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Connecting Statistics and Dynamics of Turbulent Rayleigh–Bénard Convection

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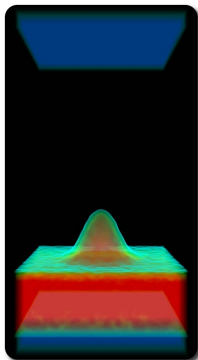
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K. Petschel¹, U. Hansen¹

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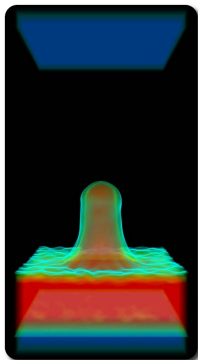
²University of Twente

Contents



- ▶ Introduction
- ▶ Part I: Temperature Statistics and PDF Equations
- ▶ Part II: Flow Reversals
- ▶ Summary and Conclusion

Contents



► Introduction

Part I: Temperature Statistics and PDF Equations

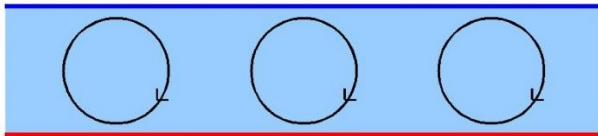
Part II: Flow Reversals

Summary and Conclusion

Phenomenon

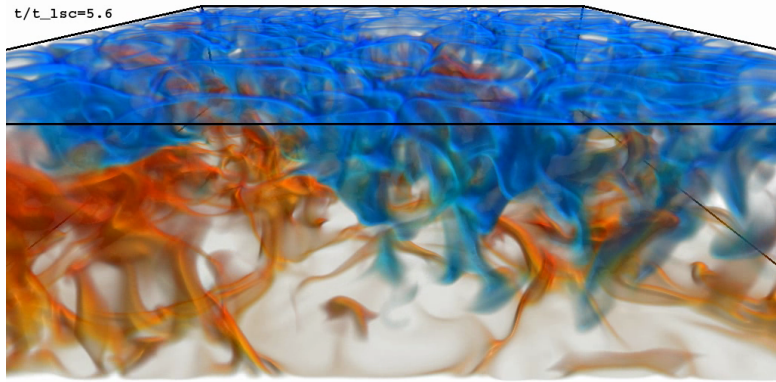
Rayleigh–Bénard Convection:

- ▶ 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**



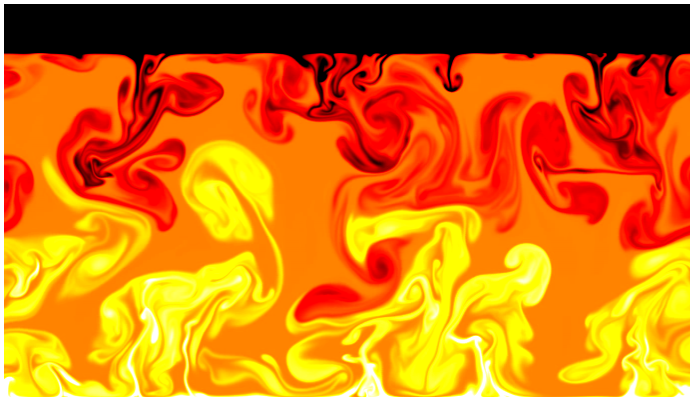
Phenomenon

Turbulent Rayleigh–Bénard Convection



Phenomenon

Turbulent Rayleigh–Bénard Convection



Governing Equations

Oberbeck-Boussinesq Equations in Non-dimensional Form

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

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

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)

