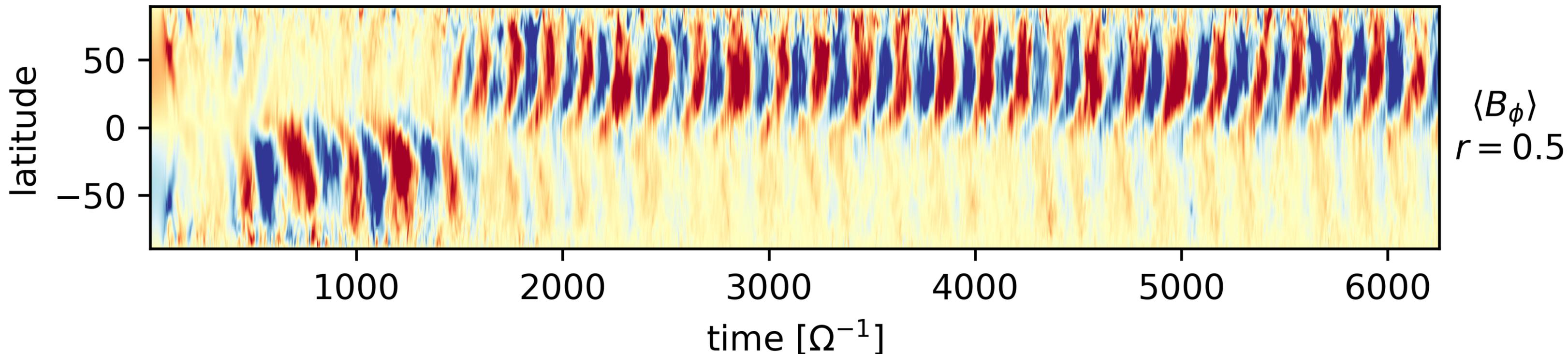


# What can we learn from multi-D simulations anyways?

Benjamin Brown (University of Colorado),  
with Jeffrey Oishi (Bates), Geoffrey Vasil (U Sydney),  
Daniel Lecoanet (Northwestern), and Keaton Burns (MIT)

Toroidal magnetic field



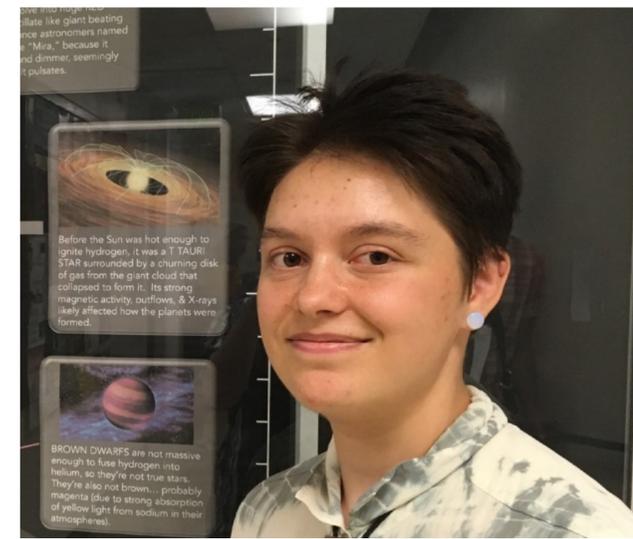


# People do science

## Exoweather group



**Ryan Díaz-Pérez**  
Data Scientist  
Los Angeles, CA



**Jhett Bordwell**  
Myriad Genetics  
San Francisco, CA



**Evan Anders**  
CIERA Fellow  
Northwestern



**Whitney Powers**



**Imogen Cresswell**



**Linnea Wolniewicz**  
APS undergrad



**Gabriel Ortiz-Peña**  
University lecturer  
Guadalajara, Mexico



**Katie Manduca**  
Boulder Labs  
Boulder, CO



**Tayler Quist**  
Applied Math  
UC Santa Cruz

### the Dedalus collaboration



**Jeffrey Oishi**  
Bates College



**Keaton Burns**  
MIT & CCA



**Geoffrey Vasil**  
University of Sydney



**Daniel Lecoanet**  
Northwestern

### current and recent Hale postdoc fellows



**Lydia Korre**  
APS/Applied Math



**Benoit Tremblay**  
APS/NSO



**Alicia Aarnio**  
UNC-Greensboro



**Feng Chen**  
Nanjing University

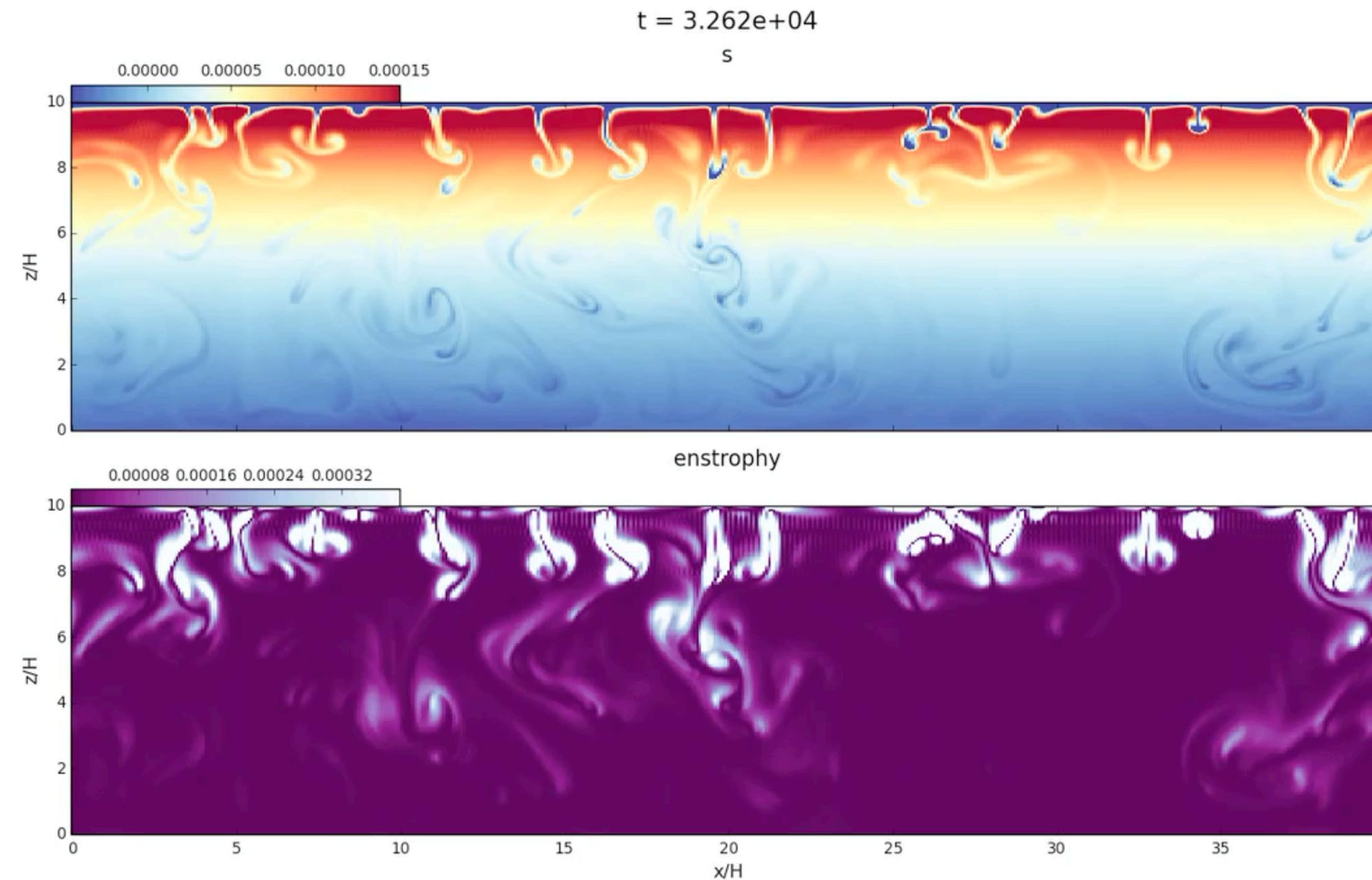
# Personal views

- Simulations lie
- Sometimes you can catch them
- Sometimes you can't
- So what do we do?

# Some ways we can be wrong...

- **Errors of numerics**
  - you're solving the problem wrong on a computer; this one we can catch
- **Errors of approximation/model**
  - you're solving a different problem than the real one (deliberately, or not)
- **Errors of application**
  - you're not solving the problem you think that you're solving (this one's nasty...)

# Errors of numerics



**Here is a 2-D simulation of something. The mistake made is that the resolution is too low. Under-resolution can do a lot of things; most of them don't obey physics.**

**This is a spectral code, so when problems happen, they're  $O(1)$ . That's a feature.**

**If you don't catch them, the sim may continue, but it's no good any more.**

# Errors of approximation/model

Now you're changing the simulation. Maybe you're doing 2-D rather than 3-D. Or maybe you're solving a different set of equations (e.g., Boussinesq) rather than the real ones (e.g., fully compressible). Or you're in the wrong geometry. This can be fine.

Or not.

But it's a choice. And we can all discuss choices like civilized people.

# An example: different models for low Mach flows

$$\nabla \cdot \mathbf{u} = 0$$

Boussinesq  
(incompressible flow & buoyancy)

$$\nabla \cdot \mathbf{u} = -\mathbf{u} \cdot \nabla \ln \rho_0$$

Anelastic  
(adds stratification)

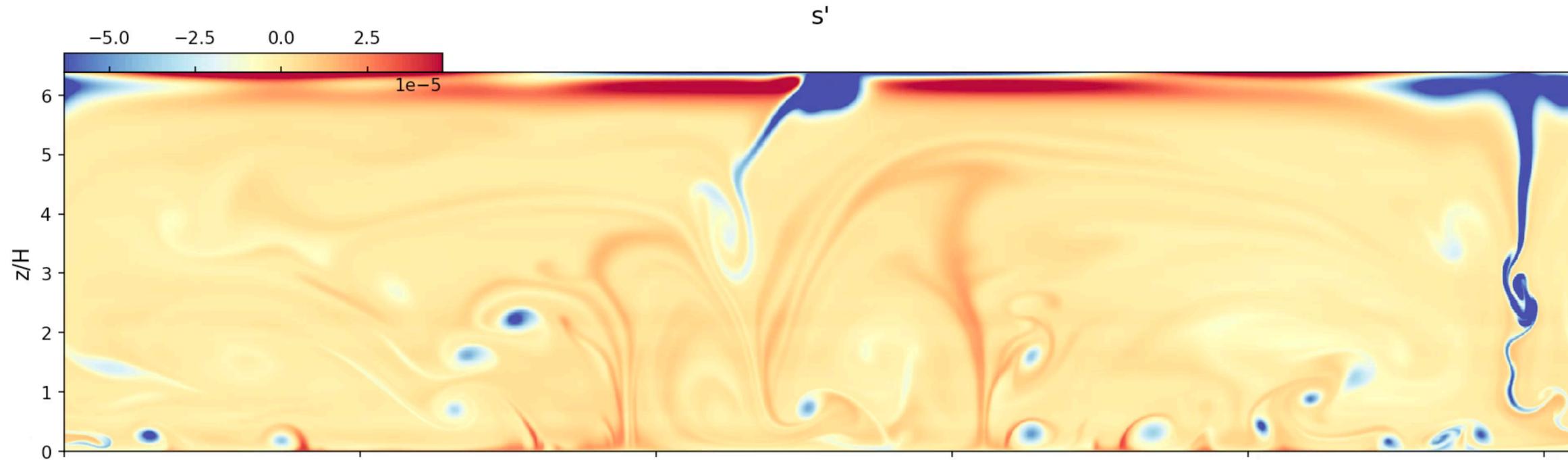
$$\nabla \cdot \mathbf{u} = -\frac{\mathbf{u} \cdot \nabla \ln P_0}{\Gamma_1(P_0, \rho)}$$

Generalized PI  
(adds finite amplitude  
thermal perturbations;  
generalizes EOS)

$$\nabla \cdot \mathbf{u} = -\mathbf{u} \cdot \nabla \ln \rho - \partial_t \ln \rho$$

Fully compressible  
(the real deal)

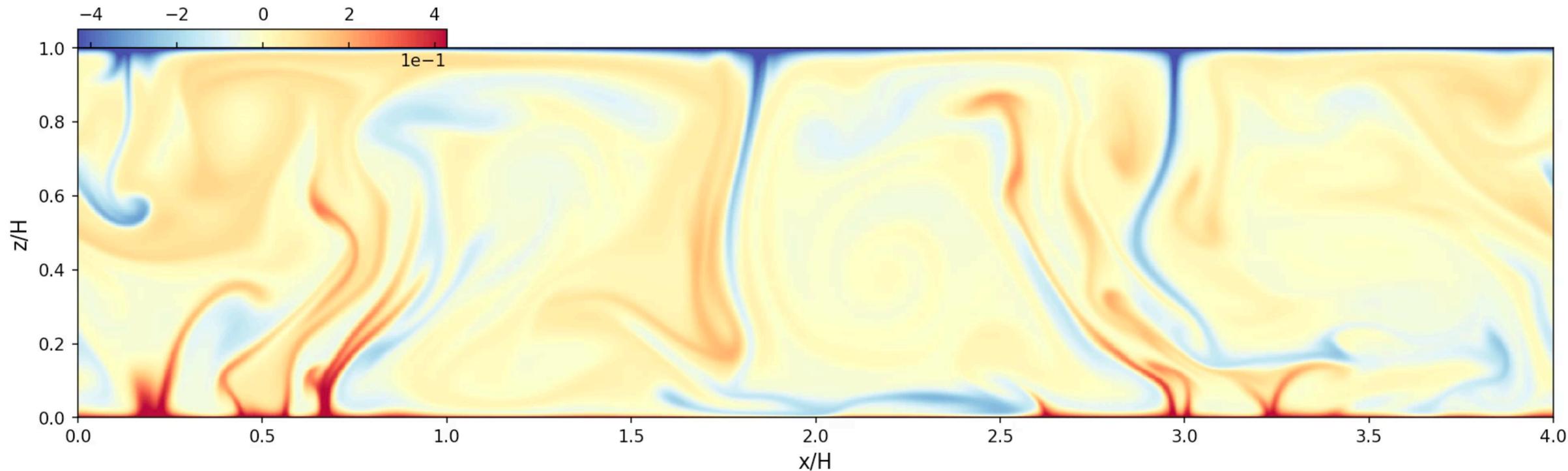
# Stratified, fully compressible convection



**Both of these are 2-d.**

**There are some shared similarities, and some differences. That may or may not matter.**

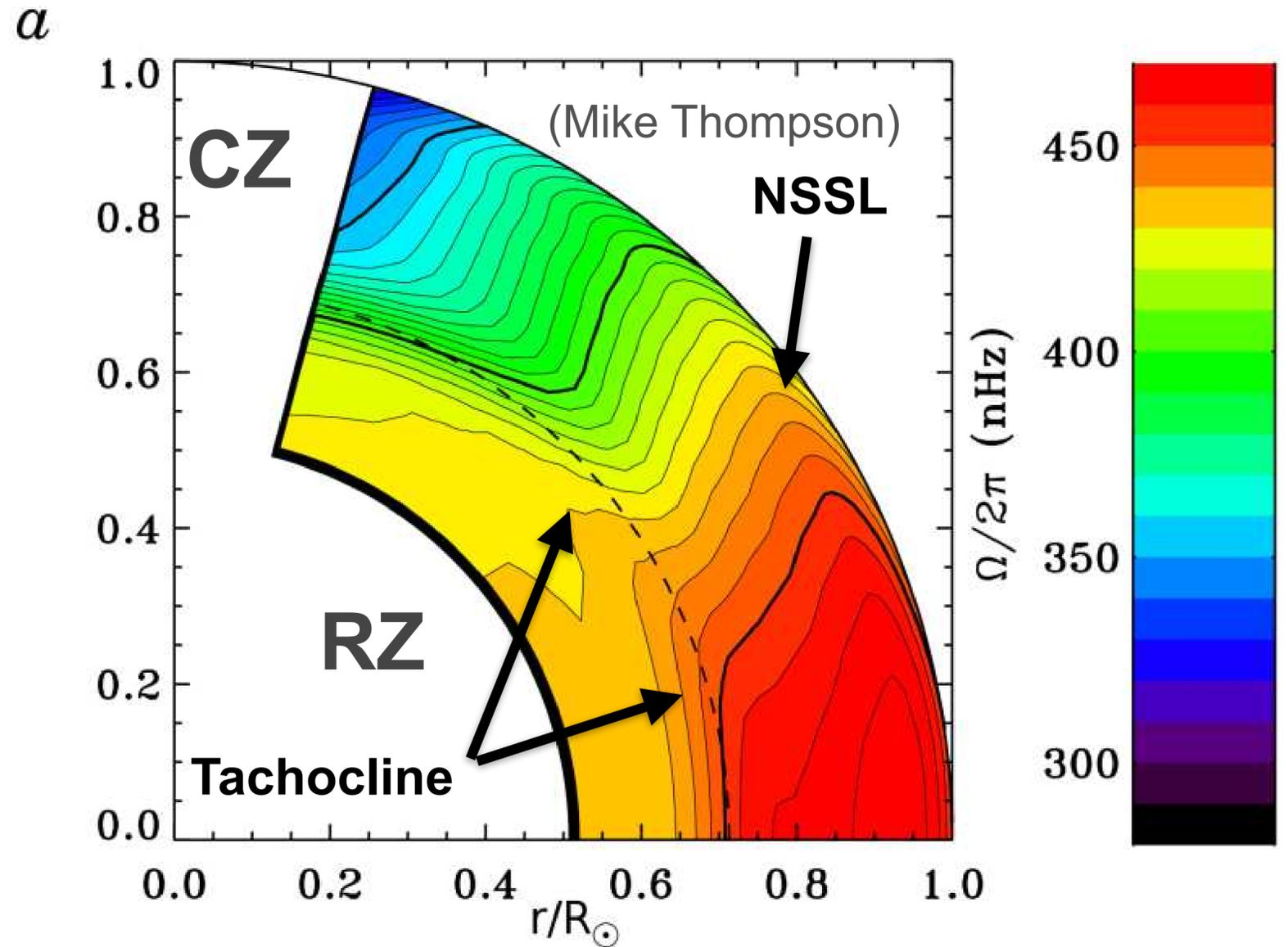
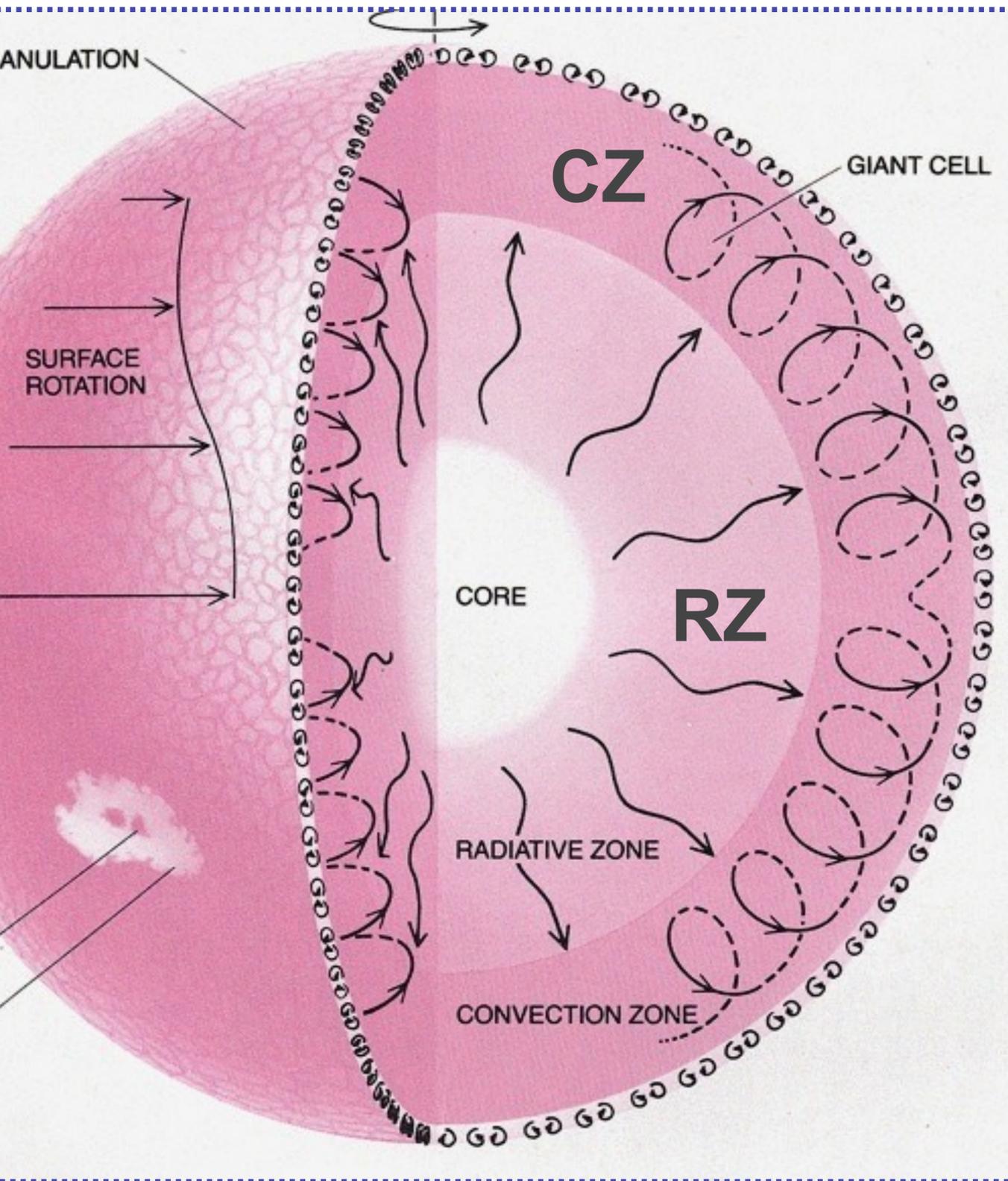
# Non-stratified, boussinesq convection



**If you're careful, you can learn from either of these.**

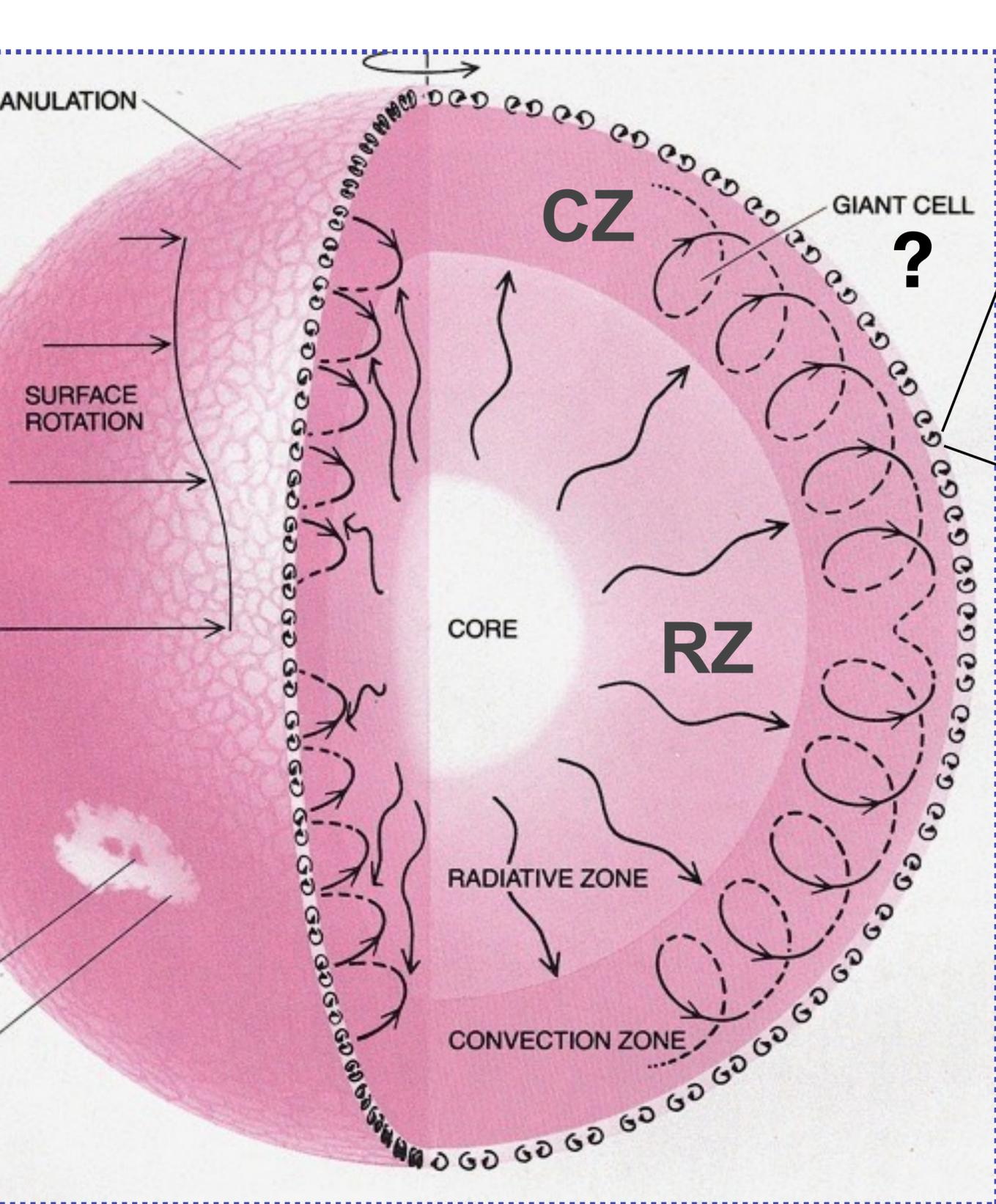
$$\nabla \cdot \mathbf{u} = 0$$

# Inside our Sun: mysteries on the large scales

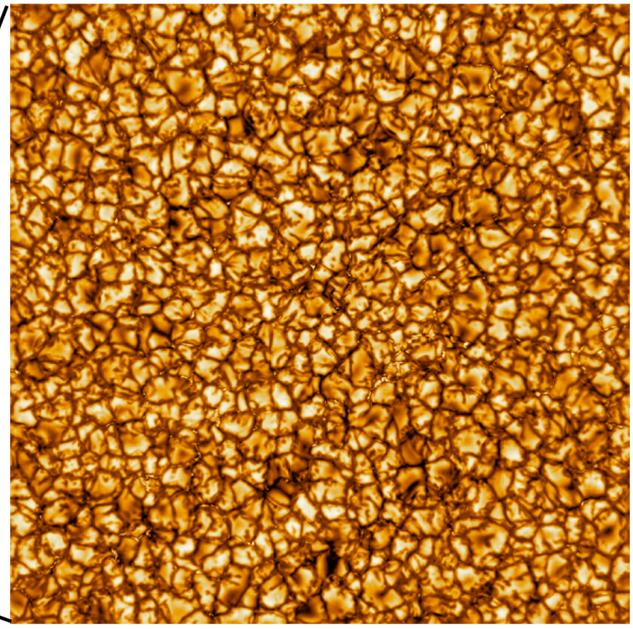


- Why does the interior of the Sun rotate like it does?
- The NSSL is MRI unstable; what does that mean?
- Where are the solar global-scale magnetic fields built?

