

Toward a Theory of the North Atlantic Oscillation

Michael Ghil

Geosciences Dept. and LMD (CNRS & IPSL),
Ecole Normale Supérieure, Paris;
AOS Dept. and IGPP, UCLA



Pls. see these sites for further info.

<http://www.atmos.ucla.edu/tcd/>

<http://www.environnement.ens.fr/>

Motivation

- The **North Atlantic Oscillation (NAO)** is a leading mode of **variability** of the Northern Hemisphere and beyond.
- It affects **the atmosphere and oceans** on several **time and space scales**.
- Its **predictive understanding** could help interannual and **decadal-scale climate prediction** over and around the North Atlantic basin.
- The **hierarchical modeling** approach allows one to give proper weight to the **understanding provided by the models vs. their realism**, respectively.
- Back-and-forth between **“toy”** (conceptual) and **detailed** (“realistic”) **models**, and between **models** and **data**.

Joint work with S. Brachet, Y. Feliks and E. Simonnet

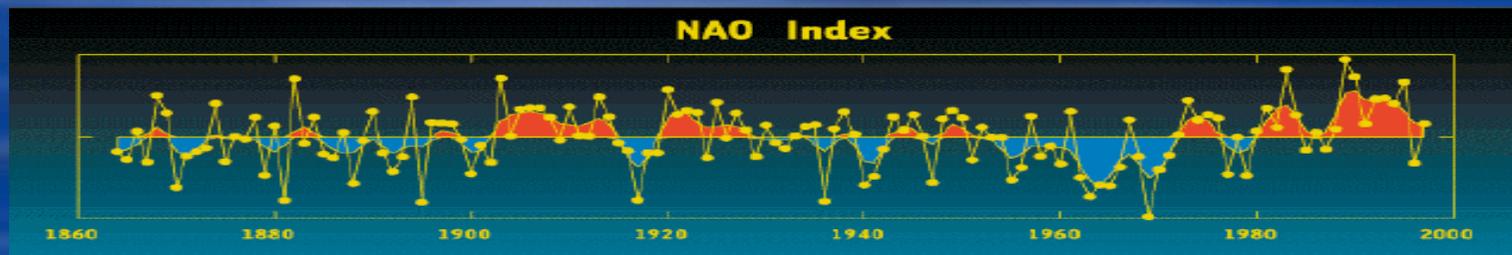
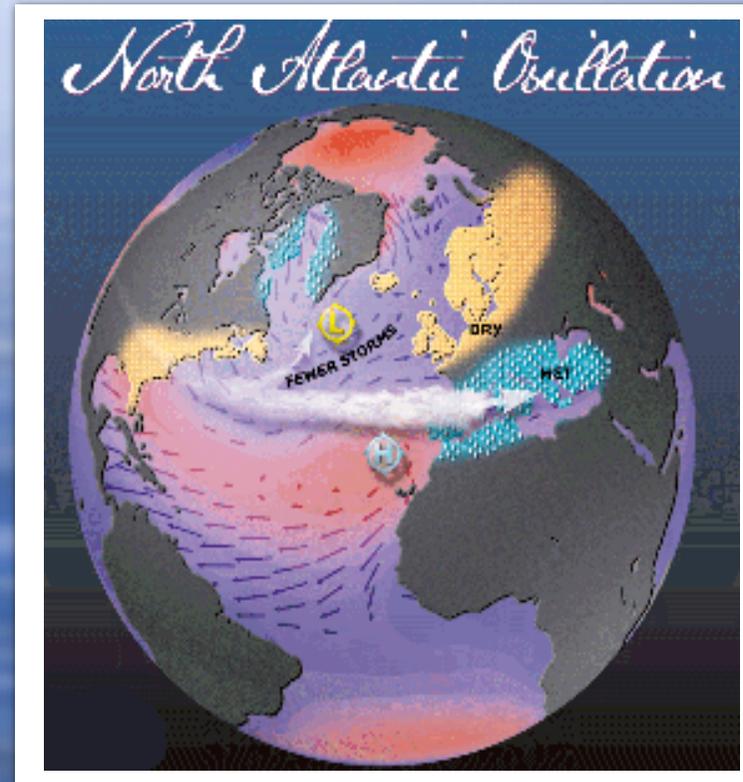
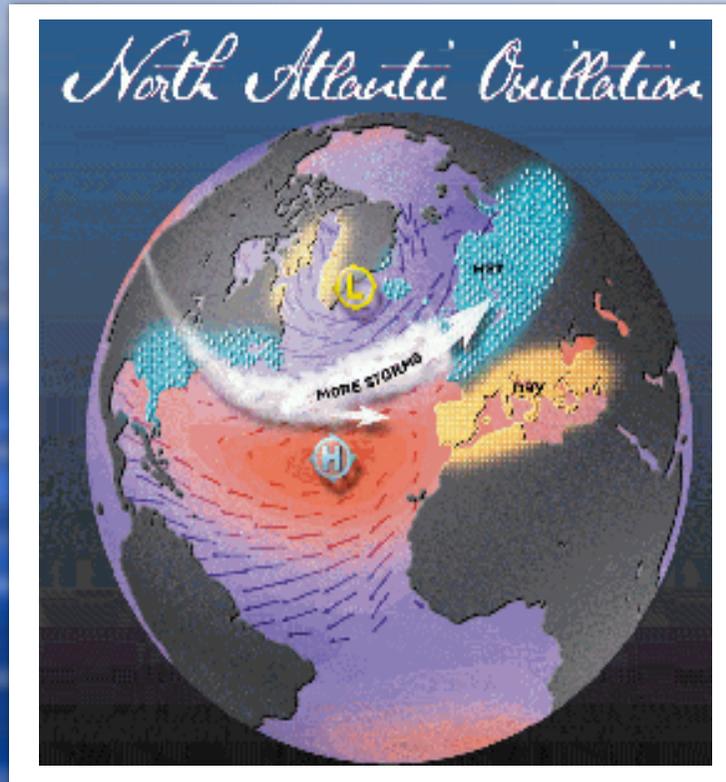
Outline