Contents



Introduction

- ▶ Part I: Temperature Statistics and PDF Equations

(a) Periodic Boundary Conditions^a

(b) Cylindrical Vessel

Part II: Flow Reversals

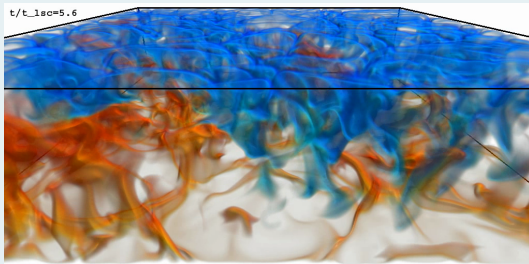
Summary and Conclusion

^aJL, M. Wilczek, R. Friedrich

System and Numerics

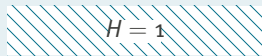
Rayleigh–Bénard System

- ▶ Homogenous in horizontal direction
- ▶ No-slip bottom and top plates $\mathbf{u} = \mathbf{0}$
- ▶ Parameters: $Ra = 2 \cdot 10^7$, $Pr = 1$, $\Gamma = 4$

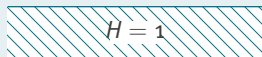


System and Numerics

Numerics



$$H = 0$$



- ▶ Tri-periodic pseudospectral code
- ▶ Velocity and temperature boundary conditions enforced via **volume penalization**^a:
 - › Add damping terms $-\frac{1}{\epsilon}H(\mathbf{x})\mathbf{u}$ and $-\frac{1}{\epsilon}H(\mathbf{x})(T - T_{\text{plate}})$ to Oberbeck-Boussinesq equations
 - › $H(\mathbf{x})$ separates fluid and wall regions
 - › For $\epsilon \rightarrow 0$, desired boundary conditions are obtained

^aK. Schneider, *Comp. & Fluids*, 34(10):1223, 2005

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

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

Deriving an Evolution Equation

Simplify equation by using **statistical symmetries**:

- ▶ Homogeneity: $f(T, \mathbf{x}, t) = f(T, \mathbf{z}, t)$
 - ▶ Stationarity: $f(T, \mathbf{z}, t) = f(T, \mathbf{z})$
- ⇒ x -, y - and t -derivatives vanish!

Evolution Equation under Statistical Symmetries

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

- ▶ The two conditional averages are **estimated from numerics** (more on that later on)

Method of Characteristics yields average behaviour

- ▶ 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
- ▶ The characteristics describe the **average transport in phase space**, spanned by T and z

Method of Characteristics

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

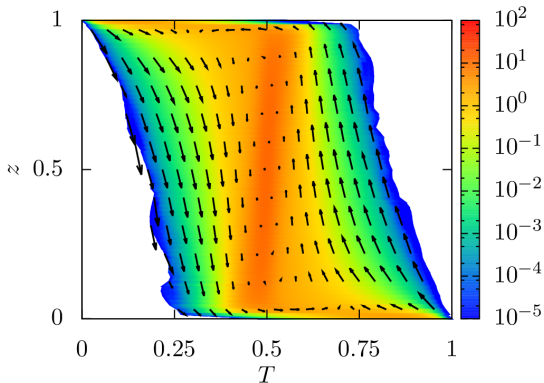
Characteristics

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

- ▶ $\langle \cdot | T, z \rangle$ are “known” quantities
 - ▶ Characteristics show **average behavior of a fluid particle in phase space**
- ⇒ Quasi-Lagrangian view obtained from **snapshots of Eulerian fields!**

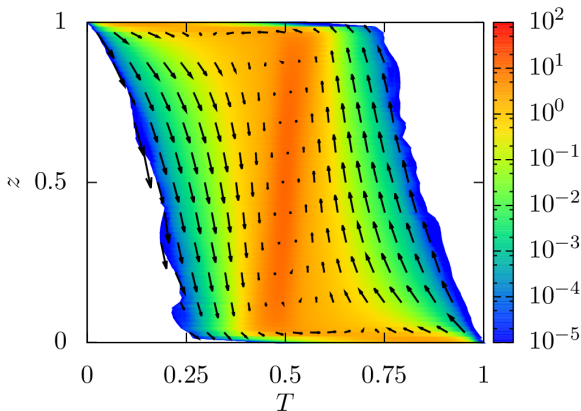
Results from the Numerics

- ▶ Color coded: Temperature PDF $f(T, z)$
- ▶ Black arrows: Vectorfield of Characteristics $\begin{pmatrix} \langle \Delta T | T, z \rangle \\ \langle u_z | T, z \rangle \end{pmatrix}$