# Inside our Sun: mysteries on the large scales

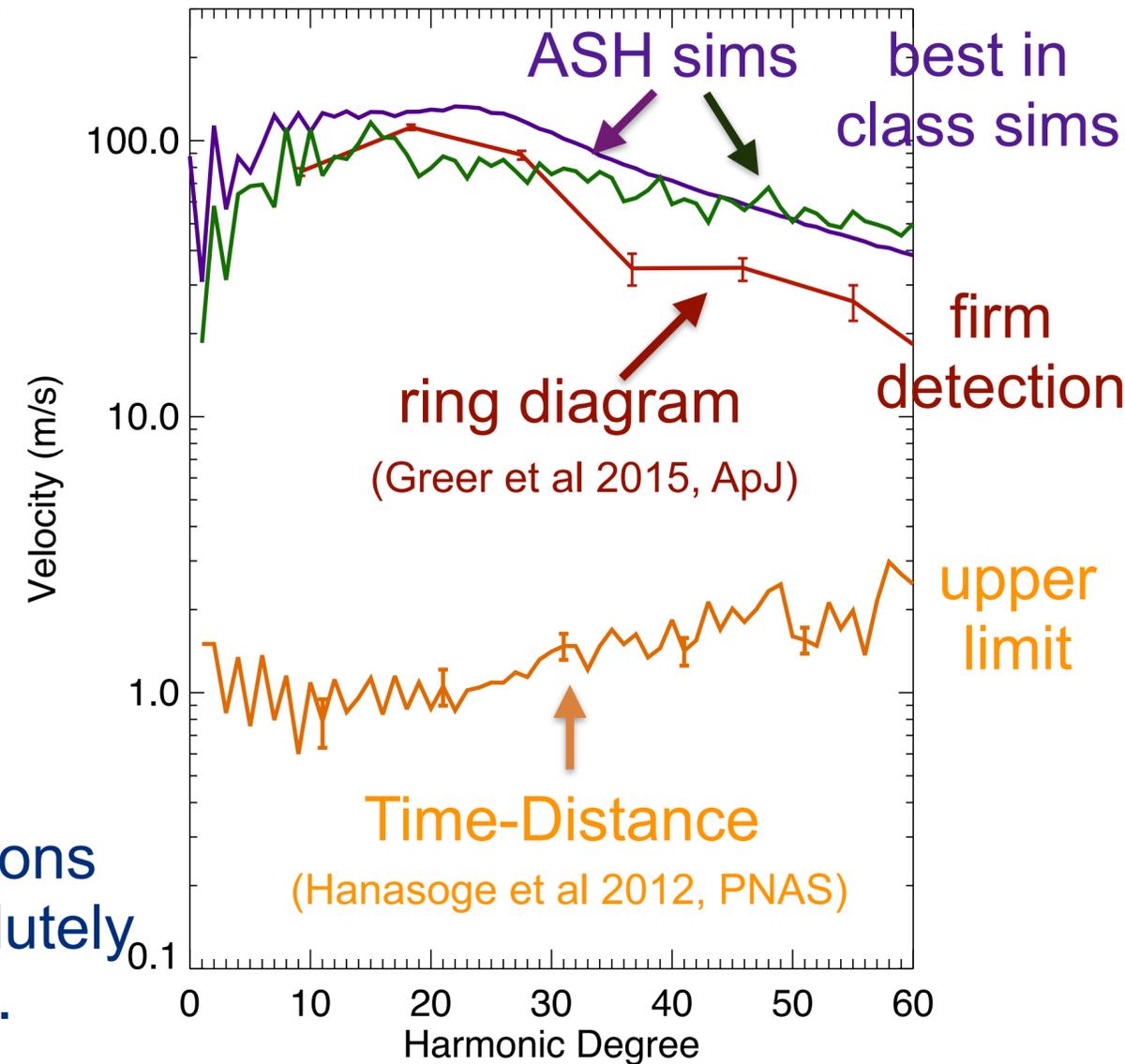


~100 Mm



DKIST, granulation

Helioseismic observations of giant cells have absolutely huge disagreement.



NASA SDO, giant cells

- Why does the interior of the Sun rotate like it does?
- The NSSL is MRI unstable; what does that mean?
- Where are the solar global-scale magnetic fields built?
- Where are the giant cells of convection?

# Solar Dynamo Models: some history

## 2D: Mean-field models

- $\alpha$ - $\Omega$  type
- interface dynamos
- flux-transport and many variants (e.g. Babcock-Leighton)

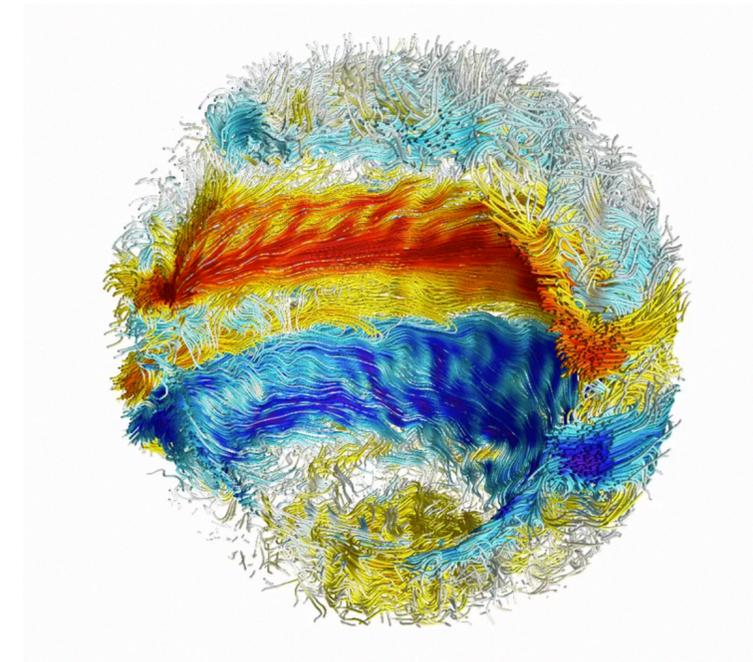
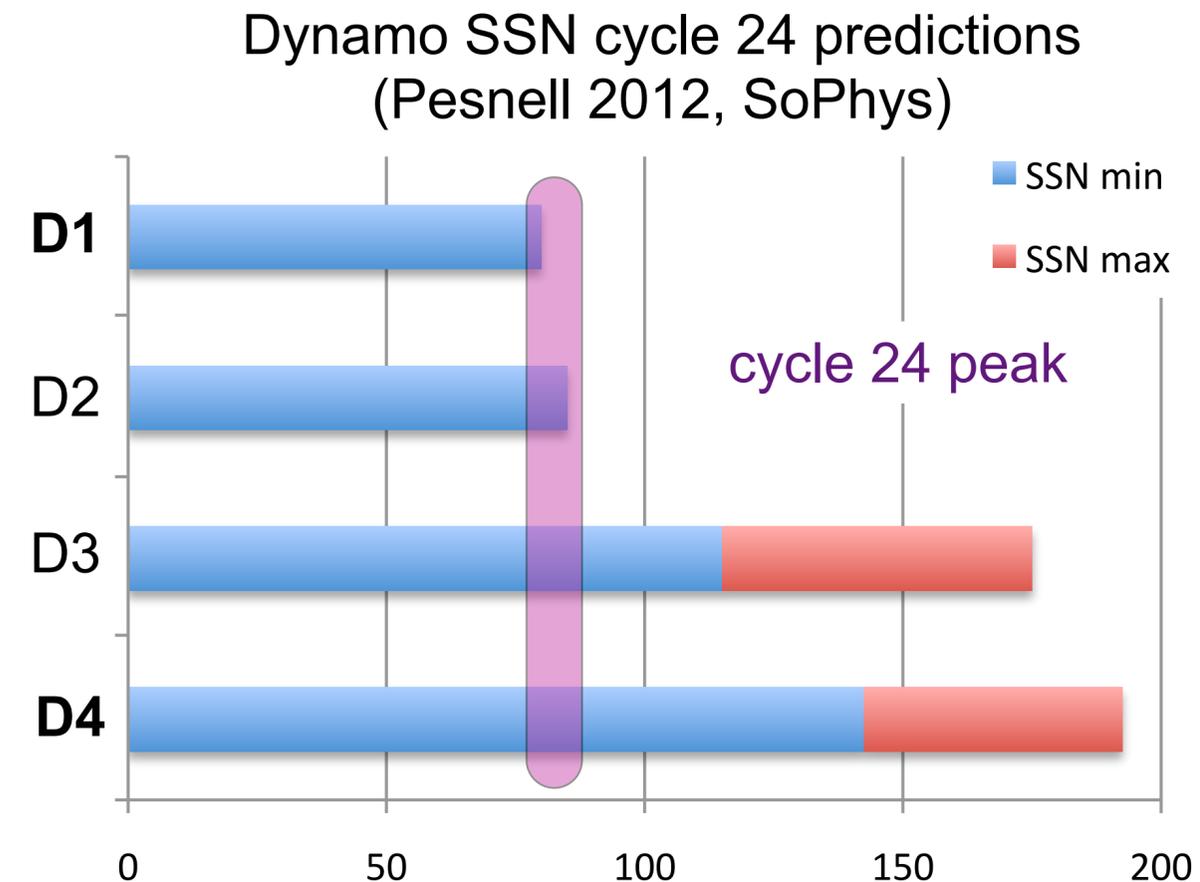
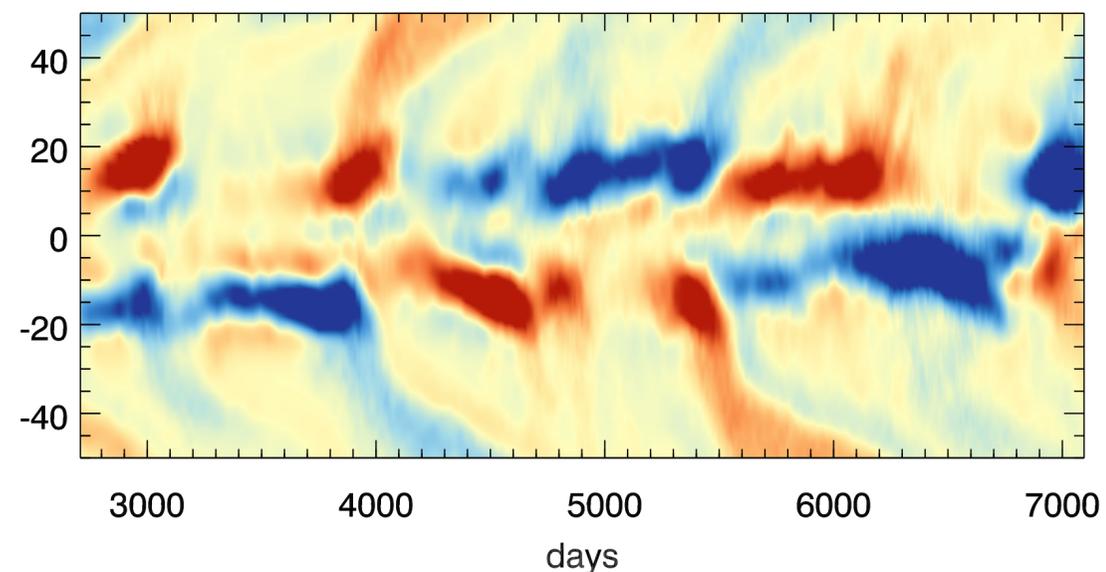
Computationally inexpensive: simulate many cycles, try many ideas  
In a position to try solar predictions (but parameterize convection)

## 3D: Convection, Rotation & Magnetism

- global-scale flows, magnetism, coupling from first principles
- now achieving cyclic behavior, buoyant magnetic structures

Computationally expensive

Solar parameters well out of reach



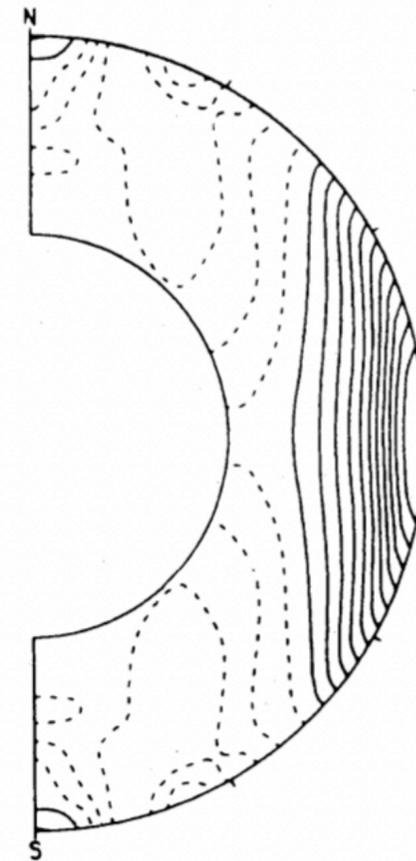


# History

- **Gilman and Glatzmaier develop the first 3-D, spherical, global solar dynamo models (1980's). Boussinesq turned to anelastic, and Glatzmaier 1985 got anelastic dynamos.**

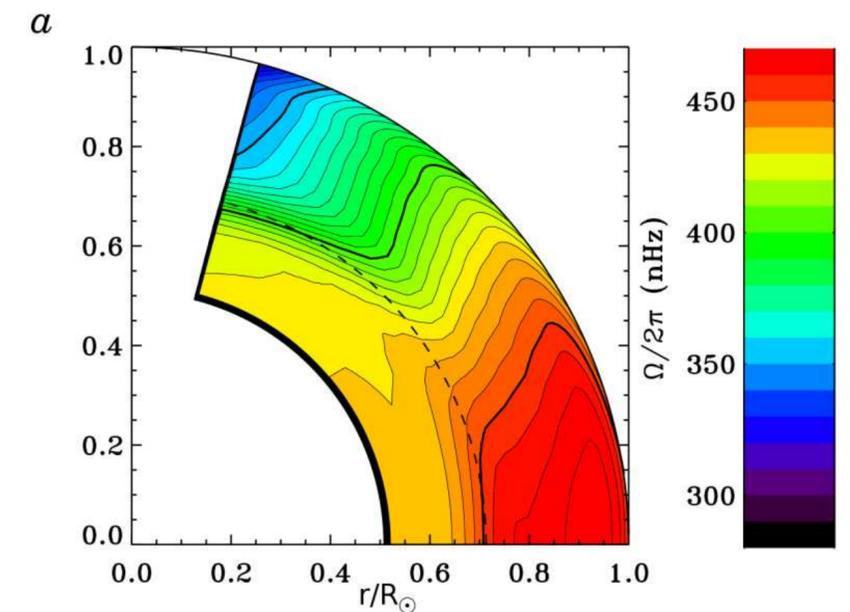
- **Resolutions were low, dynamics were limited, differential rotation was solar-like.**

Differential Rotation



(a)

(Glatzmaier 1985)



(Mike Thompson)

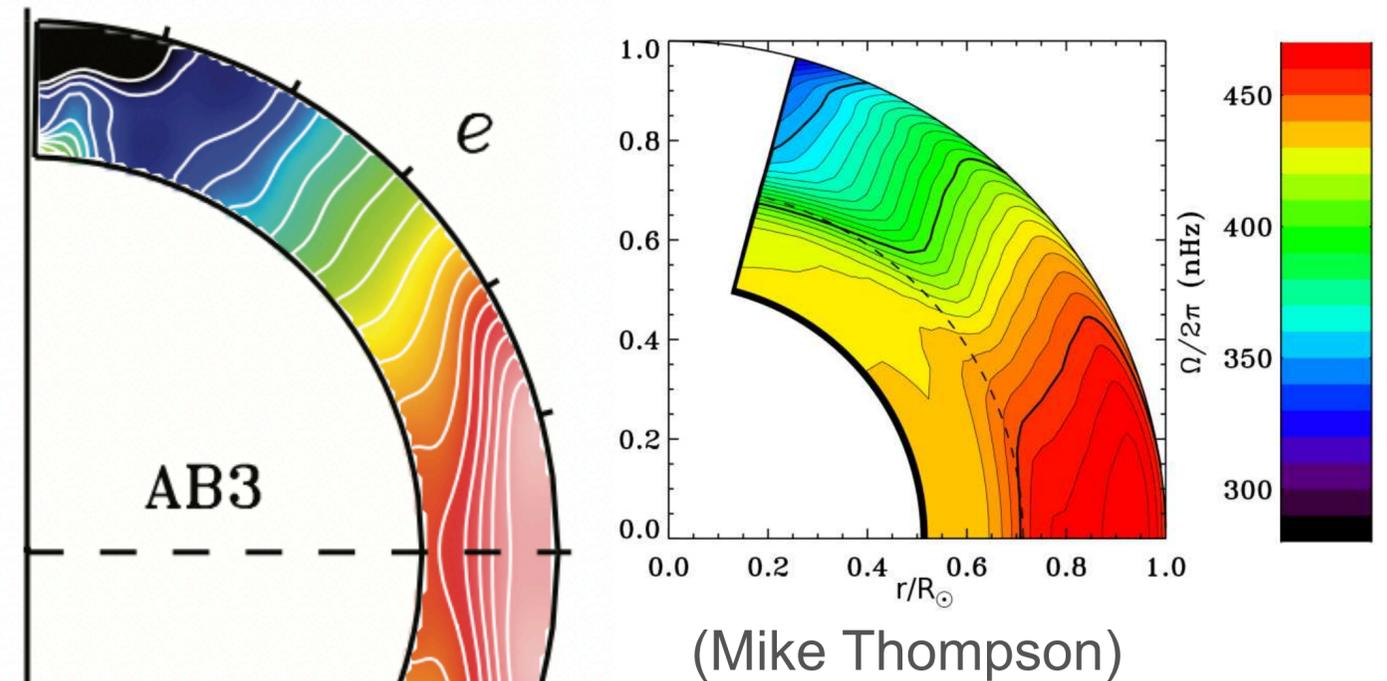
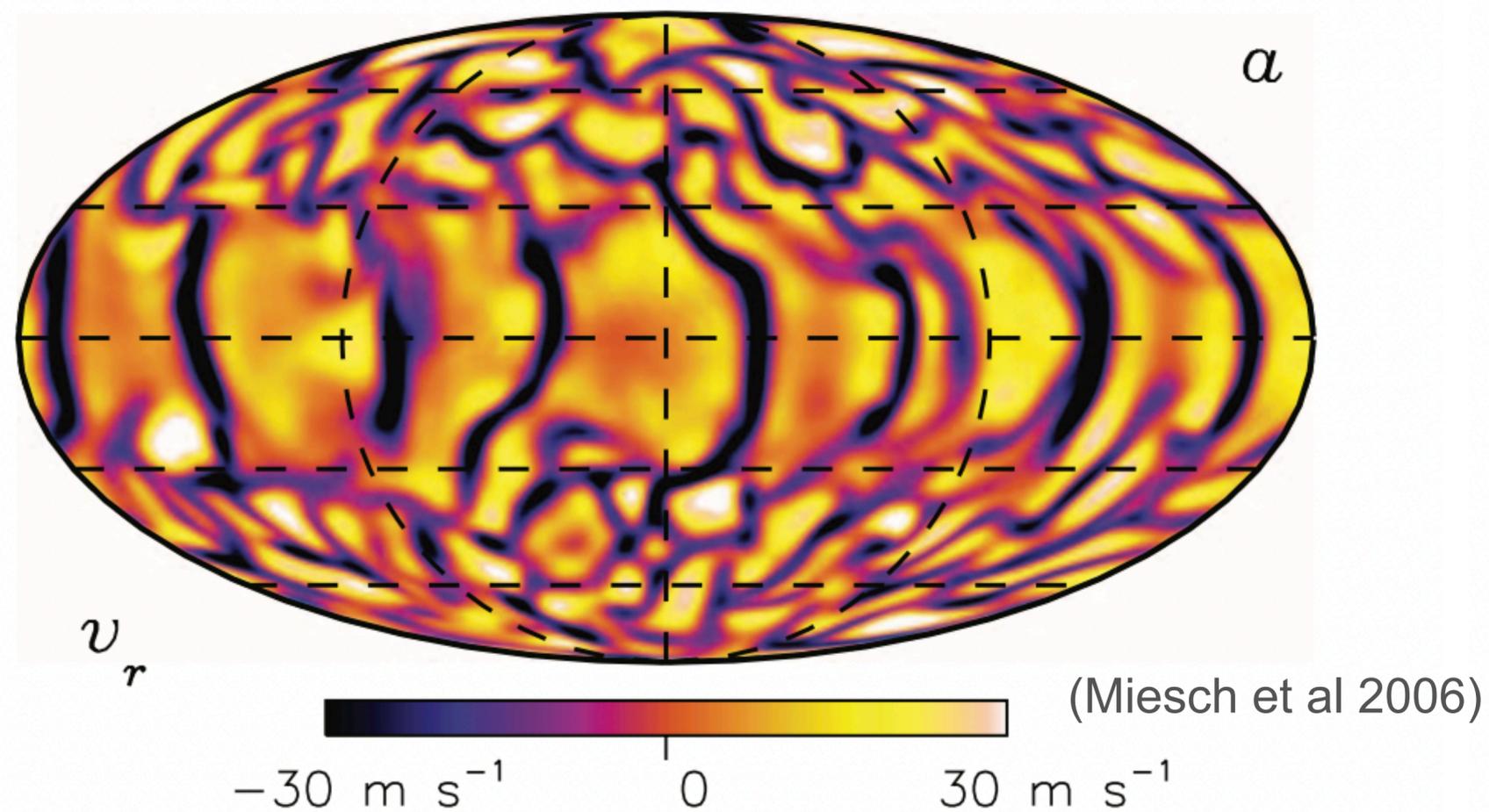
# *History*

- In the 2000's, Juri Toomre lead a re-building of anelastic spherical codes for modern computers. The ASH mob was born.



