Phys. 227, 919 (2007)

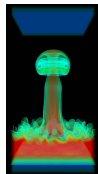
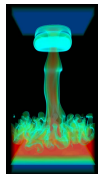
Thank you for your attention!



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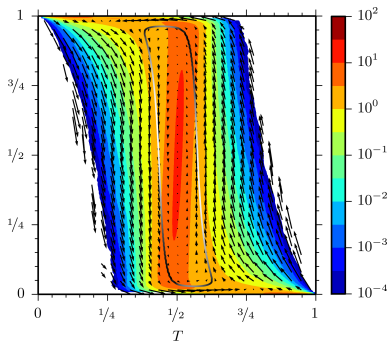
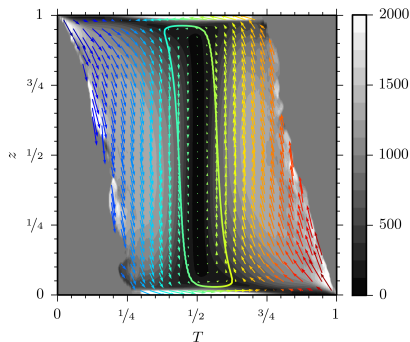
Rudolf Friedrich
† August 2012



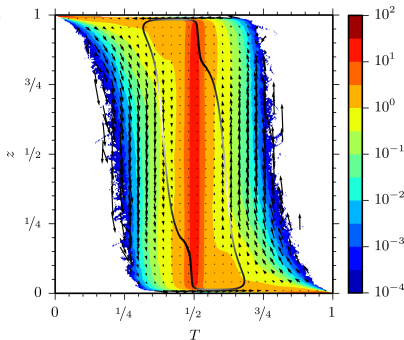
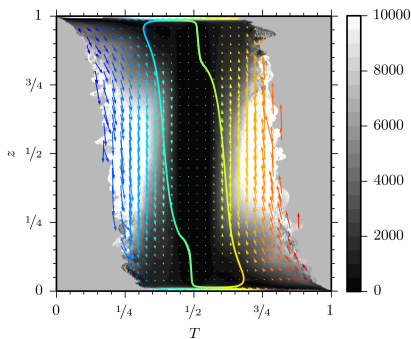


Supplementaries

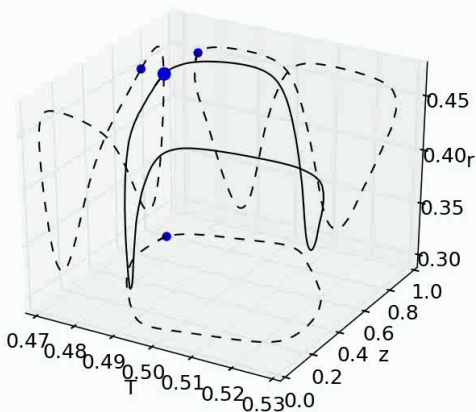
Limit Cycle 3D



Limit Cycle 2D



Limit Cycle Cylinder



Method of Characteristics

- ▶ Along the characteristics, the PDE transforms into an ODE:

ODE along the characteristic curves

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

- ▶ The divergence $d(T, r, z)$ of the vectorfield describes the change of the PDF along a characteristic

Method of Characteristics

The ODE can be integrated along the characteristic curves, giving the following solution:

Integrated ODE along the characteristics

$$f(s) = f(s_0) \exp \left[- \int_{s_0}^s ds \left(\frac{\partial}{\partial T} \langle \Delta T | T, z \rangle + \frac{\partial}{\partial z} \langle u_z | T, z \rangle \right) \right]_{\substack{T=T(s) \\ z=z(s)}}$$

- This relation describes the change of the PDF along a certain trajectory $\begin{pmatrix} T(s) \\ z(s) \end{pmatrix}$ in T, z -phase space, starting at $\begin{pmatrix} T(s_0) \\ z(s_0) \end{pmatrix}$