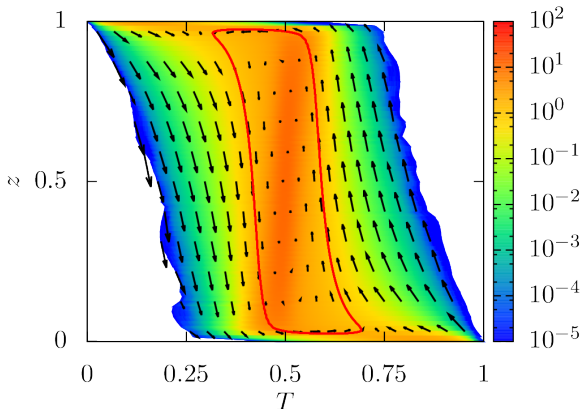
Results from the Numerics

- Integration of vectorfield $\left(\begin{array}{c} \langle \Delta T | T, z \rangle \\ \langle u_z | T, z \rangle \end{array} \right)$ yields **Characteristics**



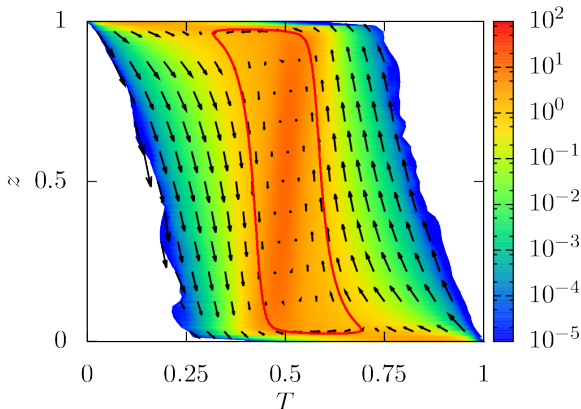
Results from the Numerics show Limit Cycle

- ▶ Characteristic curves starting from any point (T_0, z_0) converge towards **limit cycle!**



Results from the Numerics show Limit Cycle

- ▶ Limit cycle and vectorfield show typical Rayleigh–Bénard cycle!



Contents



Introduction

- ▶ Part I: Temperature Statistics and PDF Equations

(a) Periodic Boundary Conditions

(b) Cylindrical Vessel^a

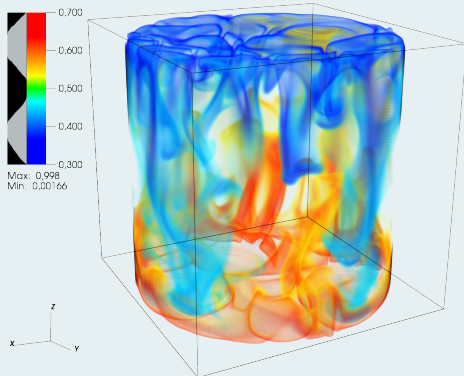
Part II: Flow Reversals

Summary and Conclusion

^aJL, M. Wilczek, R. Friedrich, R. Stevens, D. Lohse

System and Numerics

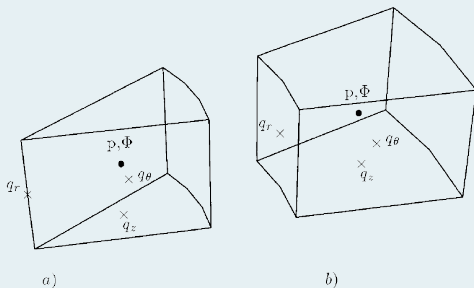
Rayleigh–Bénard System



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

System and Numerics

Numerics¹



- ▶ 2nd order finite difference scheme
- ▶ non-uniform cylindrical grid
- ▶ gridpoint clustering near horizontal plates and sidewalls