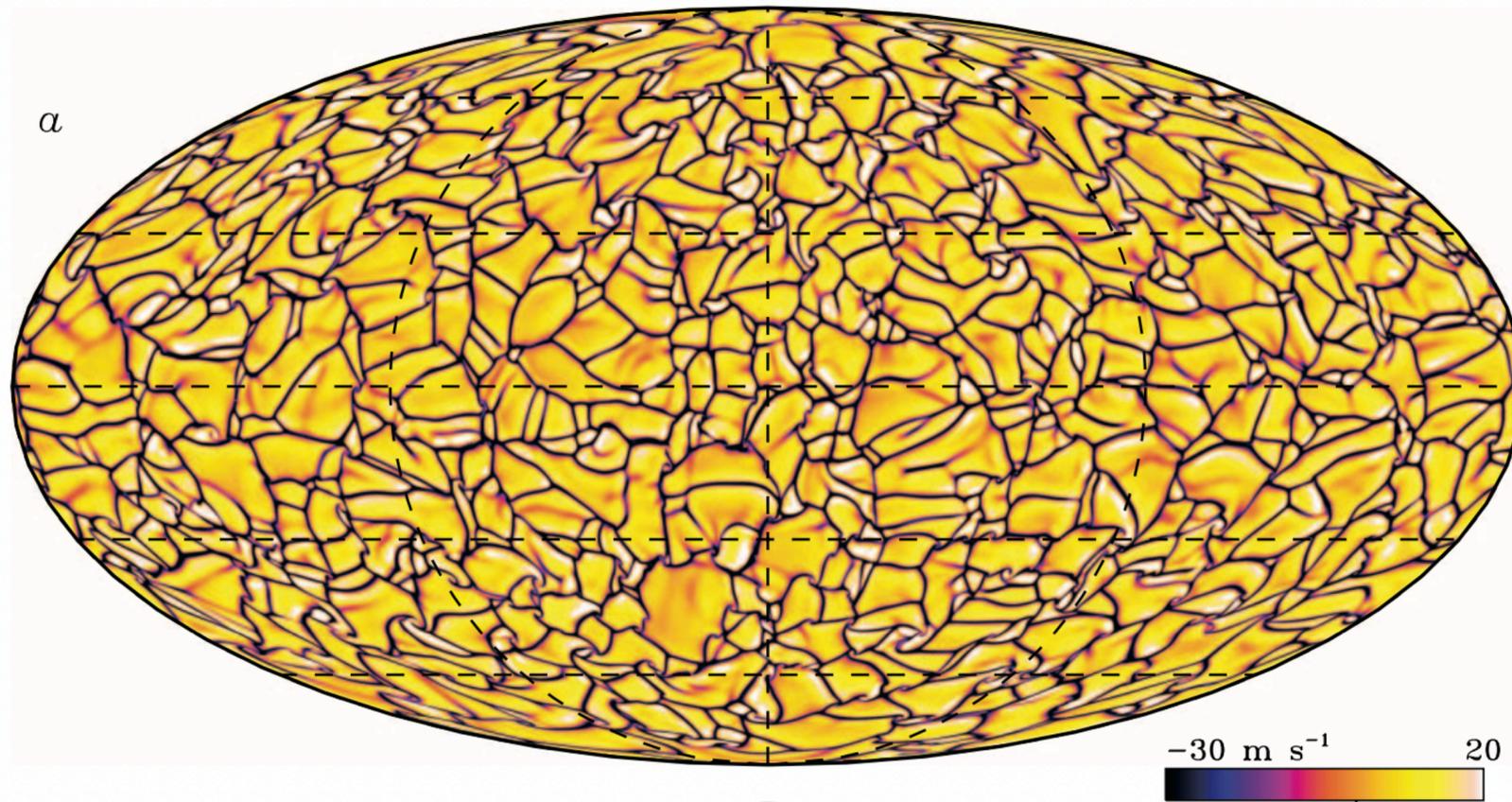
# History

- ASH simulations of the Sun took off. First dynamo results (Brun, Miesch & Toomre 2004) lead to attempts to dial in the solar differential rotation (Miesch, Brun & Toomre 2006) guided by thermal wind theory by Rempel (2005). Resolutions were middling, time evolution was longish.

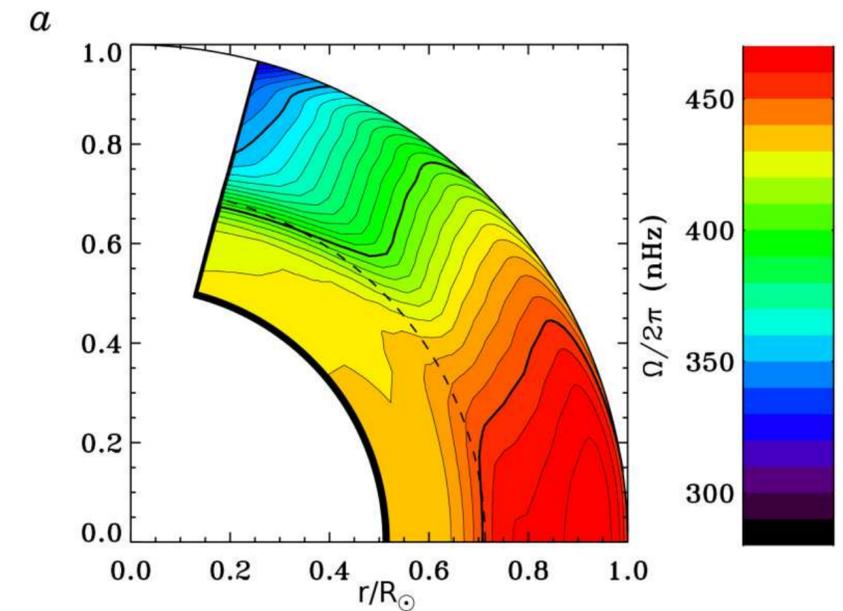
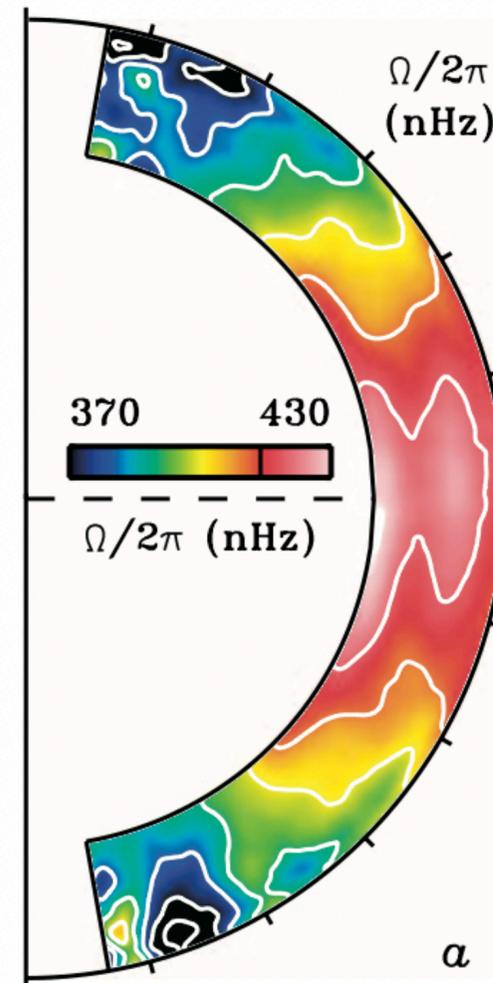


# History

- Access to bigger computers meant bigger sims. Miesch et al (2008) was a high point ( $\sim 1000^3$ ). Everything seemed fine. Sort of.



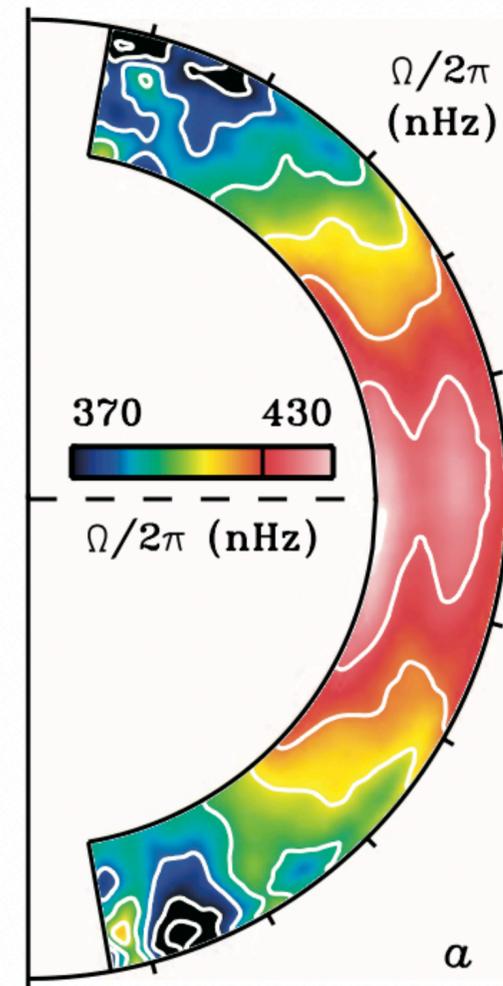
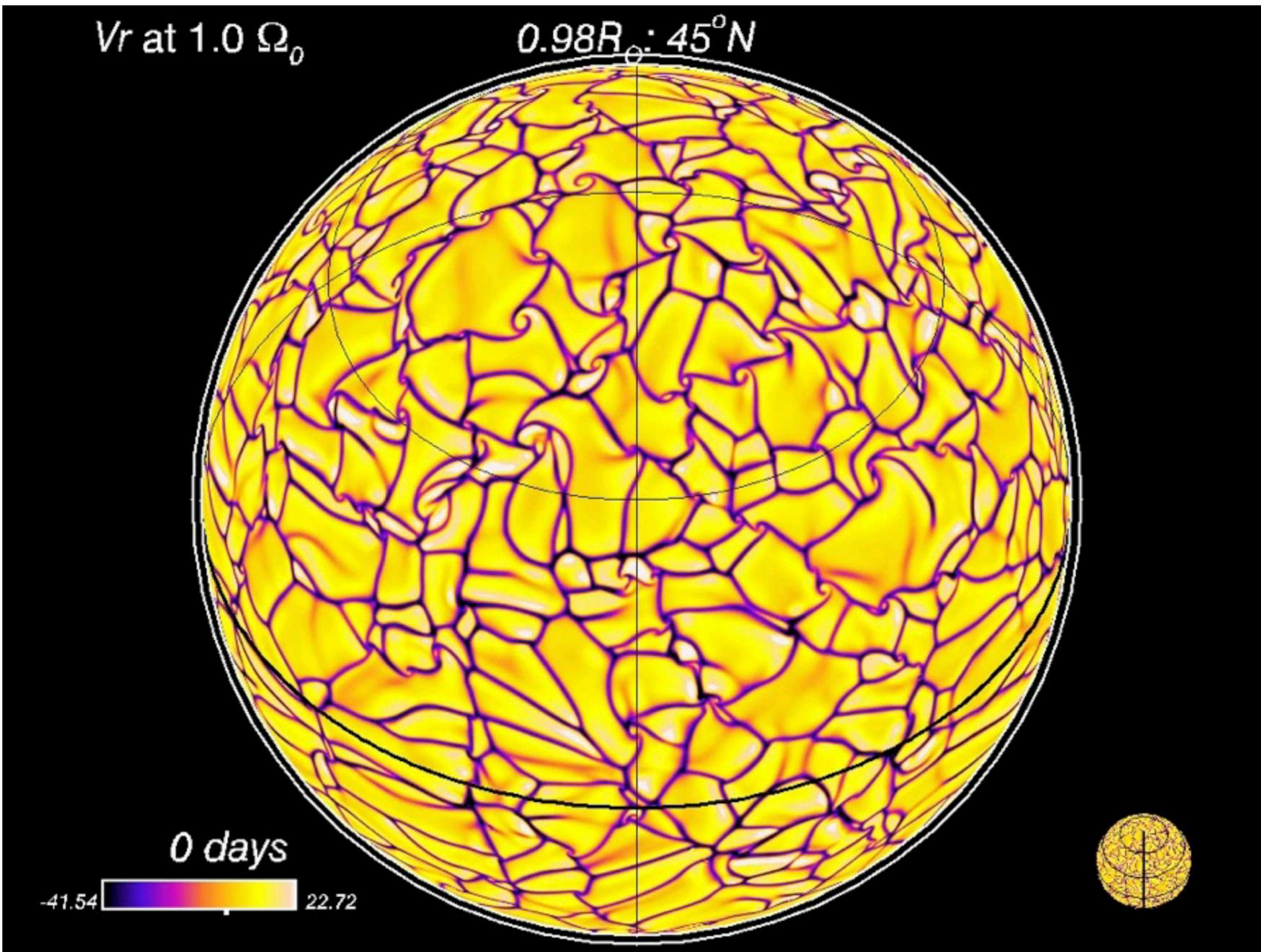
(Miesch et al 2008)



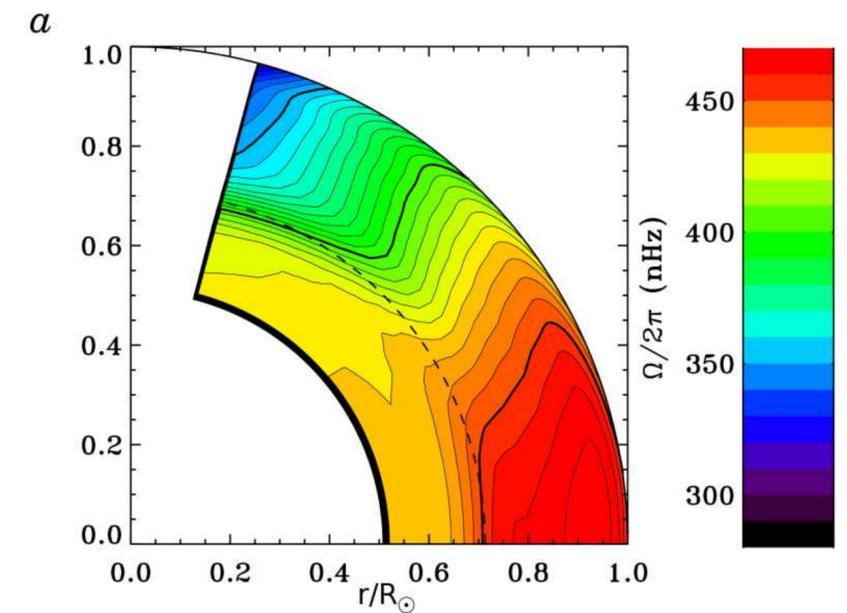
(Mike Thompson)

# History

- Access to bigger computers meant bigger sims. Miesch et al (2008) was a high point ( $\sim 1000^3$ ). Everything seemed fine. Sort of.



(Miesch et al 2008)



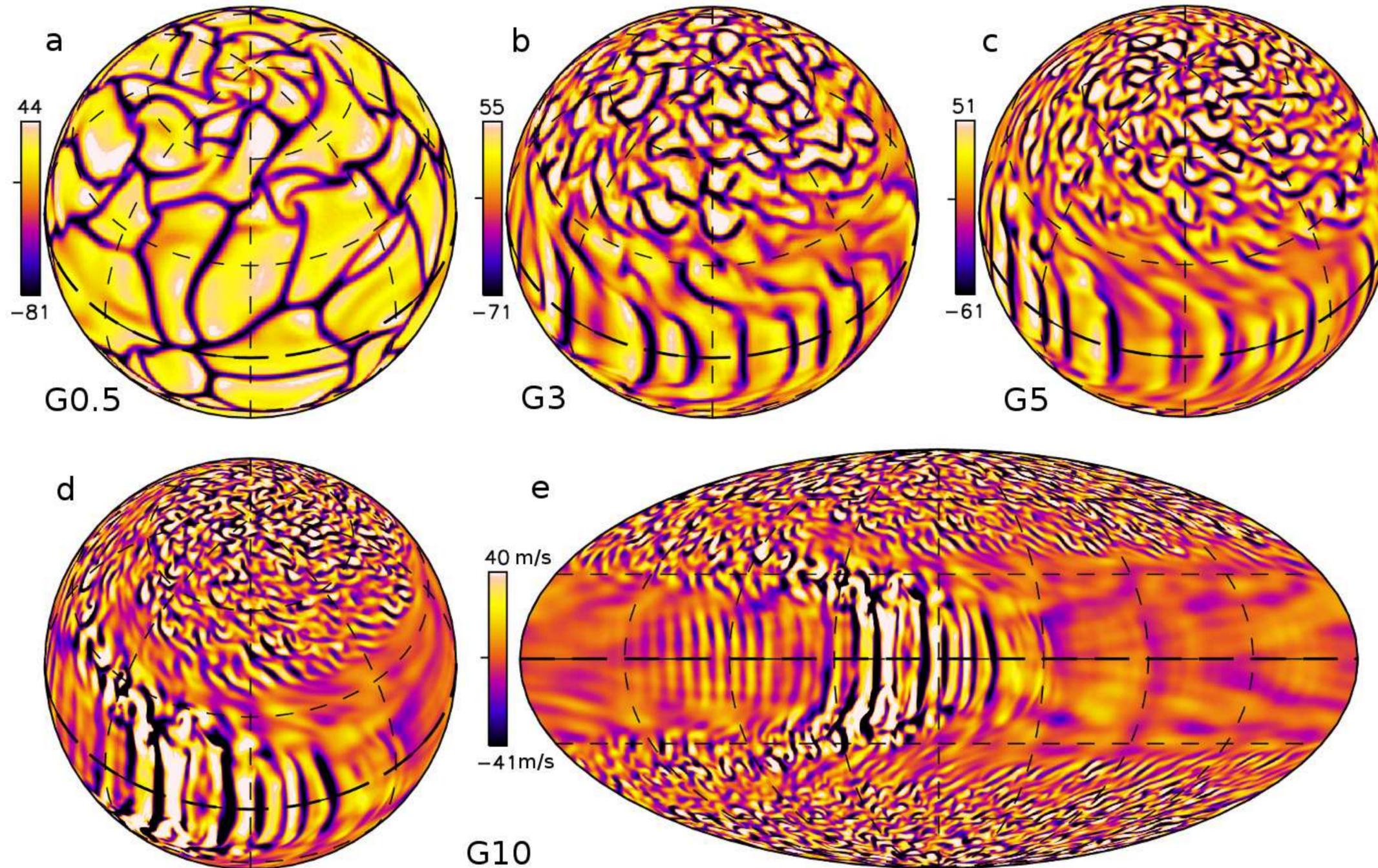
(Mike Thompson)

# *History*

- At the same time, a bunch of (at the time) grad students started studying lots of other stars.
  - Matt Browning: core convection in A-type stars, then M-dwarfs
  - Ben Brown: rapidly rotating G-type stars
  - Nick Featherstone: A-type stars with super-equipartition dynamos
  - Kyle Augustson: F-type stars, then the Sun, then O & B-type stars
  - Nick Nelson: G-type stars with fancy approaches to turbulence
  - Jerome Ballot: young solar stars with deep CZs
  - Laurene Jouve: magnetic flux ropes, babcock-leighton dynamos

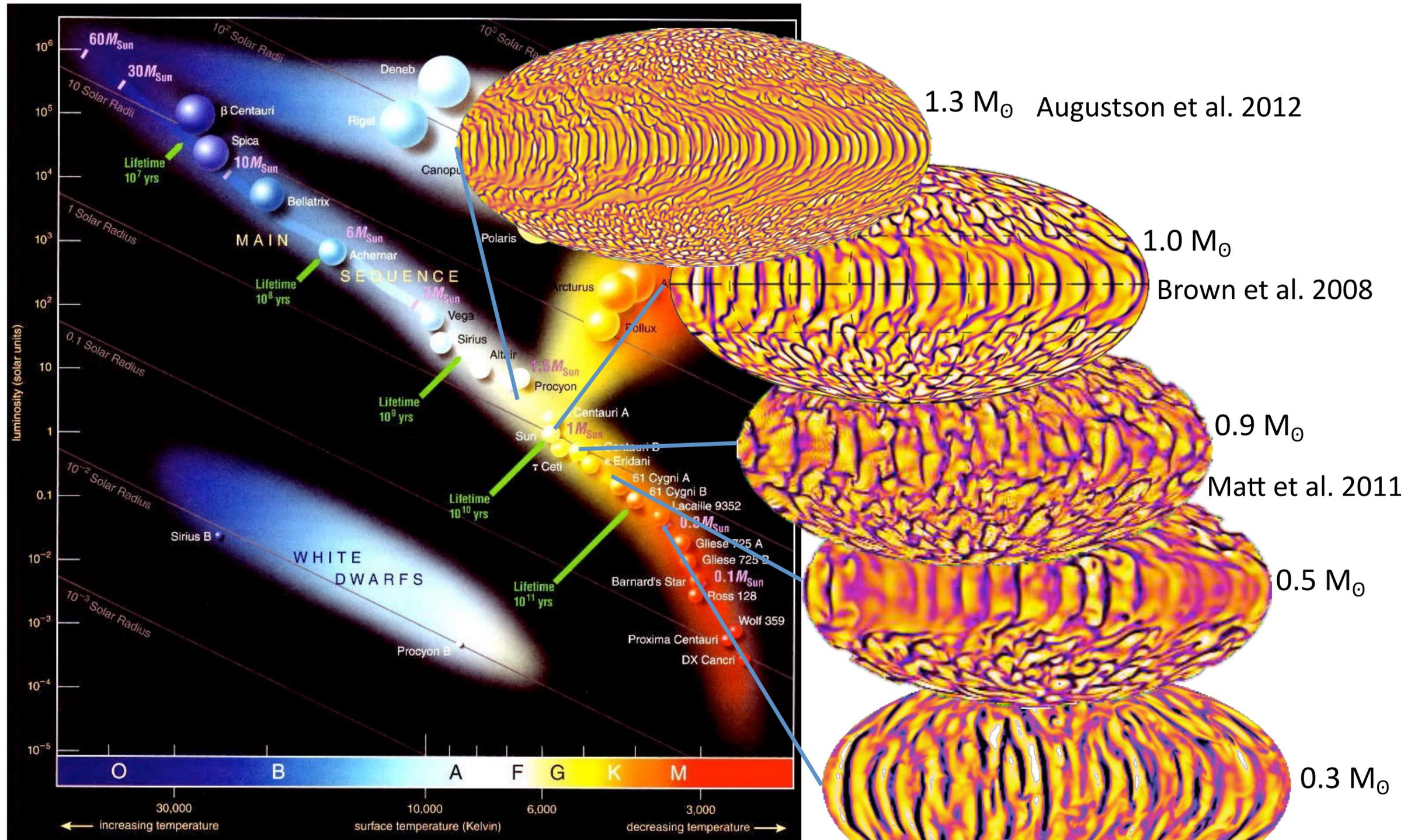
It was a bit of an industry. We learned lots of things.  
Some of those still hold true.

# Convection in G-type stars



(Brown et al. 2008)

# Simulating the Main-Sequence

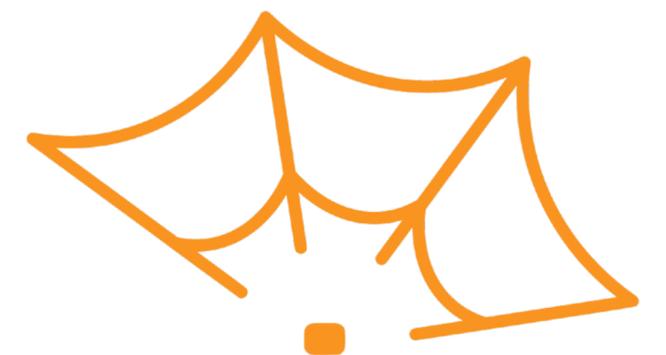


# More history

**TCAN meeting  
October 2013**

**Skyhouse,  
San Luis Obispo**

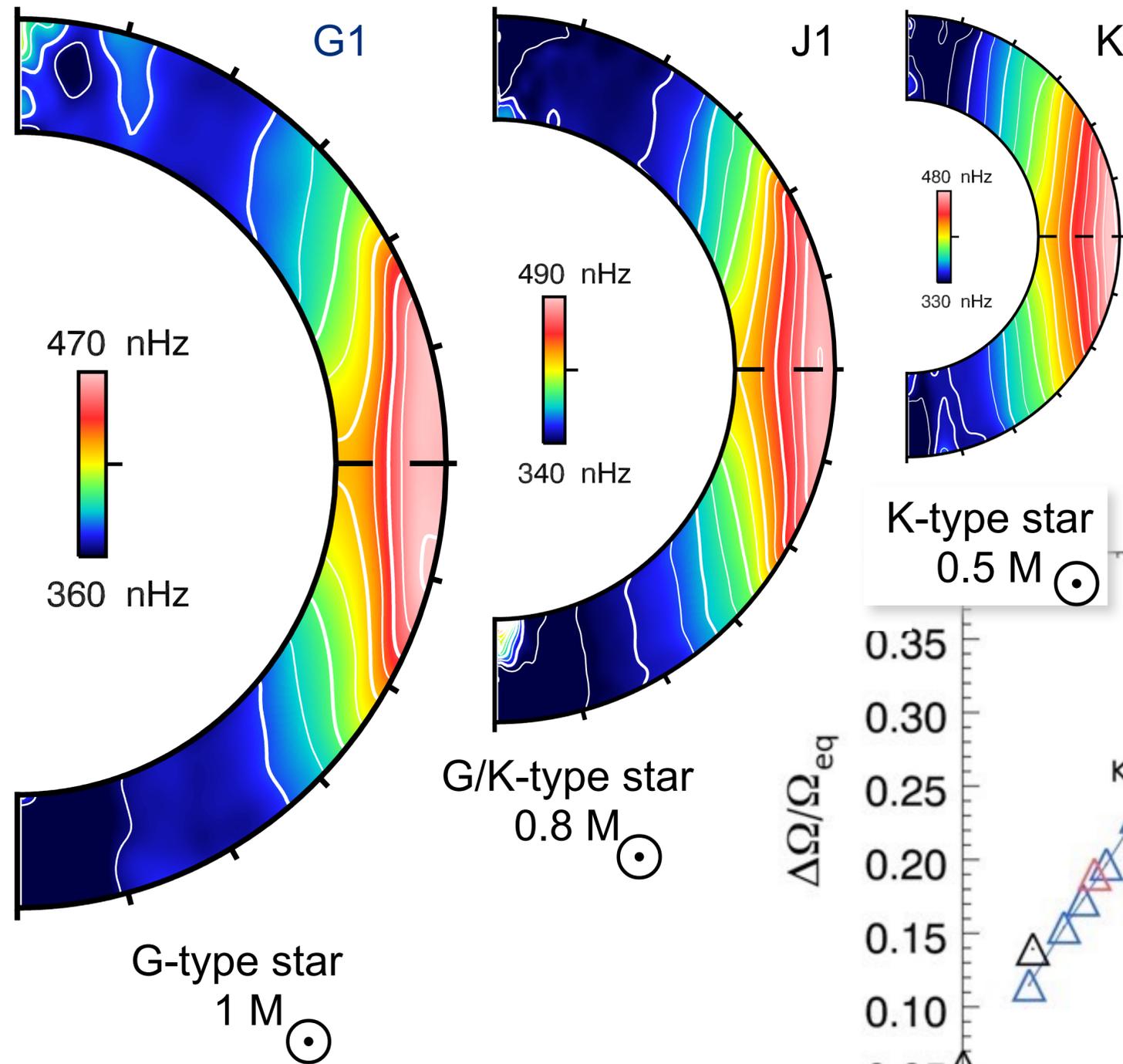
**Ben waving arms,  
Matteo taking photo,  
Morro Rock in  
background**



**SPIDER**

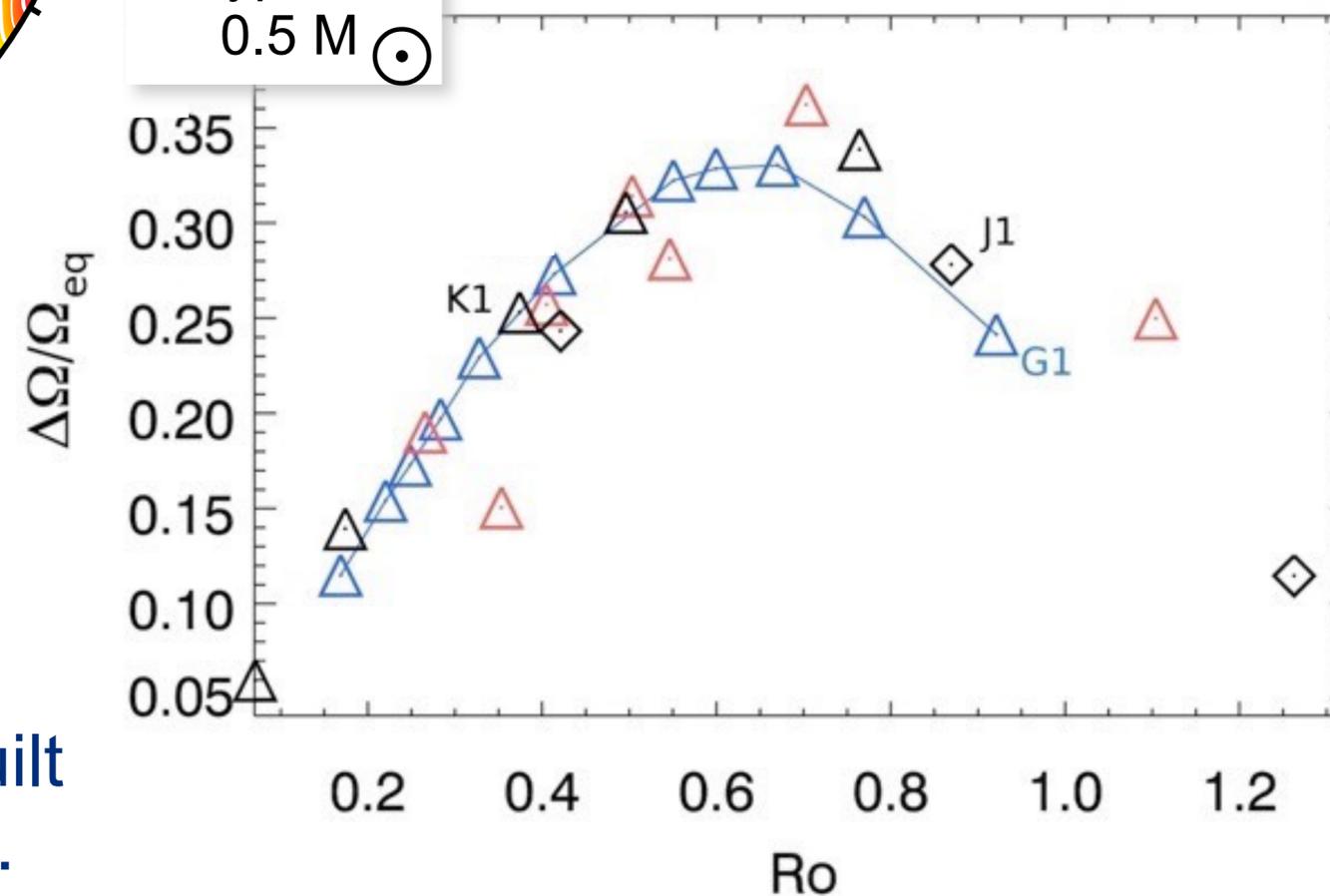


# Differential Rotation in Other Stars



These models were attempting to be different stars, and to do it with “no free parameters” by using stellar structures, observed rotation rates, etc.

Rossby scaling

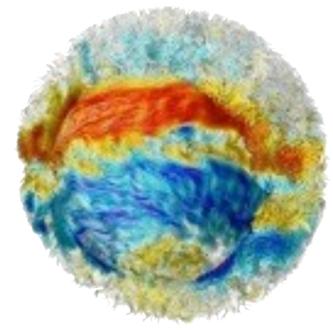


Stars of different masses, built off MESA structure models.

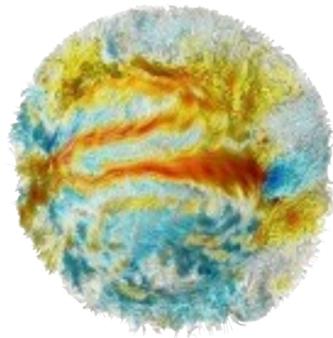
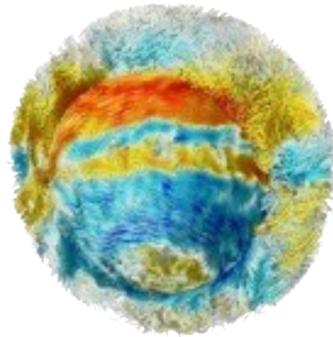
# Convection zone dynamos with reversals



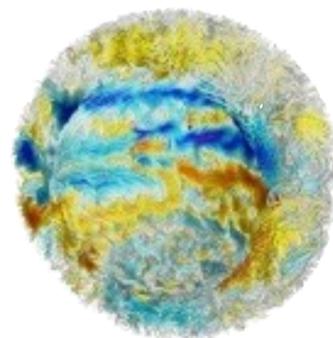
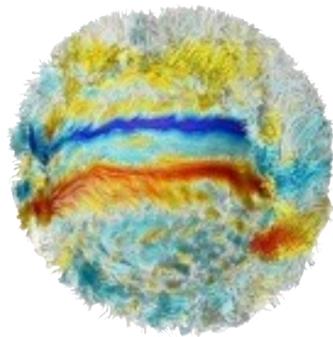
This is one of many such “solar-like” dynamos (e.g., Nelson et al 2013, Augustson et al 2014)



Shortly before



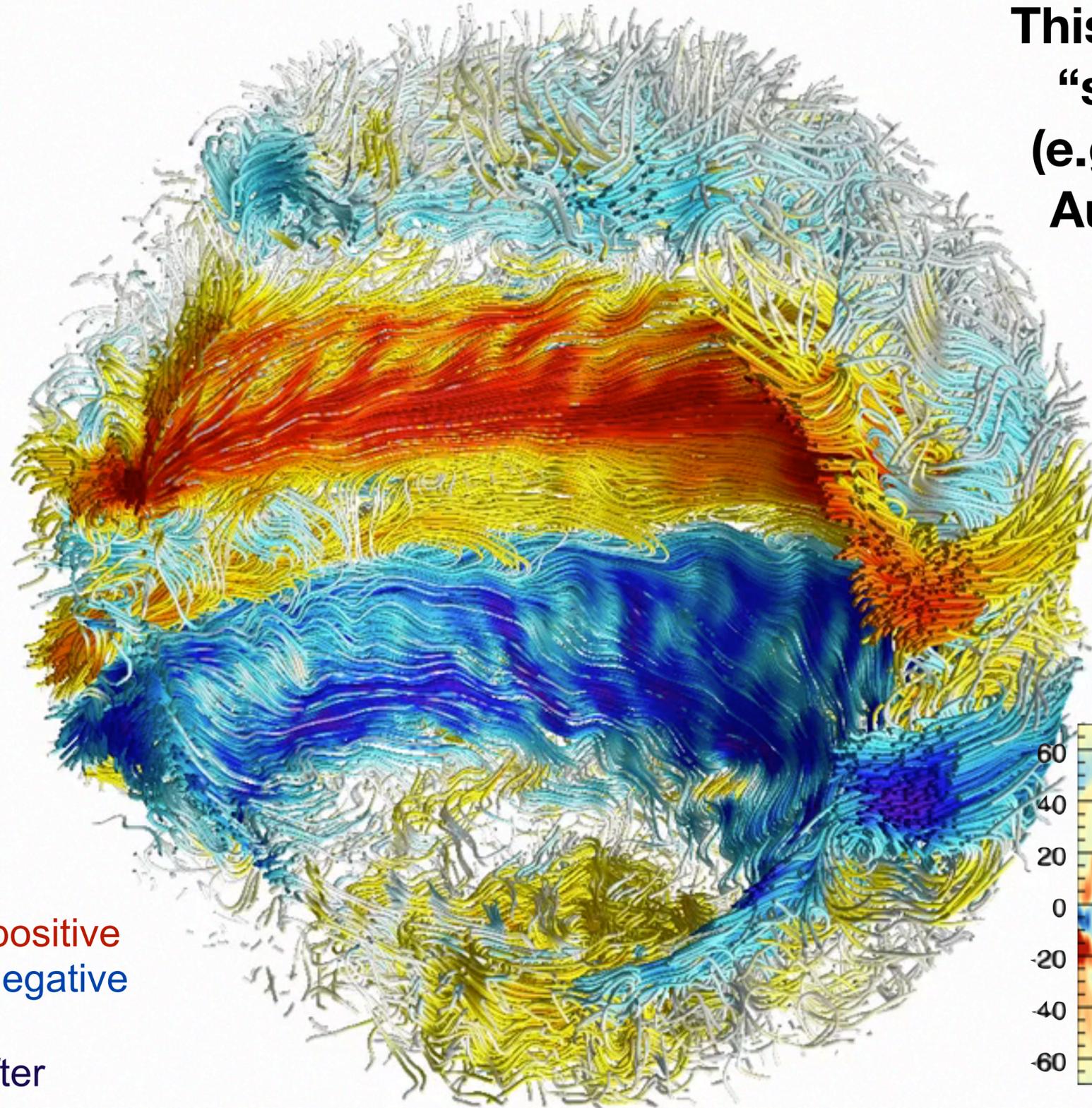
During reversal



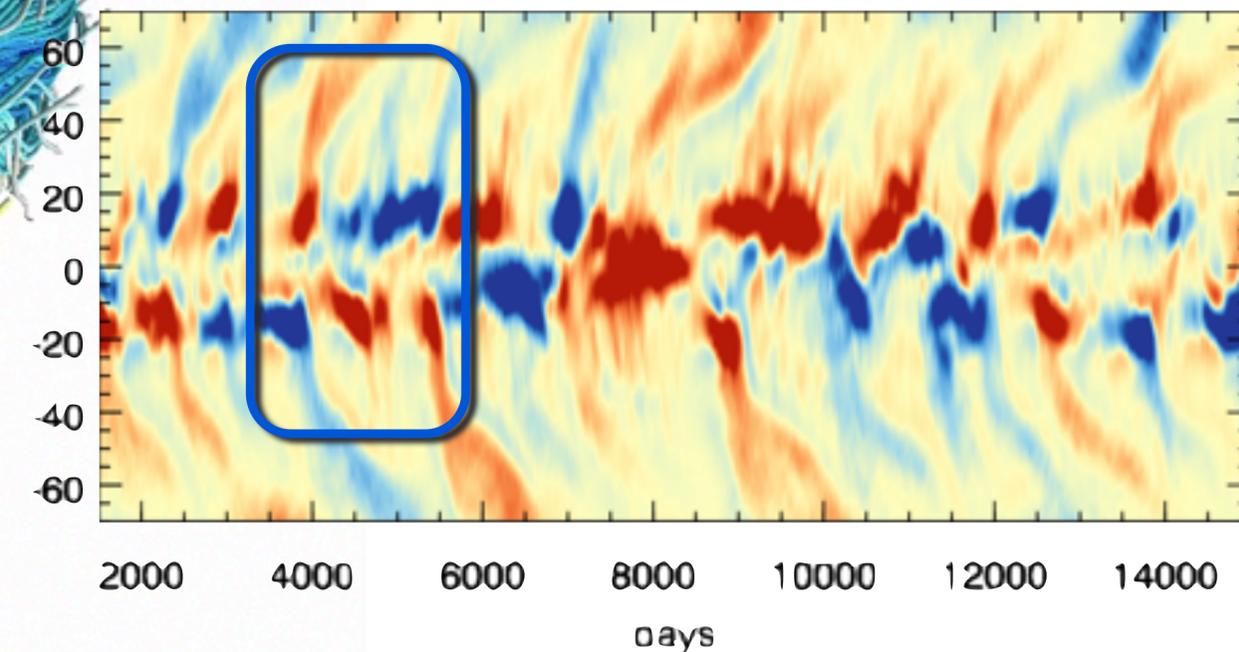
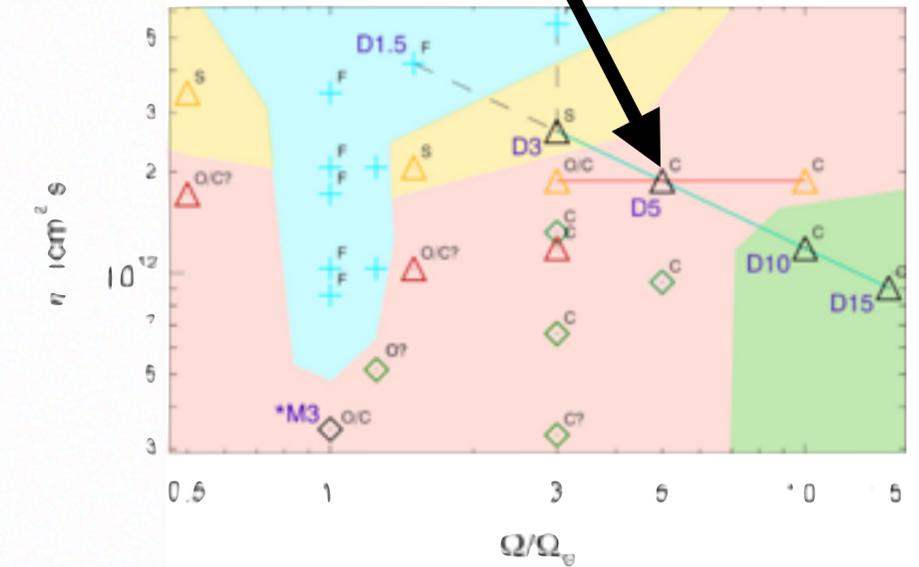
Long after

(Brown et al. 2011)

positive  
negative



$Ro \sim 0.25$

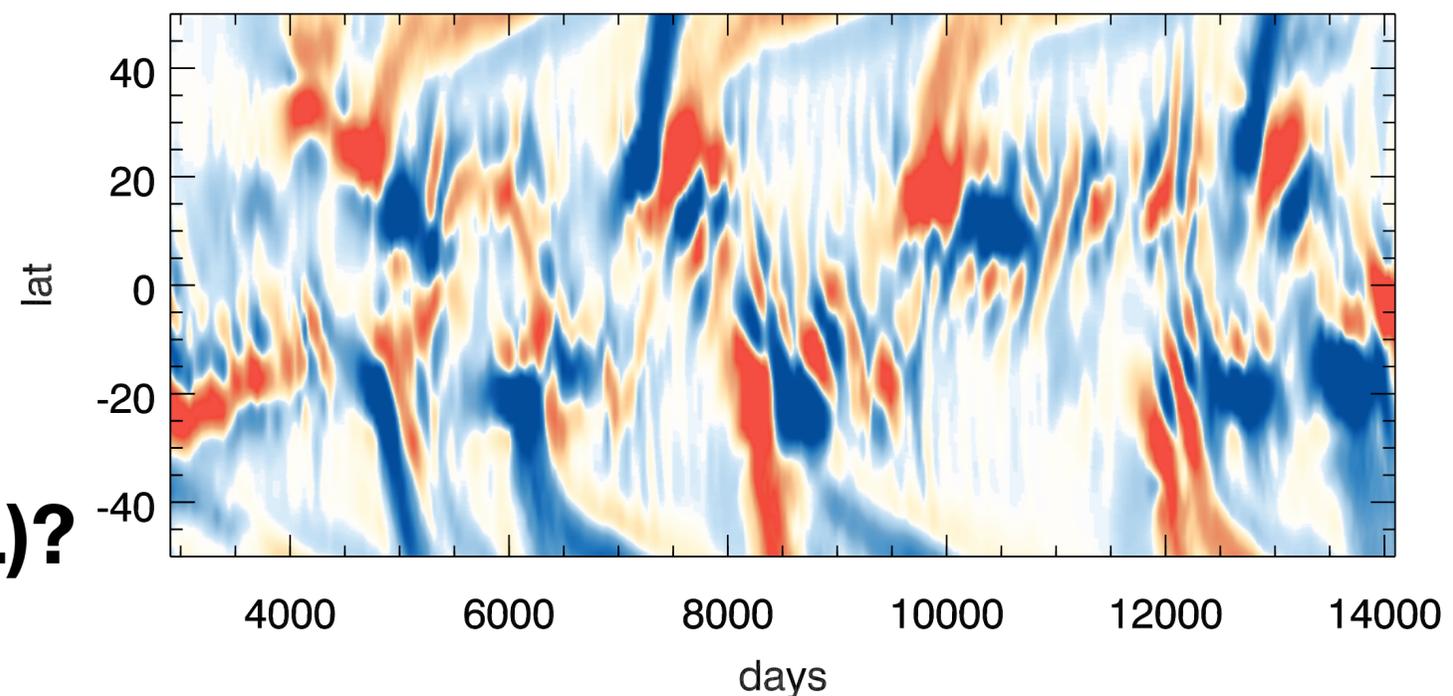
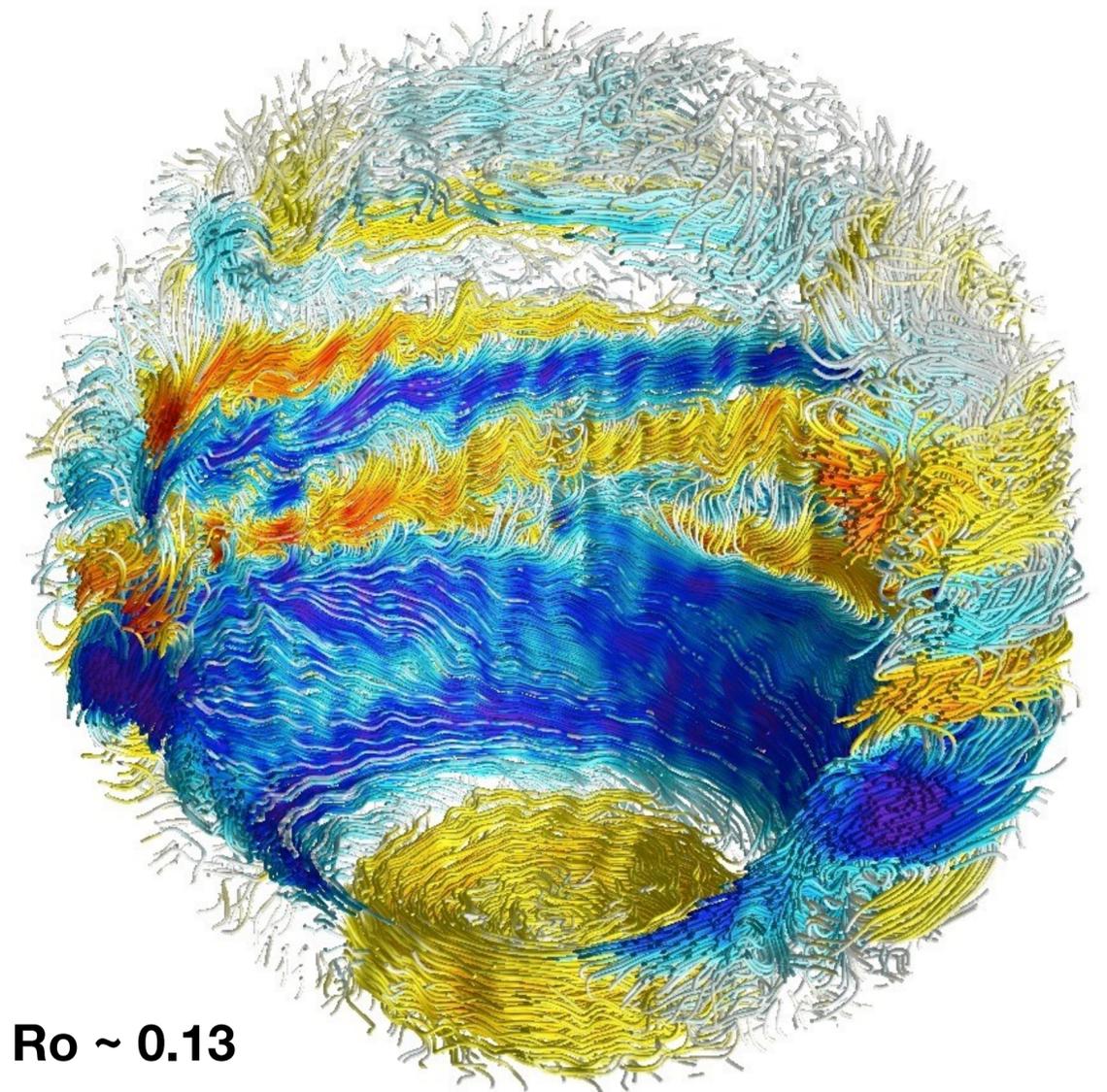