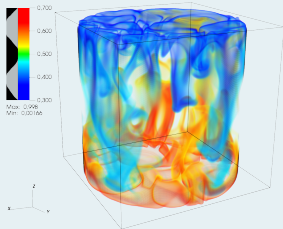
¹R. Verzicco and R. Camussi, *J. Fluid Mech.*, 477:19–49, 2003

Evolution Equation for Temperature PDF

Evolution Equation

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

Symmetries



- ▶ **Homogeneous** in azimuthal (φ -) direction: $f(T, r, \varphi, z, t) = f(T, r, z, t)$
- ▶ **Stationary** in time: $f(T, r, z, t) = f(T, r, z)$

Temperature PDF

Evolution Equation

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

Vectorfield of Characteristics

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

Characteristics show Limit Cycle (LC)!

- ▶ Integration of vectorfield

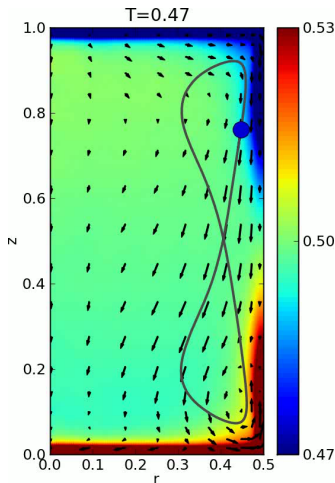
$$\left\langle \begin{pmatrix} \Delta T \\ u_r \\ u_z \end{pmatrix} \middle| T, r, z \right\rangle$$

yields **characteristics**

- ▶ Characteristics for different starting positions **converge** to unique **limit cycle** in T - r - z phase space

Shown on right:

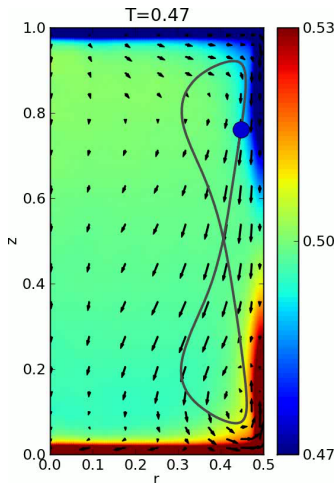
- (Mean) temperature color coded
- Projection of limit cycle into r - z plane
- Fluid parcel traveling along the LC
- Vectorfield slice in r - z plane at T coordinate of fluid parcel



Limit Cycle

Features of Limit Cycle:

- ▶ 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, $0.47 < T < 0.53$

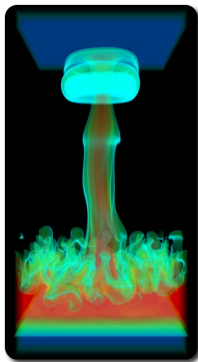


Summary

Part I

- ▶ 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

Contents



Introduction

Part I: Temperature Statistics and PDF Equations

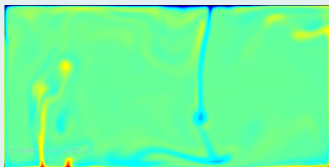
► Part II: Flow Reversals^a

Summary and Conclusion

^aK. Petschel, M. Wilczek, U. Hansen, R. Friedrich

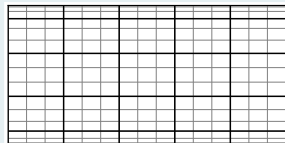
System and Numerics

Rayleigh–Bénard System



- ▶ 2D convection, insulating sidewalls
- ▶ $Ra = 10^8$, $\Gamma = 2$, $Pr = \infty$ (\rightarrow Earth's mantle: $Pr \approx 10^{25}$)
- ▶ All surfaces are **stress-free**