# Lower Rossby numbers leads to hemispheric states

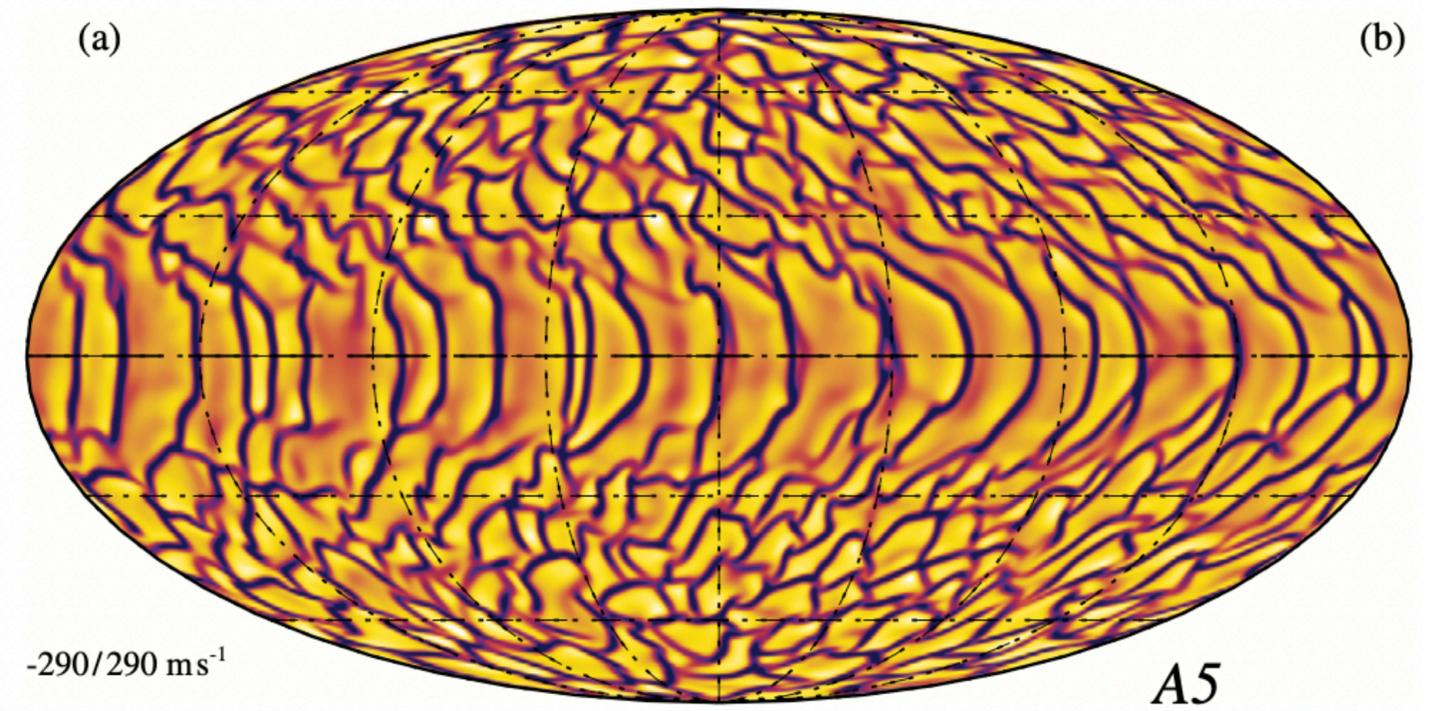
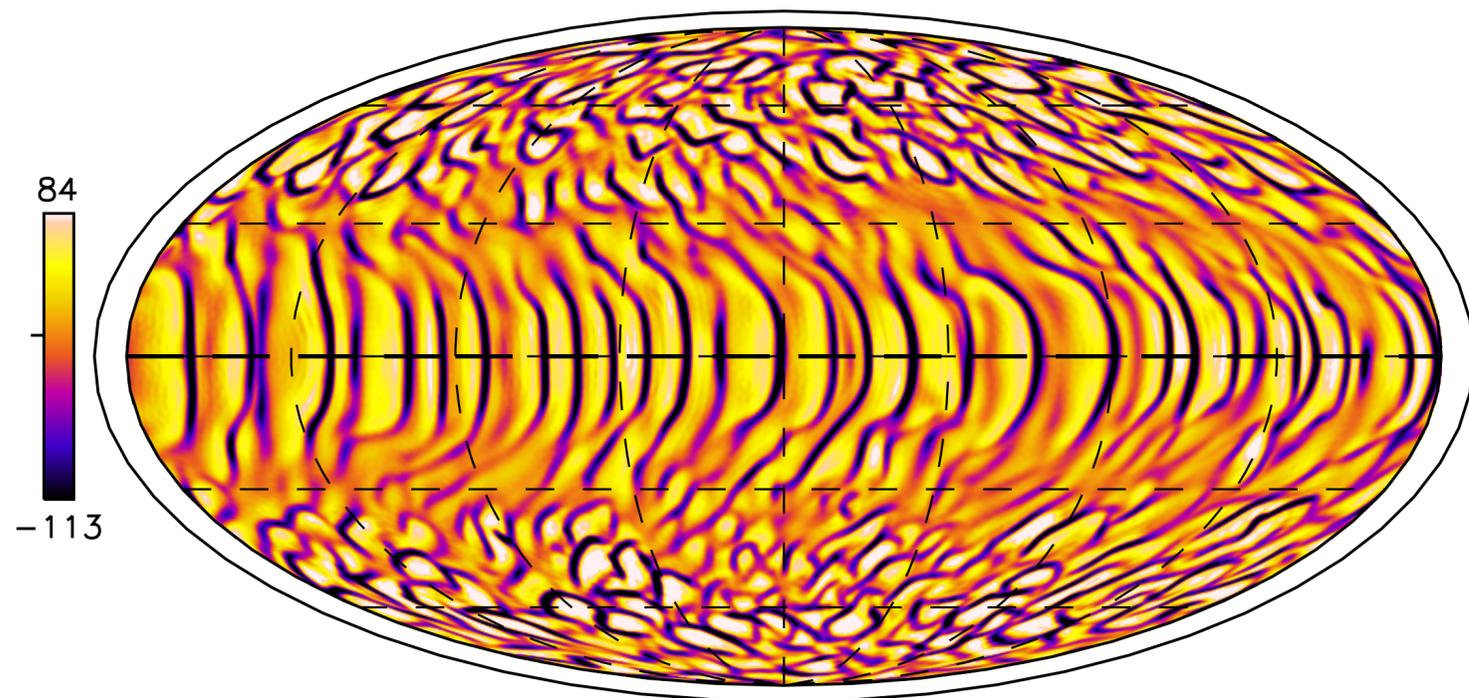
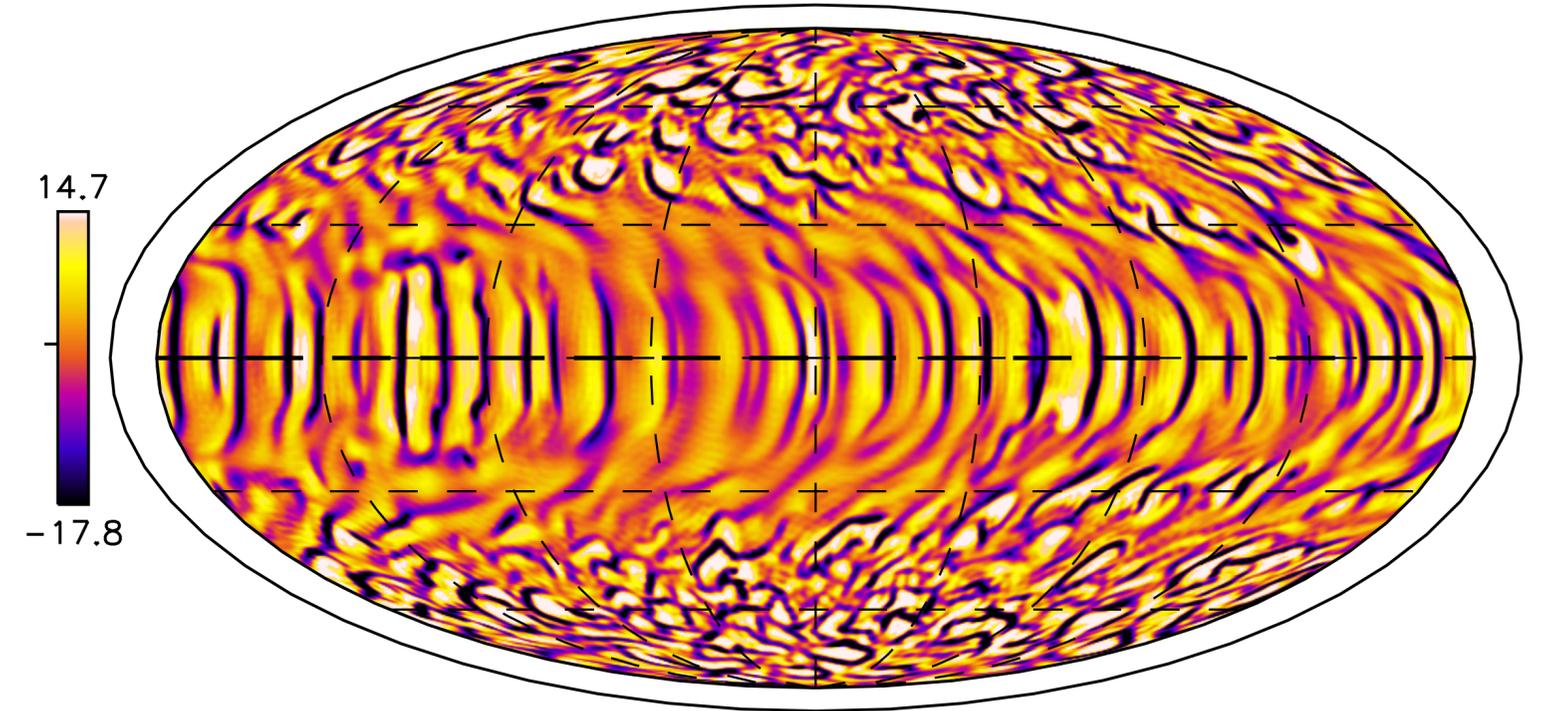
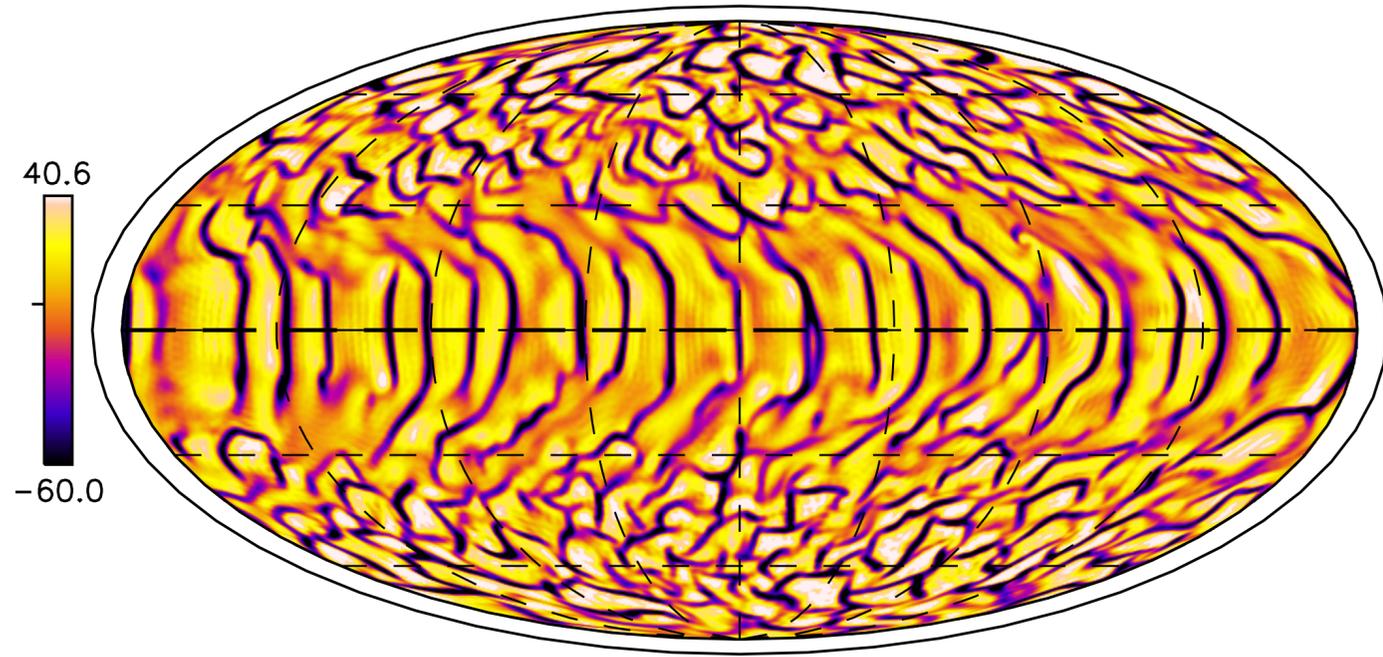
In shell-dynamos, we find globally-organized magnetic fields (and reversals) in lots of simulations that are at low values of the Rossby number. With or without tachoclines\*.

This leaves a few very interesting questions:

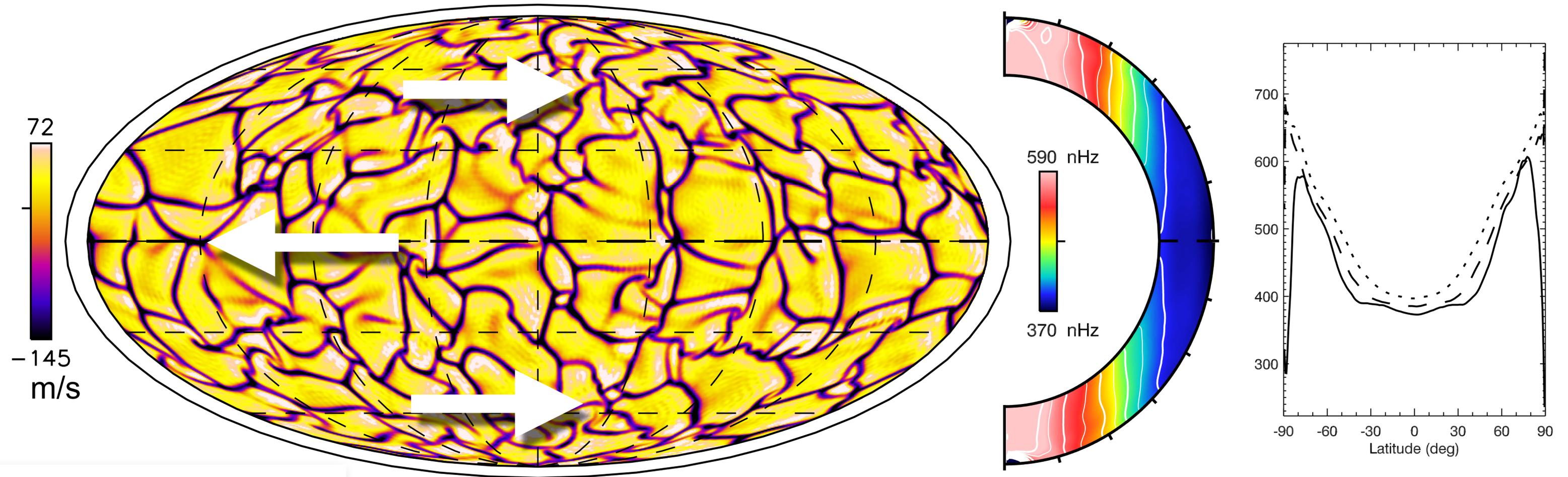
- 1) what's the Rossby number of the Sun?
- 2) What do you get if you really get rid of the tachocline\*?
- 3) If the tachocline isn't doing anything, what about the other shear layer (NSSL)?



# Wait... are these actually different stars?

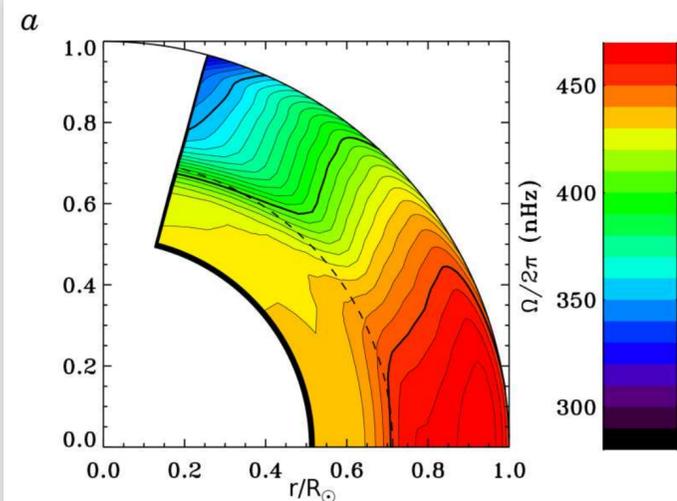


# *Back at the Sun: The problem of Anti-Solar DR*

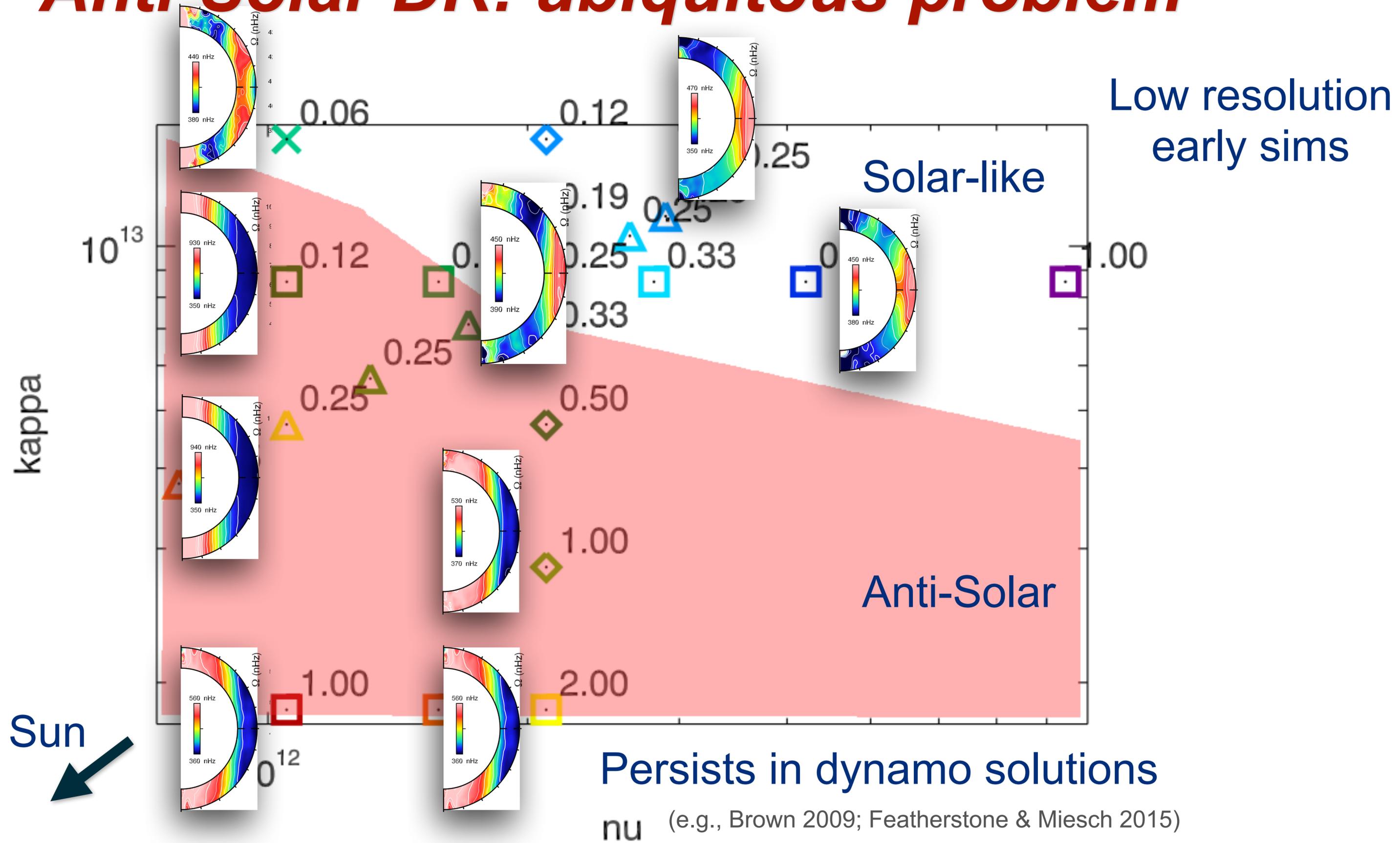


Here a convective ASH sim at solar parameters (solar luminosity, solar rotation rate, etc.) has distinct anti-solar differential rotation.

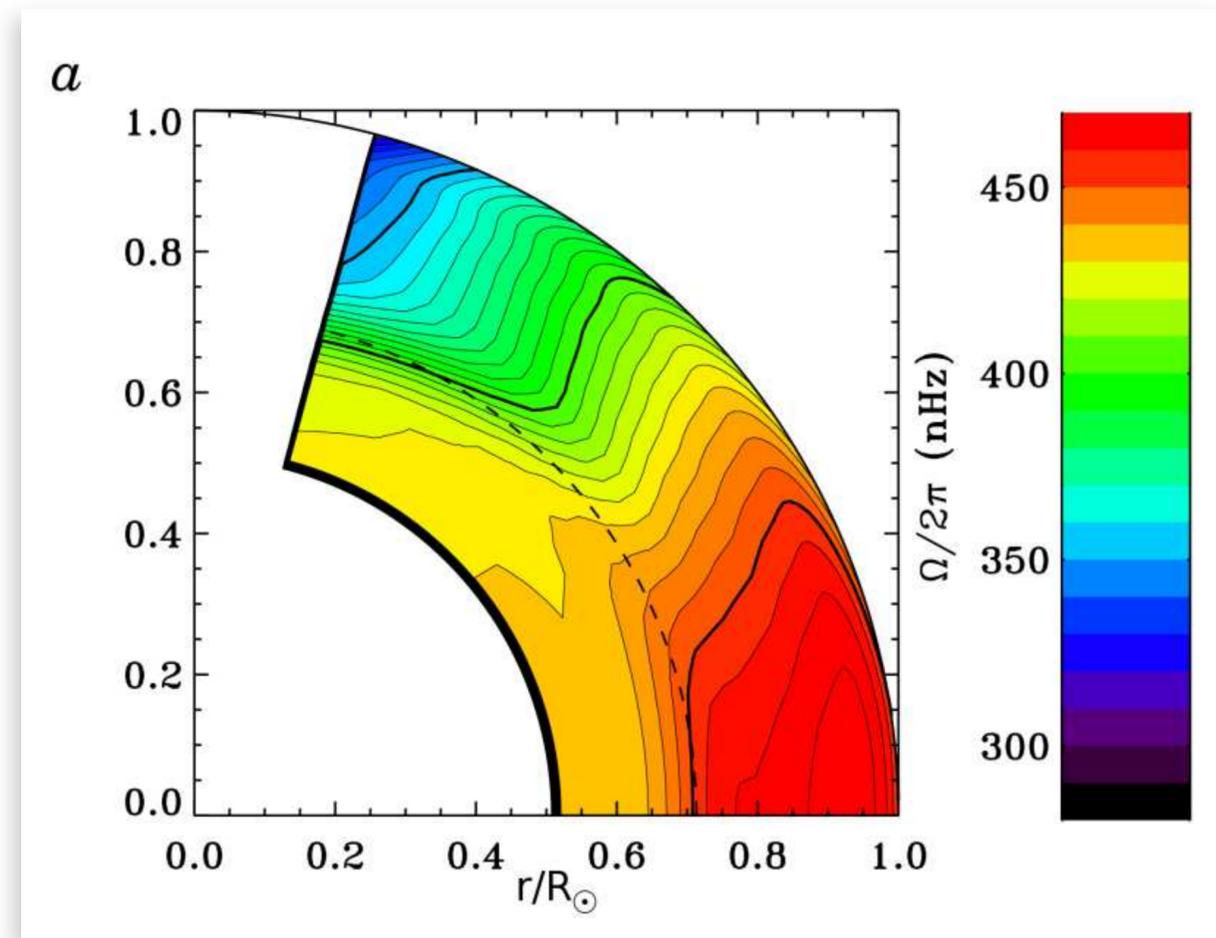
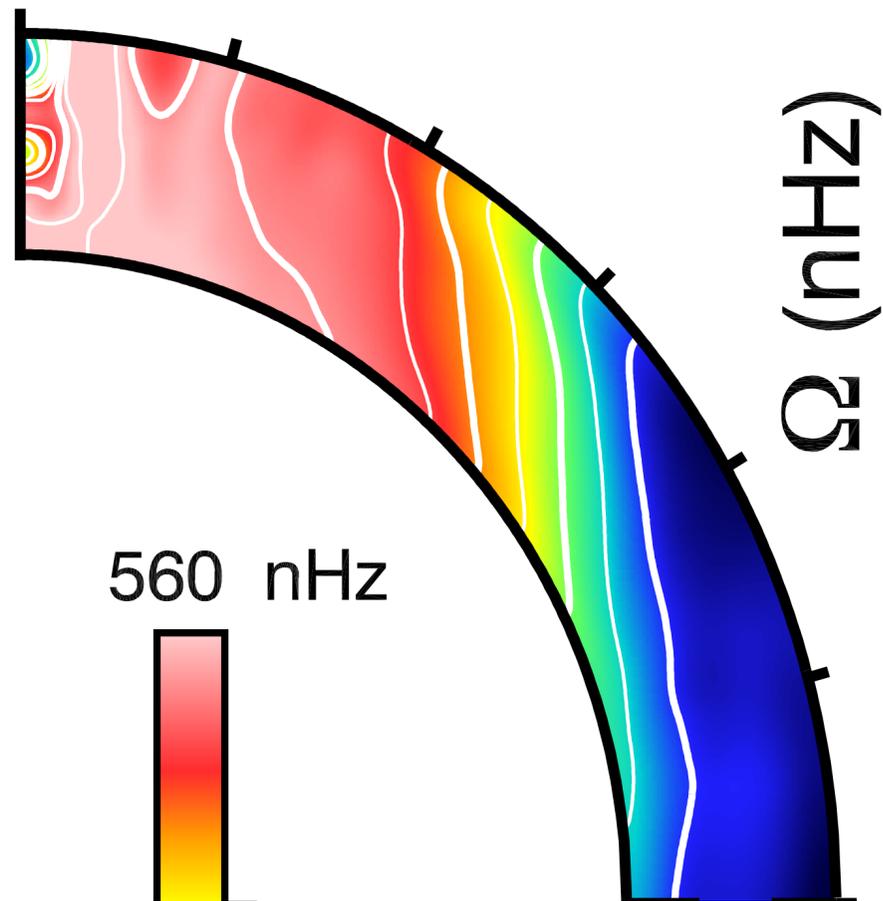
This is an extremely robust result.



# Anti-Solar DR: ubiquitous problem



# *When we learned we had a problem*



**We got real lucky here. This is an O(1) disagreement.  
You can't just sweep this under the rug.**

**Our problem is that we thought we were simulating the Sun.  
But we weren't. We got the non-dimensional parameters wrong.**

**So what can we do?**

**Simulations are a thing unto themselves.**

**At their best, they test our ideas, make us stop and think, and suggest new experiments or ways things work.**

# Studies of fundamental physical processes CU students or postdocs

- Heat transport in fully compressible, stratified convection behaves like well-studied Rayleigh-Bénard (incompressible) convection.

Anders & Brown 2017, “Convective heat transport in stratified atmospheres at low and high Mach number”, PRF

- Disequilibrium chemical transport in planetary tropospheres can be described by a simple model; it’s not mixing-length theory.

Bordwell, Brown & Oishi 2018, “Convective Dynamics and Disequilibrium Chemistry in the Atmospheres of Giant Planets and Brown Dwarfs”, ApJ

- Rotating convection experiments have a simple control parameter; it’s not what we expected it to be.

Anders, Manduca, Brown, Oishi & Vasil 2019, “Predicting the Rossby number in convective experiments”, ApJ

- By understanding your system well, you can accelerate slow processes (like thermal evolution). Doing so matters, in surprising ways.

Anders, Brown & Oishi 2018, “Accelerated evolution of convective simulations”, PRF

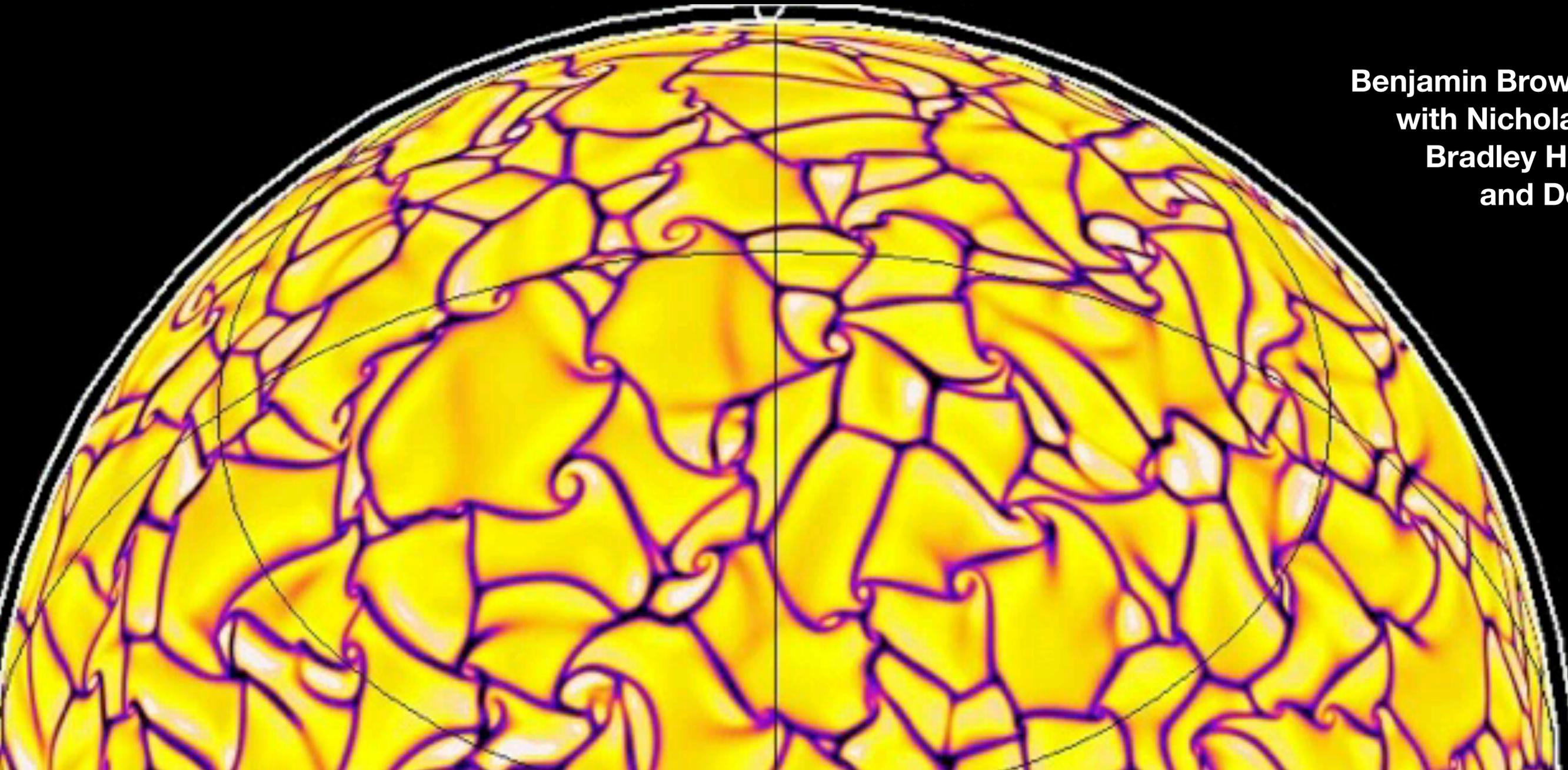
Anders, Vasil, Brown & Korre 2020, “Convective dynamics with mixed temperature boundary conditions: why thermal relaxation matters and how to accelerate it ”, PRF

- Plumes from the solar photosphere *might* make it all the way to the base of the solar convection zone. Solar entropy rain can’t be ruled out (we tried).

Anders, Brown & Lecoanet 2019, “Entropy Rain: dilution and compression of thermals in stratified domains”, ApJ

# 1. Hunting for Giant Cells at the Solar Poles

**Benjamin Brown (University of Colorado),  
with Nicholas Featherstone (SwRI),  
Bradley Hindman (U Colorado),  
and Derek Lamb (SwRI)**



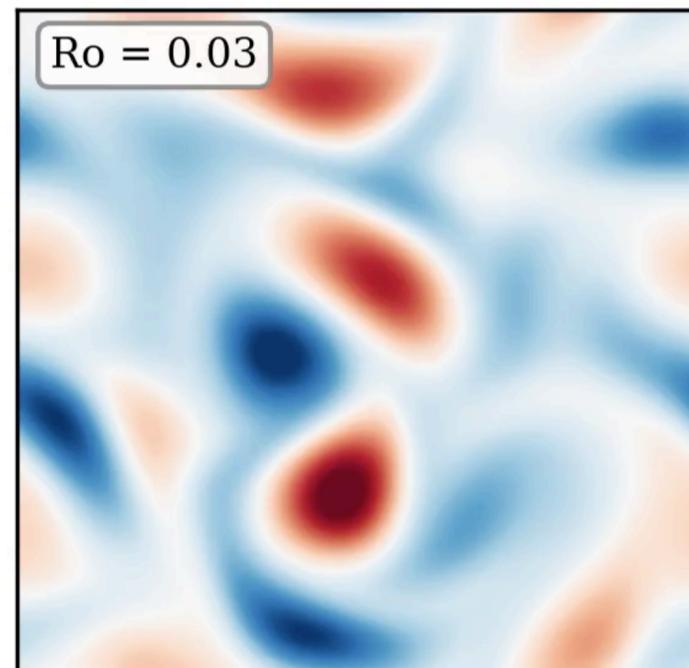
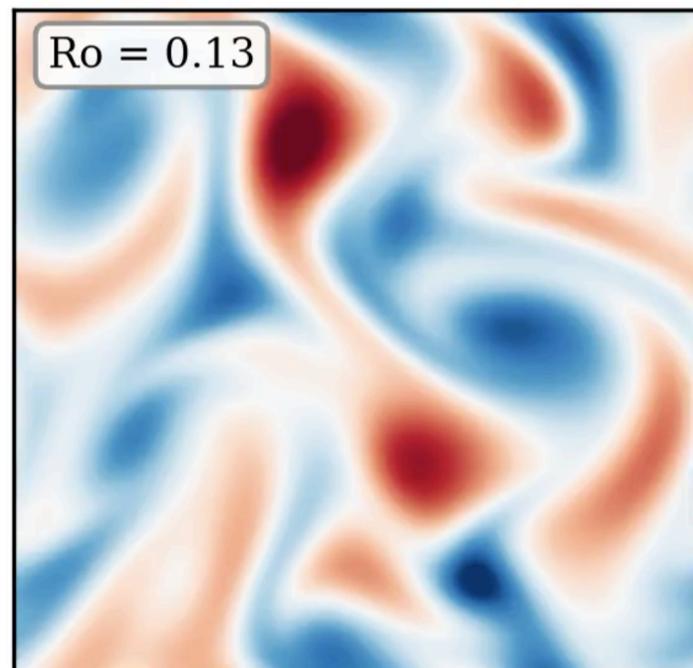
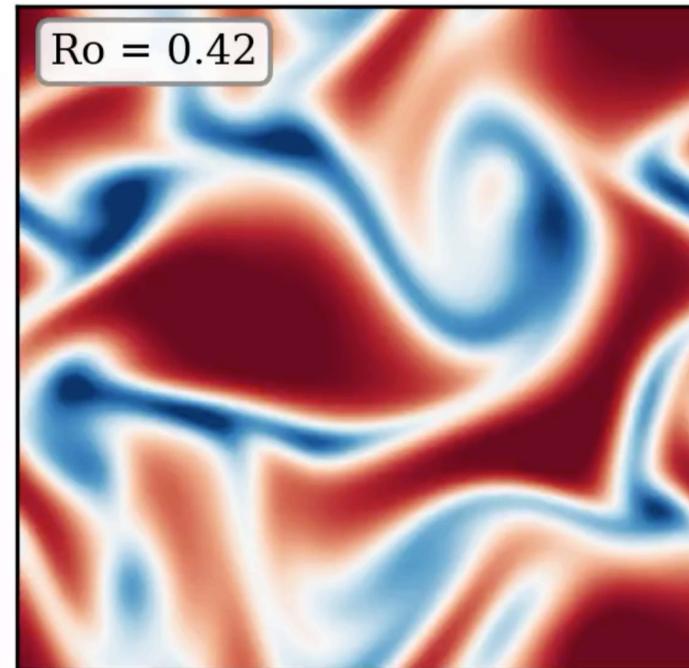
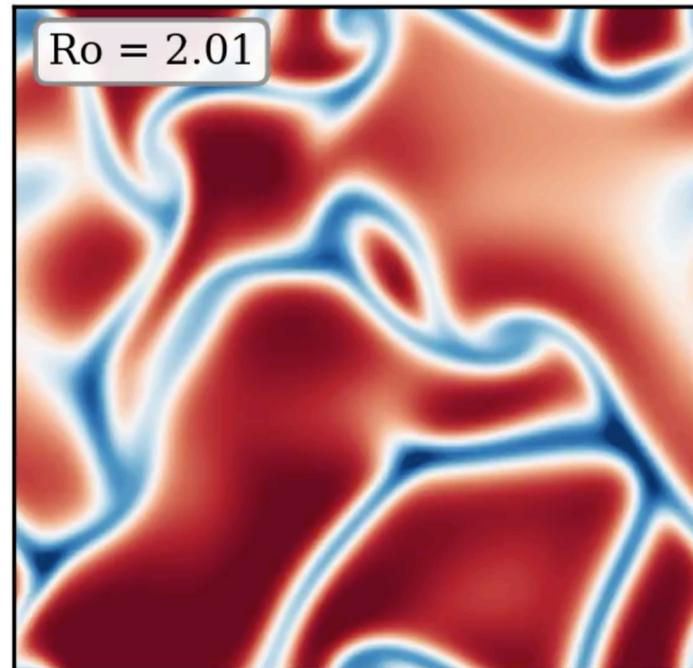
# What's missing?

Slow rotation

Low Entropy (cold)



High Entropy (hot)

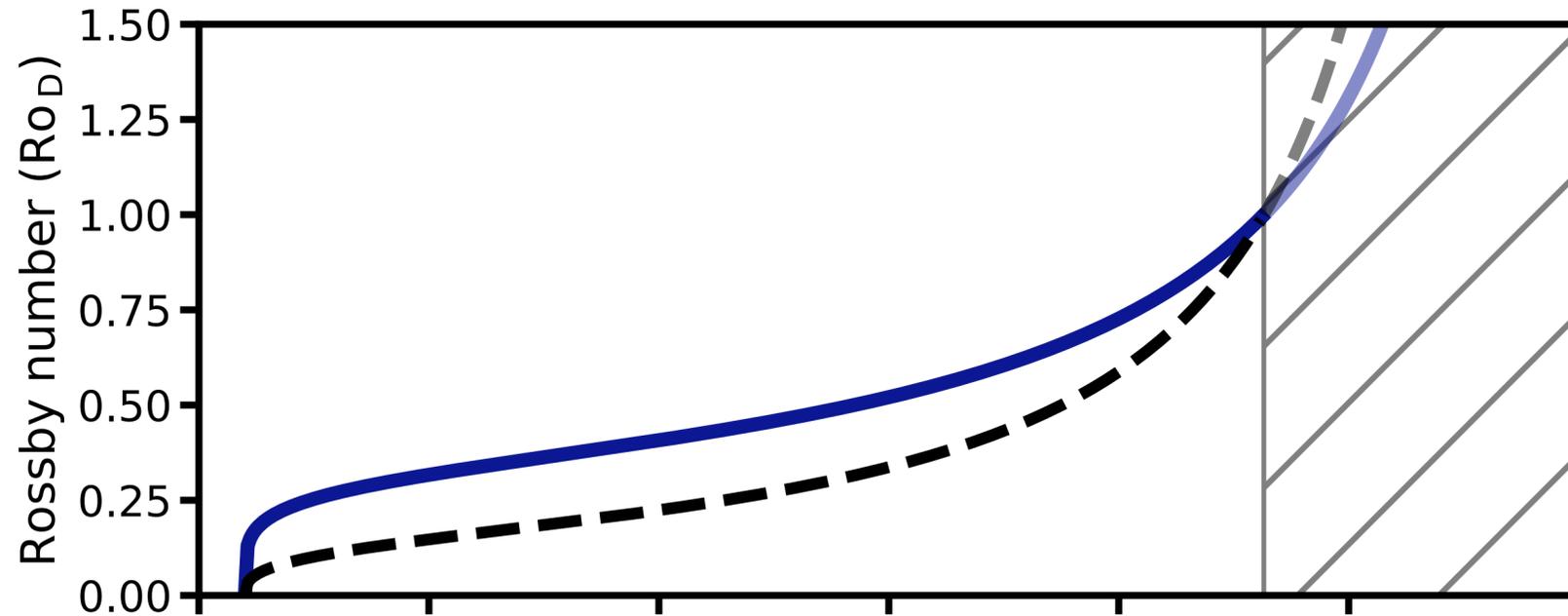


**Rotation leads to fundamental changes in convective structures. They become columnar, and swirl, rather than spreading (diverging).**

**Fast rotation**

(Anders et al 2019 ApJ: stratified, local models of rotating convection)

# Importance of rotation



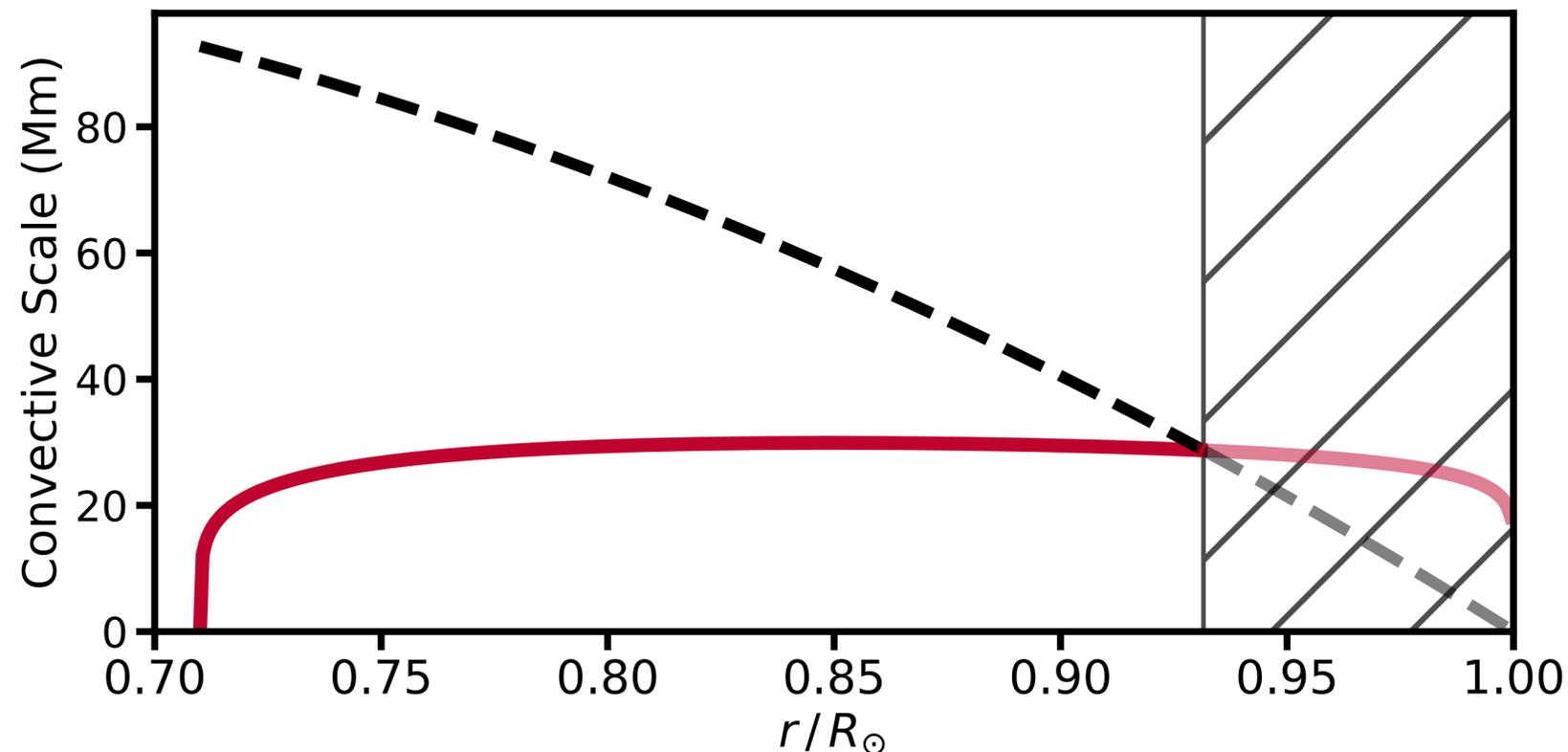
Best current estimates of solar interior dynamics (MLT w/ correct rotation)

Rossby is similar to “normal” versions of MLT and small below the NSSL

But length scales are much smaller. Closer to 30 Mm than 100's of Mm

Base of CZ

near surface

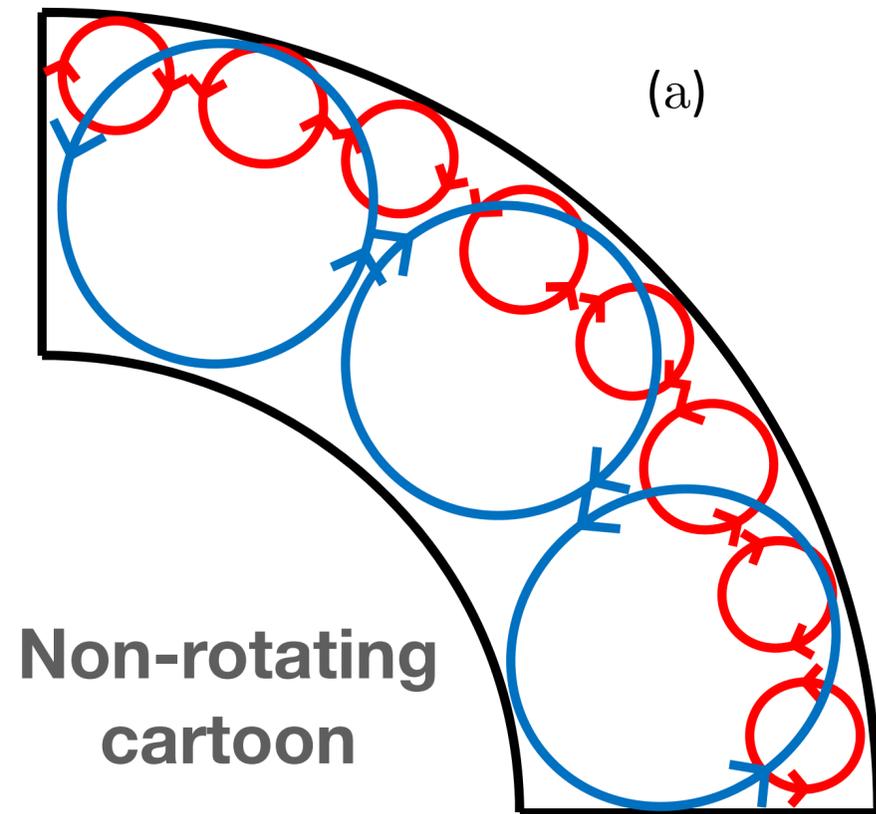


(Vasil, Julien & Featherstone 2021 PNAS)

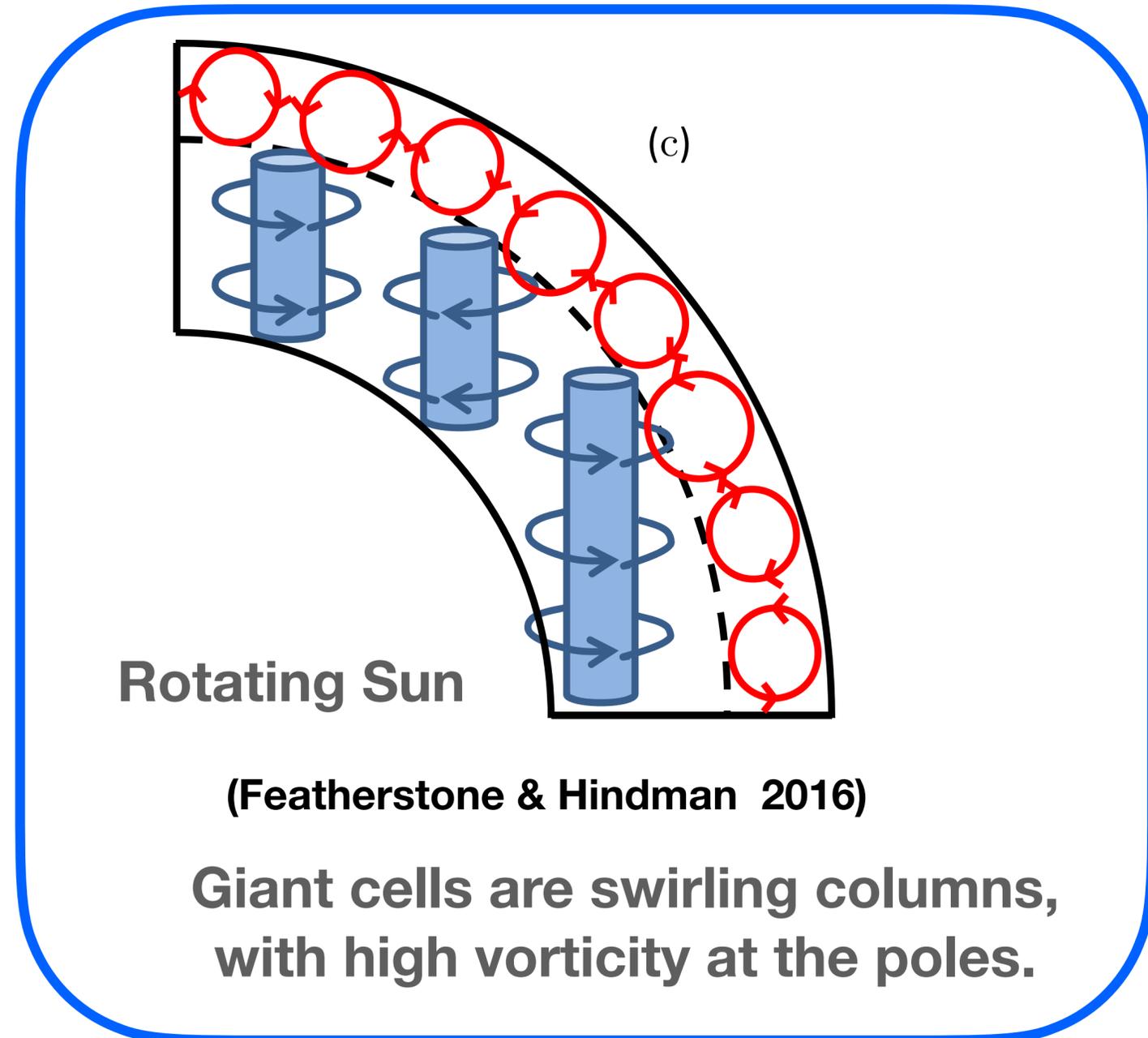
# The poles are special

## I: flow structures change at the poles

The surface noise is diverging flow (supergranules).