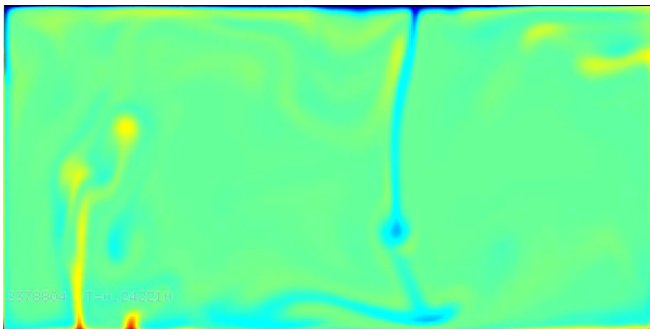
Numerics



- ▶ Finite volume multigrid method^a
- ▶ Grid refinement near plates

^aR. Trompert, U. Hansen, *Geophys. Astrophys. Fluid Dyn.*, 83:261, 1996

Reversal in Large-Scale Circulation (LSC)



Reversal mechanism:

- ▶ Stable **one-cell** structure
- ▶ Plumes create **two-cell** structure
- ▶ Two-cell structure **breaks down** and forms **reversed one-cell** structure

Describing the Reversal Mechanism

Idea

- ▶ Expand velocity field $\mathbf{u}(\mathbf{x}, t)$ in **orthogonal basis** $\{\hat{\mathbf{u}}_{lm}\}$:

$$\mathbf{u}(\mathbf{x}, t) = \sum_{l,m} \xi_{lm}(t) \hat{\mathbf{u}}_{lm}(\mathbf{x})$$

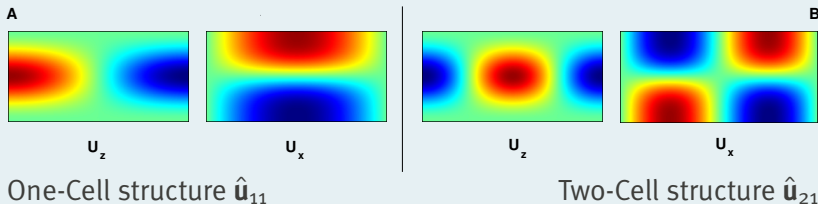
with time-dependent amplitudes $\xi_{lm}(t)$

- ▶ Identify modes involved in reversal
- ▶ Analyze and describe dynamics of these modes

Describing the Reversal Mechanism

Orthogonal Basis $\{\hat{\mathbf{u}}_{lm}\}$

- ▶ $\hat{\mathbf{u}}_{lm}$ are Eigenfunctions of Laplacian $\Delta \mathbf{u}$, satisfy b.c.
- ▶ Important modes for reversal mechanism:



⇒ Amplitudes $\xi_{11}(t)$ and $\xi_{21}(t)$ are used to describe reversal!

Statistics and Dynamics of Main Modes

Analysis of 2D subspace spanned by modes ξ_{11} and ξ_{21}

- ▶ Joint PDF

$$f(\xi_{11}, \xi_{21})$$

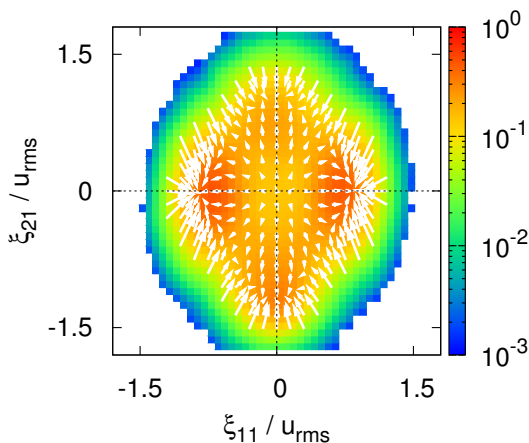
describes **probability** of (simultaneous) appearance of modes