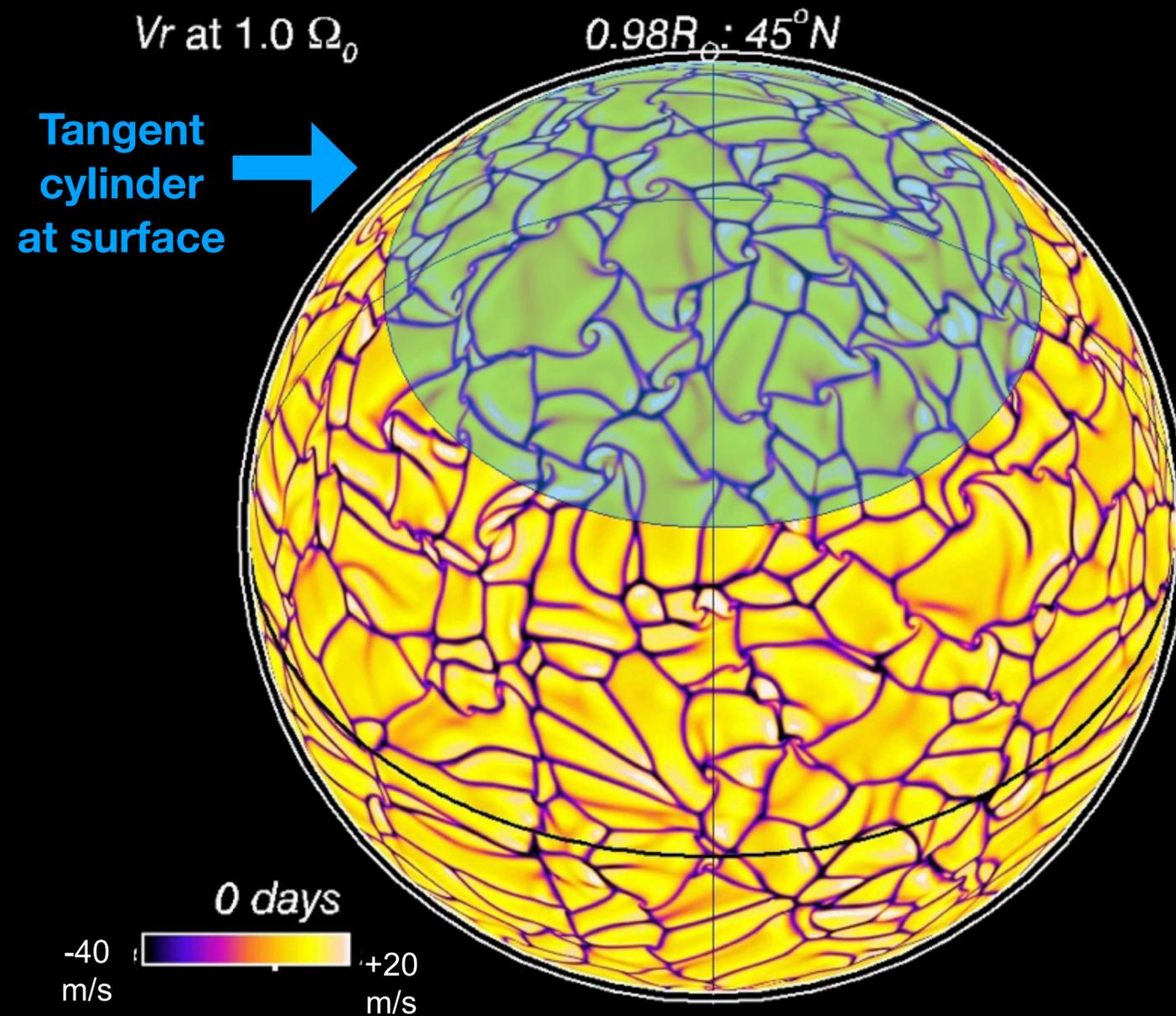


Giant cells are large spreading cells with a divergence signature that is the same everywhere.



# Hunting for Giant Cells at the Solar Poles

Benjamin Brown (University of Colorado),  
with Nicholas Featherstone (SwRI),  
Bradley Hindman (U Colorado),  
and Derek Lamb (SwRI)



(based on Miesch et al. 2008)

1. Giant cells of convection have not been conclusively observed; where are they?
2. Rotating convection is surprising:
  - a) Narrow columns aligned with rotation axis, rather than big overturning cells.
  - b) Different dynamics within the tangent cylinder than equator.
3. Equatorial vantage points at IAU have trouble: objects at the equator sweep out of view every 8 days, and you never see the whole equatorial region at once.

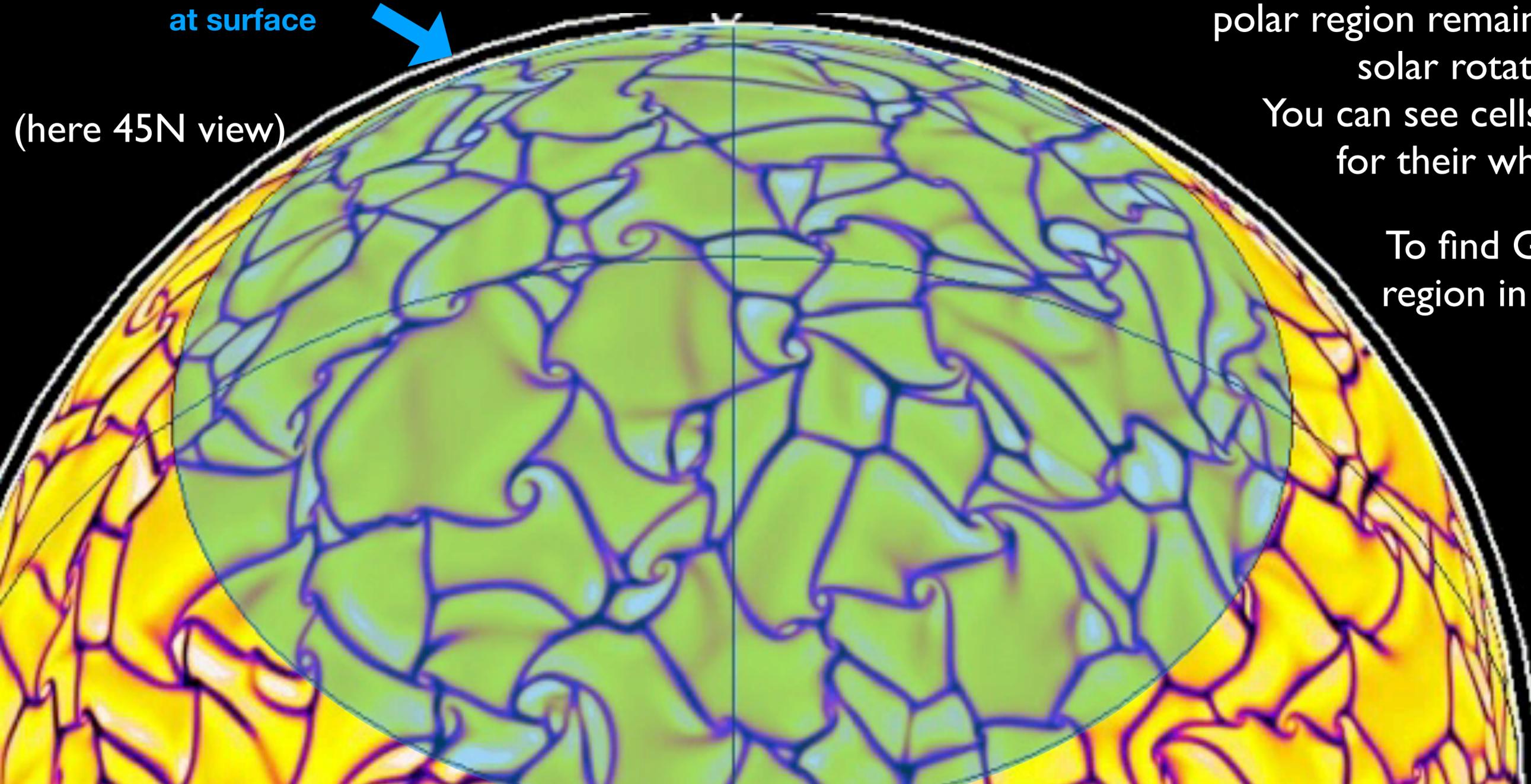
radial velocity structures  
Downflows: fast, narrow  
Upflows: slow, broad

# The poles are special: structures stay in your FOV

Tangent cylinder  
at surface



(here 45N view)



At high latitude vantage points, the whole polar region remains in view for several solar rotation periods.

You can see cells as they circulate for their whole lifetimes.

To find GC: keep the whole polar region in view for several months.

How high in latitude?

- 45N is tangent cylinder at photosphere.
- In my mind, that's a min requirement.
- Higher is much better.

(based on Miesch et al 2008)

## 2. What happens if we have no tachocline? Dynamamos in fully-convective M-dwarf stars

### What are M-dwarf stars? (Astronomer perspective)

Compared to our Sun, M-dwarf stars are:

- low mass (~0.3 solar masses)
- small (~0.1 solar radii)
- relatively cool (surface ~3500K, vs 5800K for Sun)
- often very magnetically active
- often fully convective

- the most numerous stars in the universe
- the host stars of most of the planets, and possibly most of the *habitable* planets in our universe

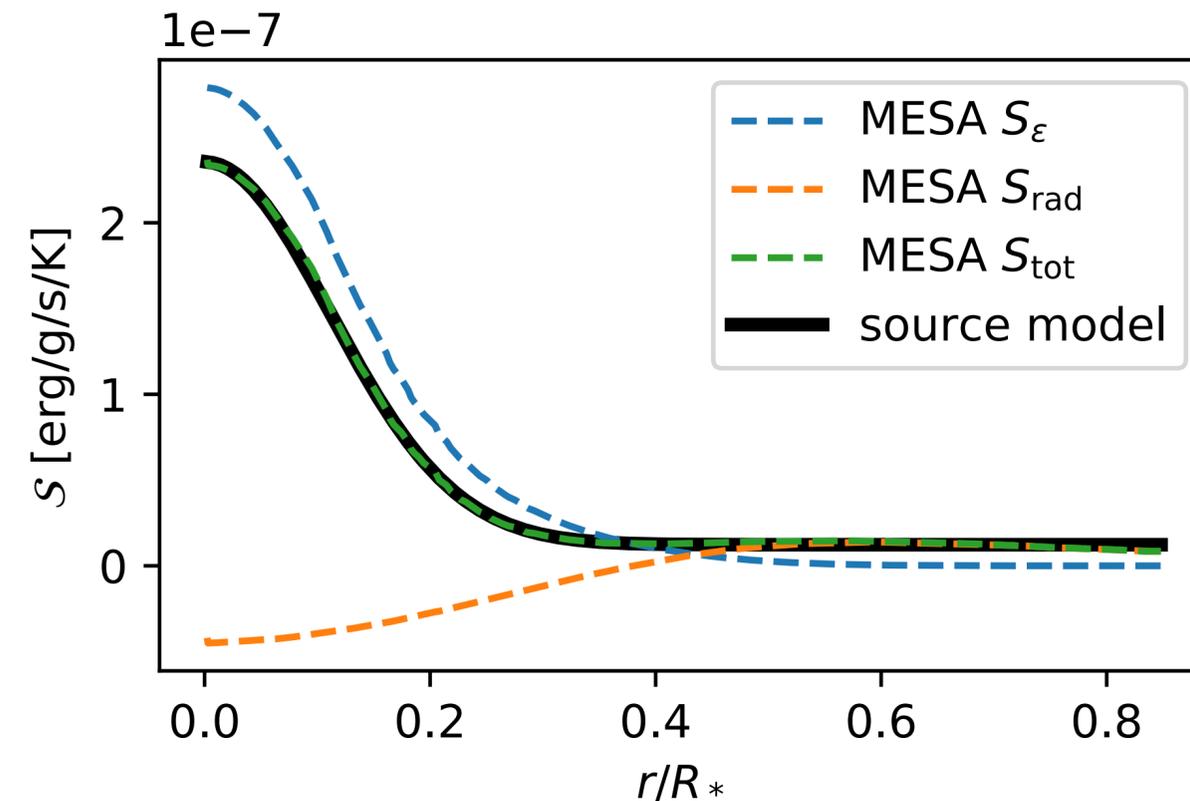
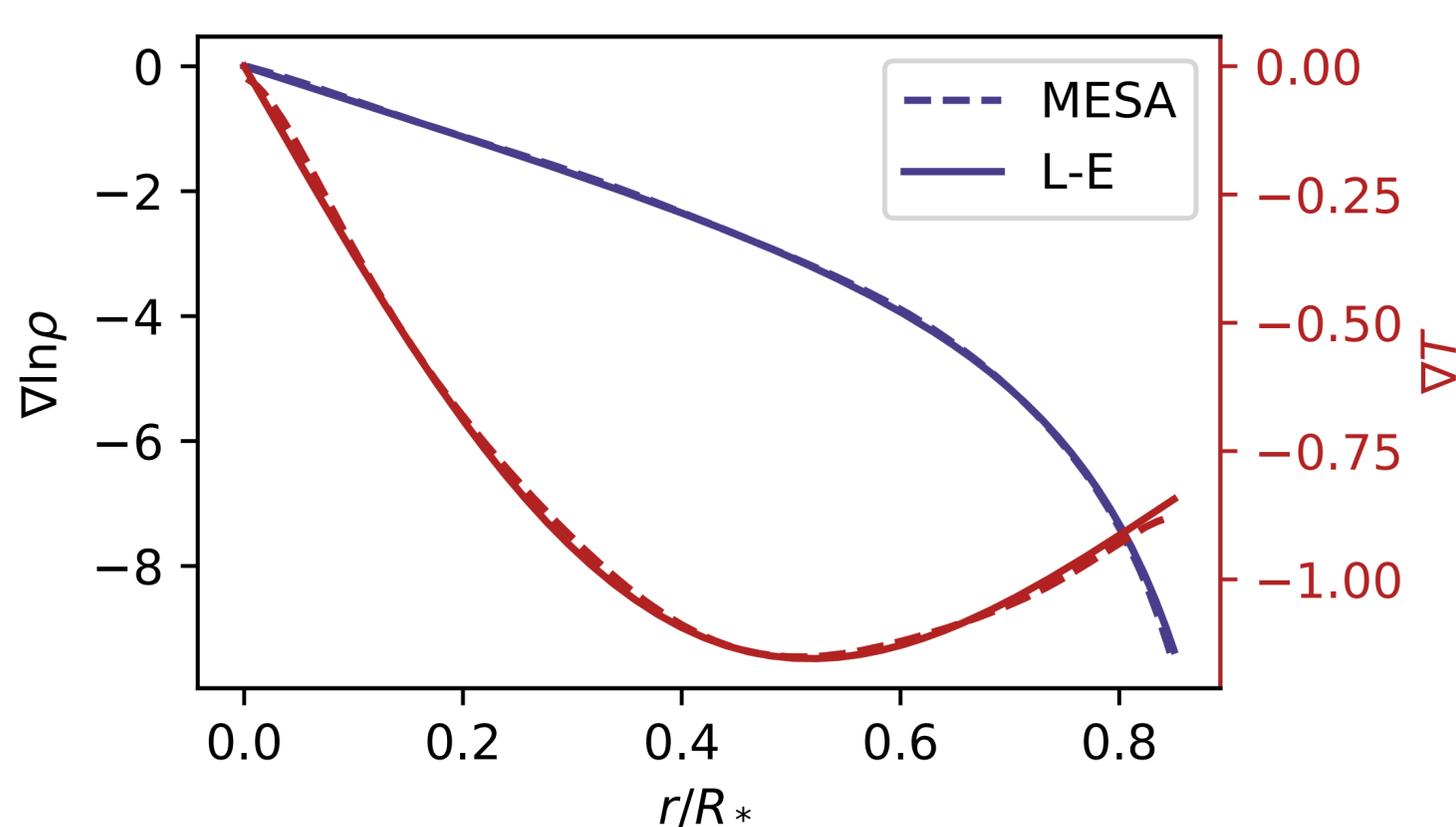


Credit: NASA's Goddard Space Flight Center/S. Wiessinger

“Powerful flare detected on M-dwarf star”

<https://phys.org/news/2018-04-powerful-flare-m-dwarf-star.html>

# What makes an M-dwarf? (Fluids perspective)



Low-Mach, fully convective objects with non-constant coefficients.

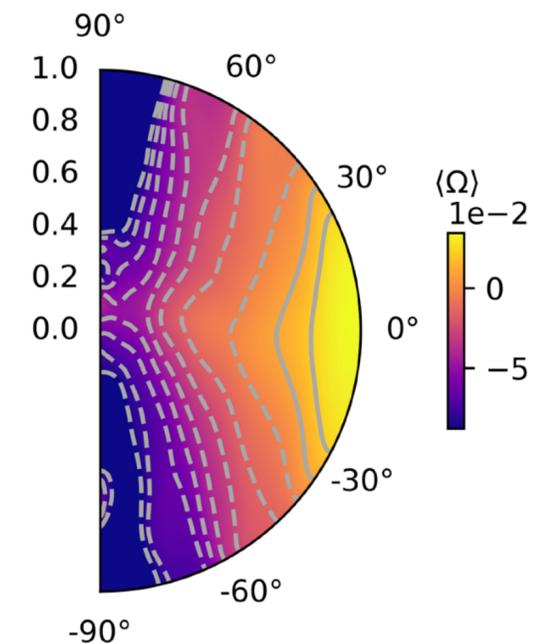
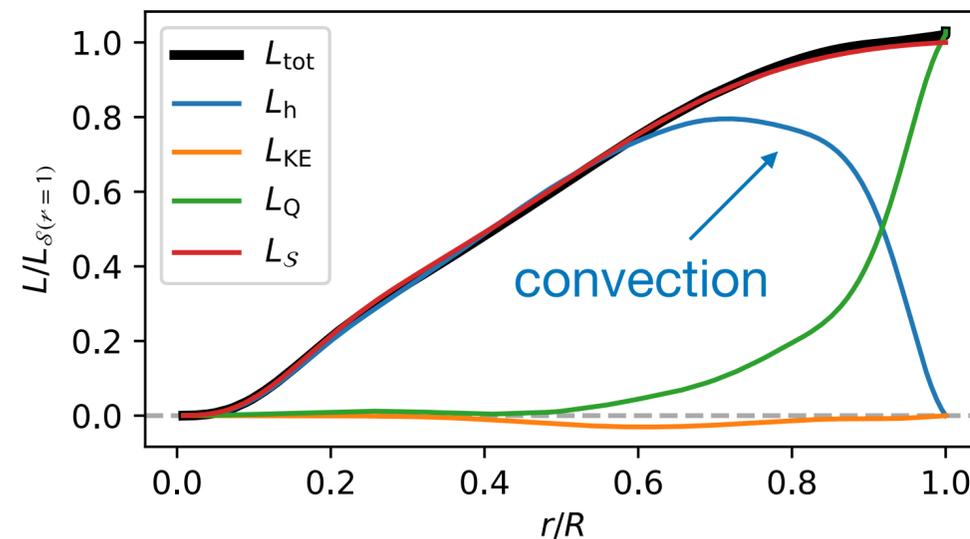
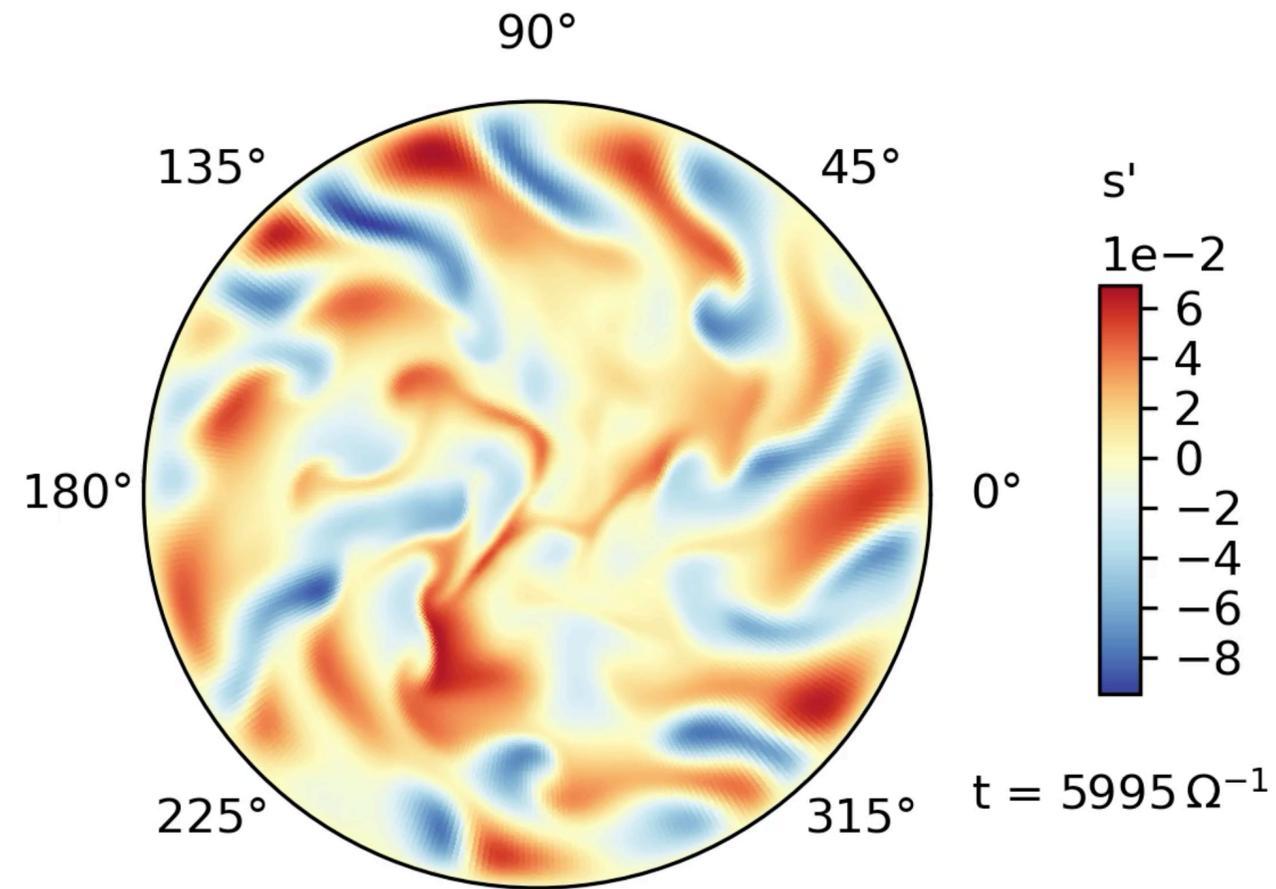
**Density stratification** — Lane-Emden solution

**variable gravity** — Lane-Emden solution

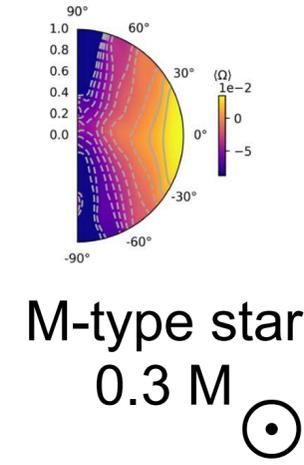
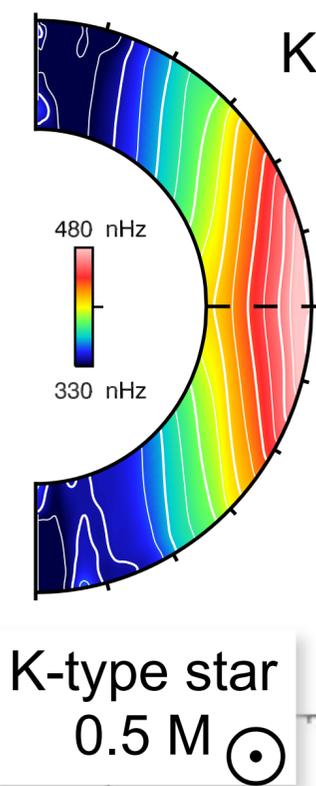
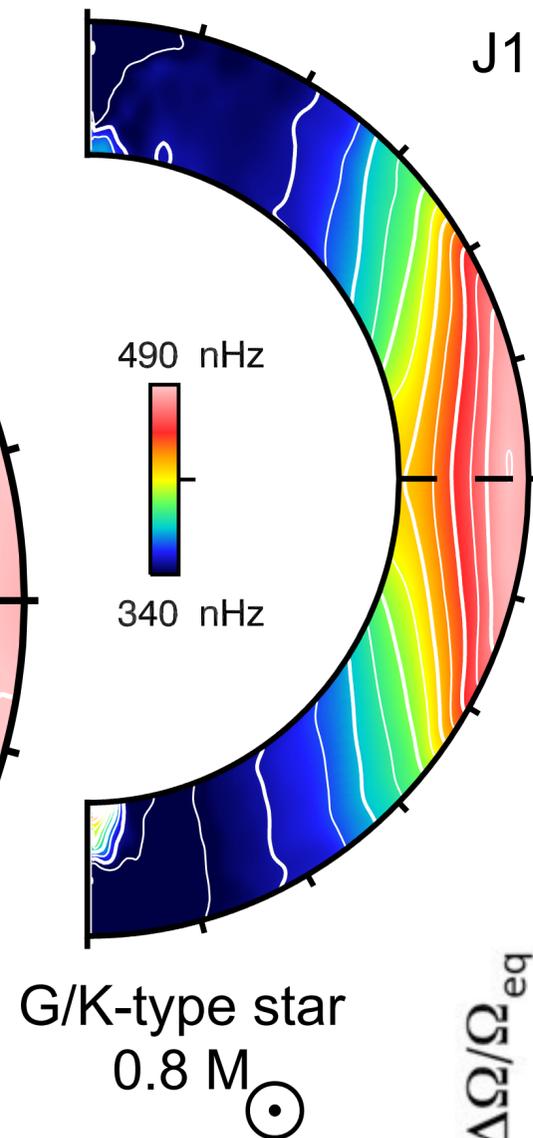
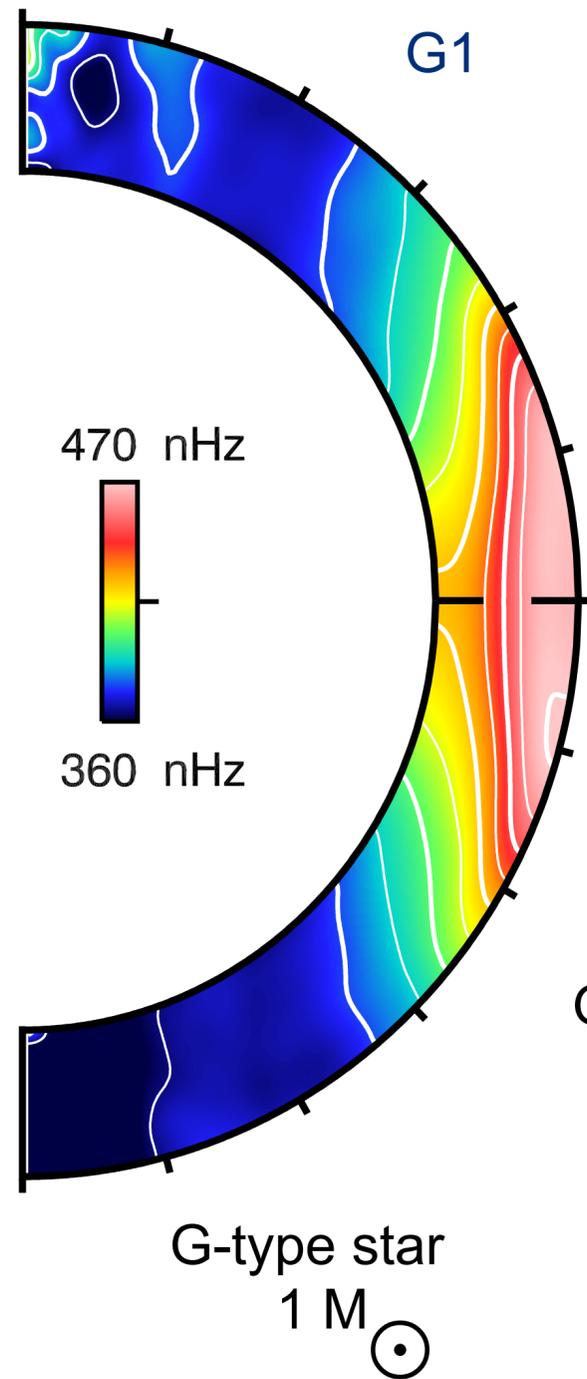
**spatially inhomogeneous heating** (mix of nuclear generation and radiative transport, leads to peak at core and distributed heating elsewhere; MESA)

# Global dynamos in fully convective M-dwarf stars

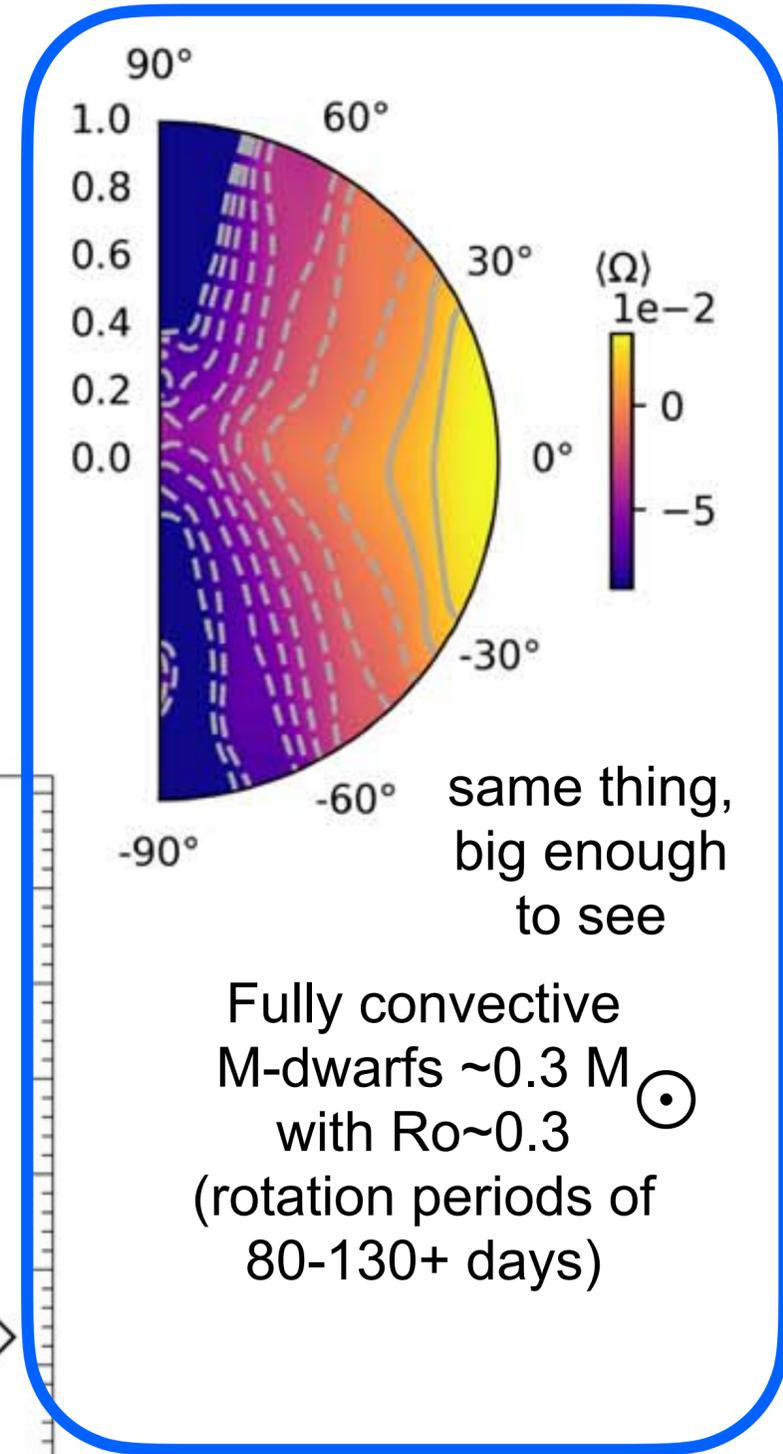
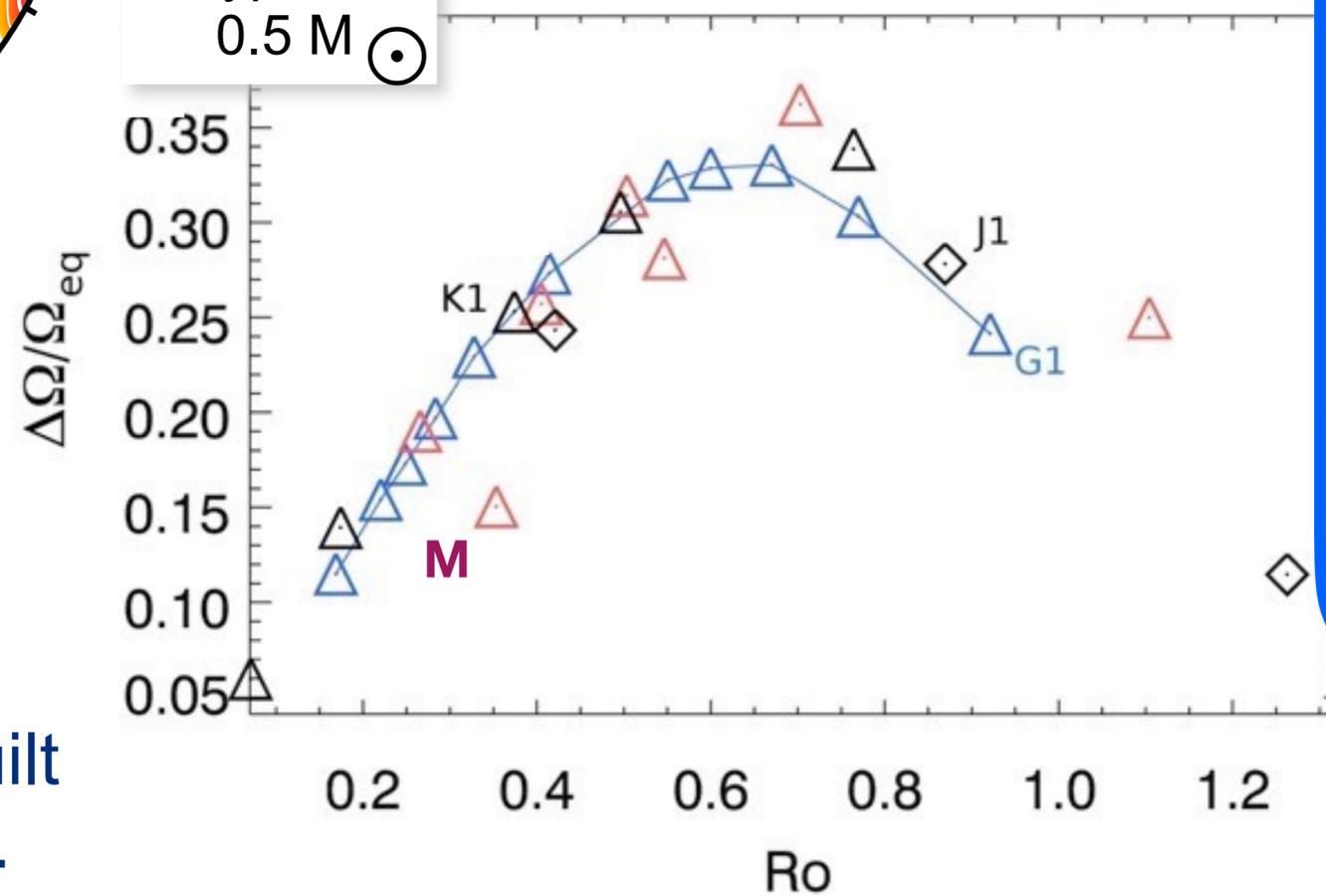
- Performed using the Dedalus framework: these are the first global-spherical simulations of fully-convective M-dwarfs.
- Anelastic, MHD, spectrally accurate.
- Flows at the center cross  $r=0$  and rising plumes there are very different in character from the falling plumes at the outer boundary.
- $Ro \sim 0.3$ ,  $Re \sim 120-240$
- Convection dominates the heat transport in the interior of the star, and builds a self-consistent, solar-like differential rotation (fast at the equator, slow at the poles)



# Differential Rotation in Other Stars

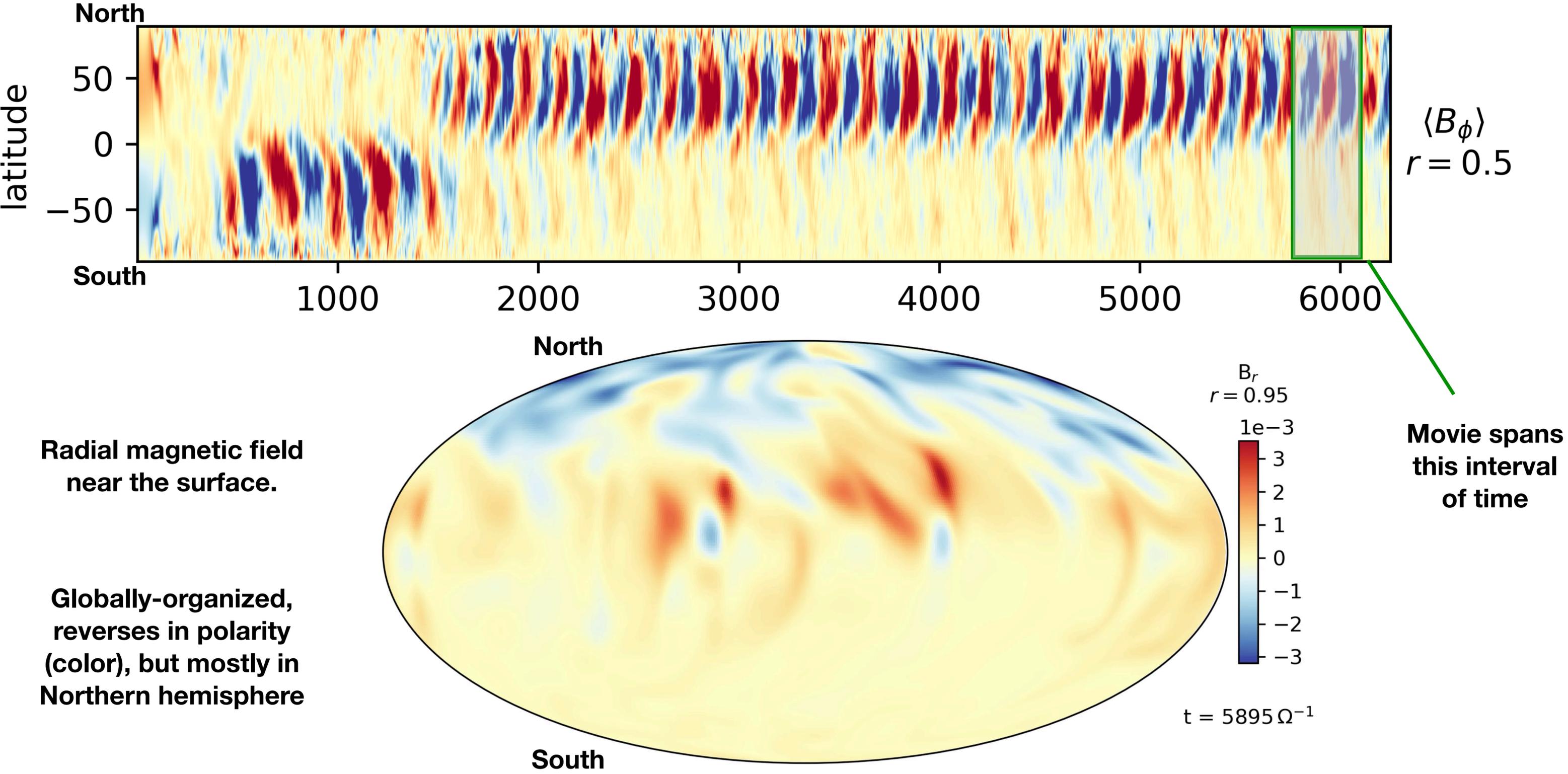


Rossby scaling



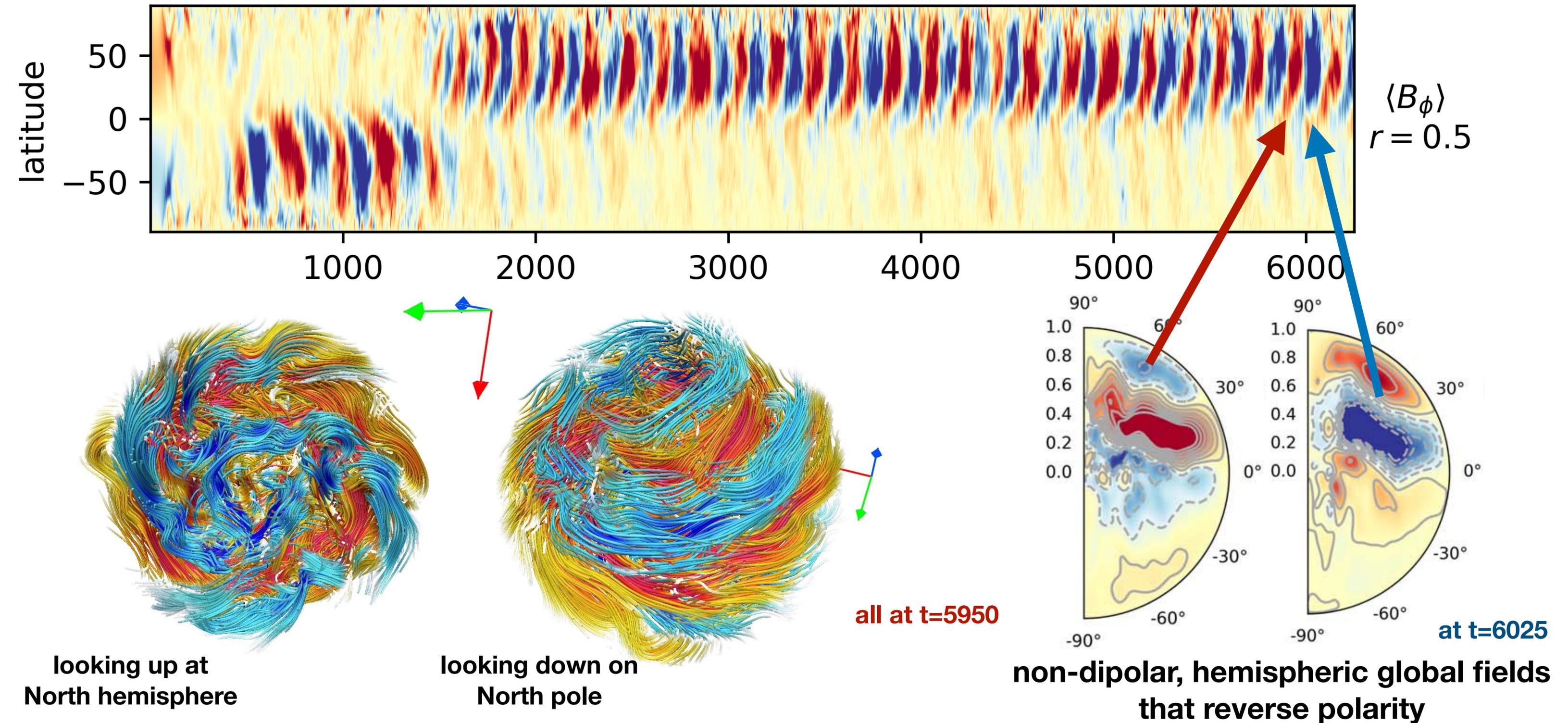
Stars of different masses, built off MESA structure models.

# The magnetic fields cycle, in a single hemisphere



Brown, Oishi, Vasil, Lecoanet & Burns 2020, "Single-hemisphere dynamos in M-dwarf stars", under review at ApJL

# The magnetic fields fill the convection zone



**An analogy, with boats.**

**Here's what we're competent at doing.**



**An analogy, with boats.**

**Here's what we think we can do  
(oh, we totally can! We've got this!)**

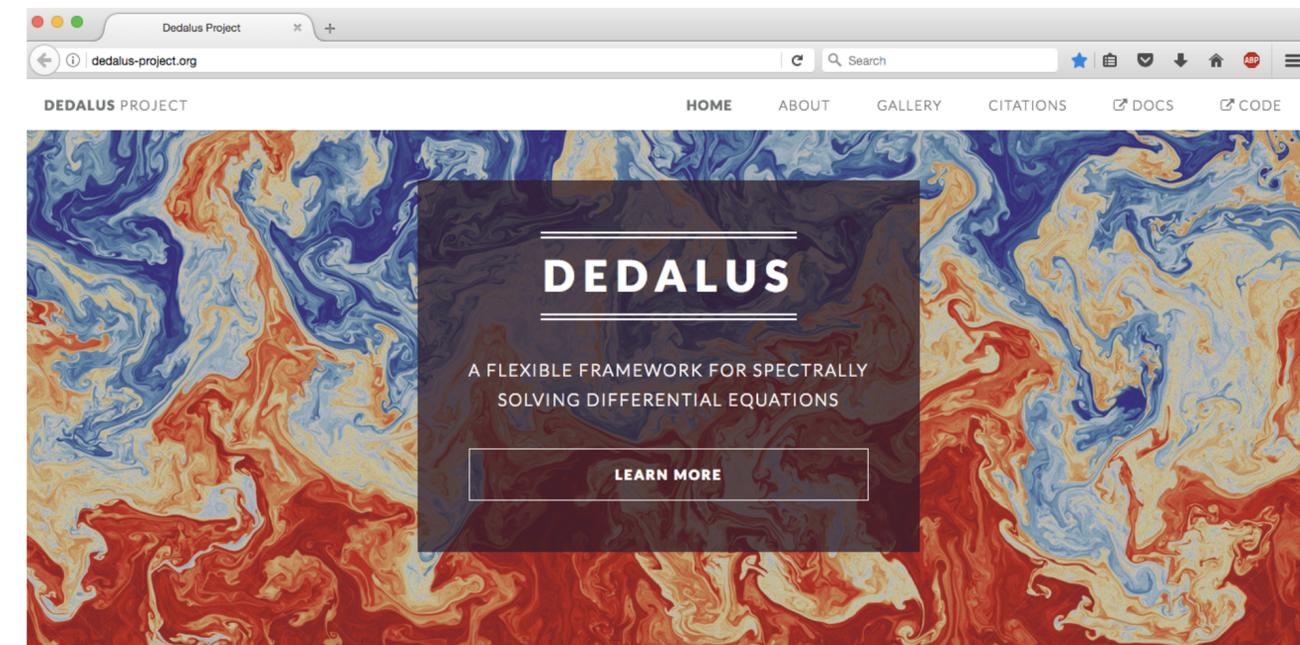


**An analogy, with boats.**  
**Here's what usually happens...**  
**(but sometimes we don't know we're wrecked)**



# New tools for astrophysics and some parting thoughts

Reproducing existing numerical work is very hard.  
This is crippling for science. Standards in Astro are lax.



Open source tools help ease this barrier to entry. But they're not enough.  
It's important that the full toolchain be published in some fashion.

With modern practices, open source community tools can be built and maintained on the cheap.  
Dedalus has cost ~\$2M, vs. ~\$100M+ for FLASH. There are downsides (no phone line).

Perspectives on Reproducibility and Sustainability of Open-Source Scientific Software from Seven Years of the  
Dedalus Project

A white paper submitted to the National Academies of Sciences, Engineering, and Medicine's Best Practices for a Future Open Code  
Policy for NASA Space Science

THE DEDALUS COLLECTIVE

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