- ▶ Drift vectorfield

$$\mathbf{D}(\xi_{11}, \xi_{21}) = \frac{1}{\tau} \left\langle \begin{pmatrix} \xi_{11} \\ \xi_{21} \end{pmatrix} (t + \tau) - \begin{pmatrix} \xi_{11} \\ \xi_{21} \end{pmatrix} (t) \middle| \xi_{11}, \xi_{21} \right\rangle$$

describes **transition** between modes (with τ much smaller than time between reversals)

Statistics and Dynamics of Main Modes



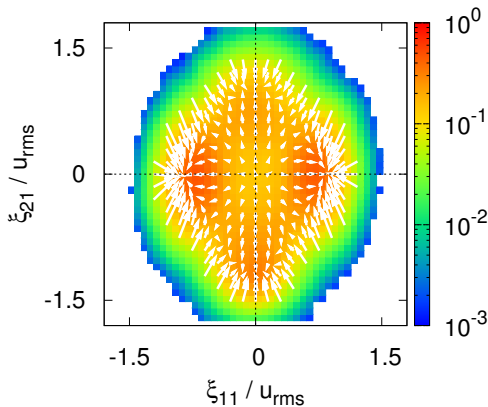
► Color: PDF
 $f(\xi_{11}, \xi_{21})$

► White arrows:
Drift vectorfield
 $\mathbf{D}(\xi_{11}, \xi_{21})$

⇒ 4 attractive fixed
points in the
most probable
configurations

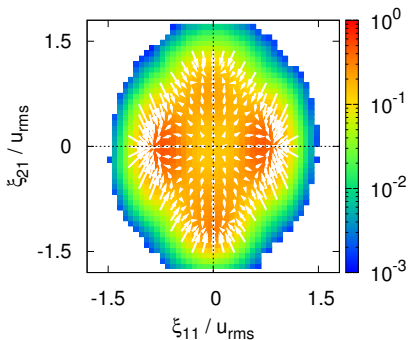
⇒ Unstable fixed
point in the
center

Statistics and Dynamics of Main Modes



1. Noise (plumes) drives system out of one-cell fixed point (FP)
2. Large-Scale Circulation breaks down, system settles in two-cell FP
3. Noise drives system out of two-cell FP, system settles in one-cell FP with reversed circulation (same direction equally possible)

Statistics and Dynamics of Main Modes



- ▶ Reversal involves **transition** over higher modes, induced by **plumes acting as noise**
- ▶ Direct reversal between one-cell FPs not possible (→ unstable FP in center)
- ▶ Transition over higher modes possible (not shown here)
- ▶ Reversal mechanism different from no-slip boundaries (→ corner rolls)

Summary

Part II

- ▶ Flow reversal is understood as a transition over higher modes induced by plumes
- ▶ Primary modes ξ_{11} and ξ_{21} are used to describe reversal
- ▶ PDF and drift vectorfield of modes are used to identify stable configurations (fixed points) and transitions between them
- ▶ Plumes act as noise that drives the system out of the fixed points

Contents



Introduction

Part I: Temperature Statistics and PDF Equations

Part II: Flow Reversals

► Summary and Conclusion

Conclusion

Part I¹

Starting from an **evolution equation for the temperature PDF**, we obtained the **most probable behavior** of a fluid parcel in phase space and found a **limit cycle**

Part II²

Analyzing the most important modes, we identified **flow reversals** as a transition between **stable fixed points** over higher modes that is triggered by **plumes acting as noise**

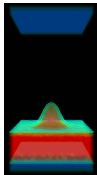
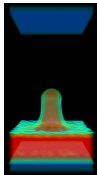
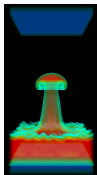
⇒ **Connection between statistics and dynamics** of RB convection!

¹JL, M. Wilczek, R. Friedrich, *New J. Phys.*, 13(1):015002, 2011

²K. Petschel et. al., *Phys. Rev. E*, 84:026309, 2011



Thank you for your attention!



institut für
theoretische physik



Rudolf Friedrich
† August 2012