- ◆ Introduction: **the NAO and the oceans'** wind-driven circulation
- ◆ **The low-frequency variability** of the double-gyre circulation
 - **bifurcations** in a toy model
 - ⇒ multiple equilibria, **periodic** and **chaotic** solutions
 - some intermediate model results
- ◆ **Atmospheric impacts**
 - simple and intermediate models + GCMs
- ◆ **Some data analysis** – **atmospheric** and **oceanic**
- ◆ **A very promising coupled O–A model**
- ◆ **Conclusions**
 - **The coupled climate system**: is it **the tail** or **the dog**?
 - **Natural climate variability**: a source of **decadal predictability**
- ◆ **Some references**

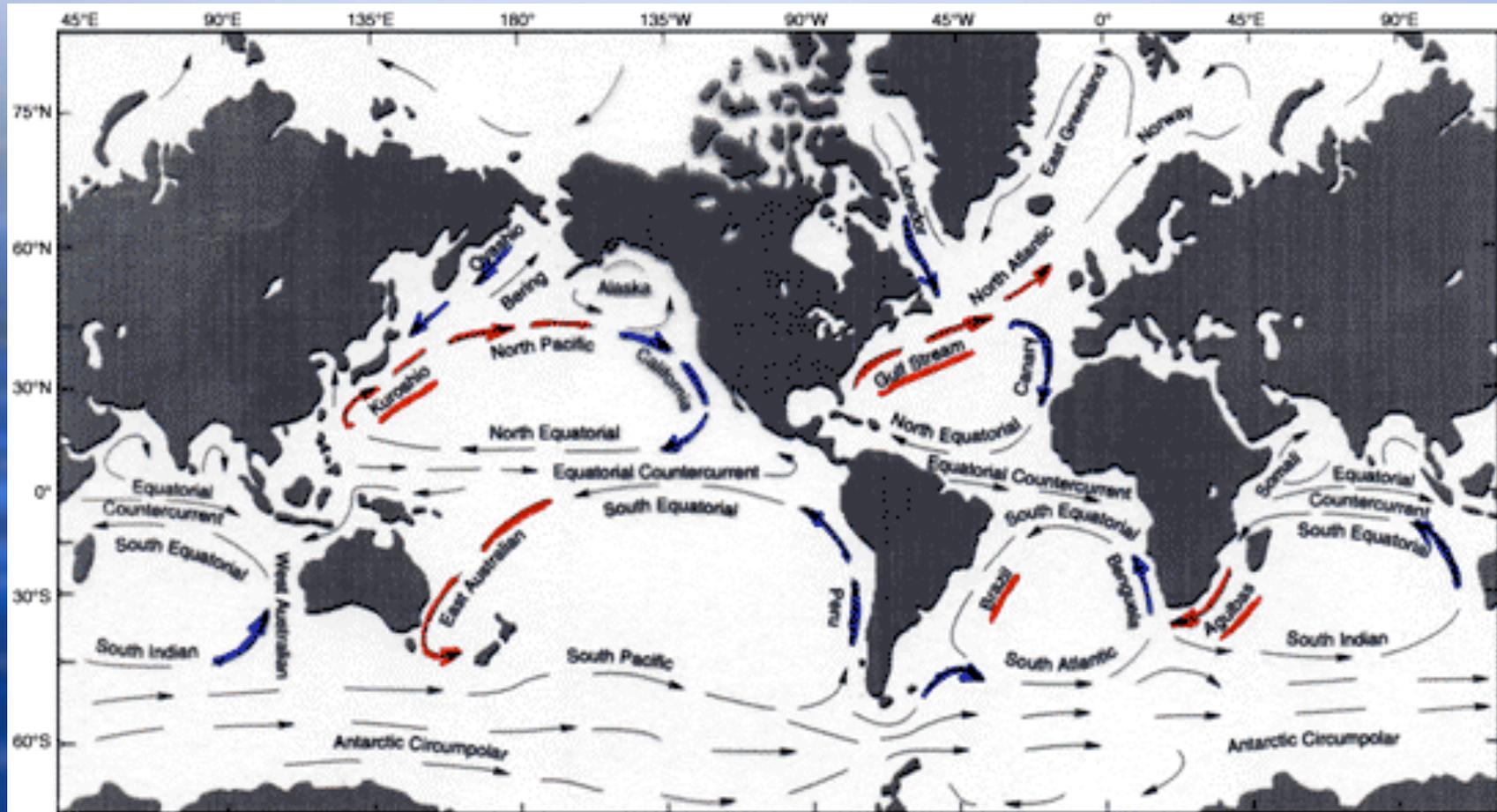
The North Atlantic Oscillation (NAO)

Positive phase

Negative phase



An example of bifurcations and hierarchical modeling: The oceans' wind-driven circulation



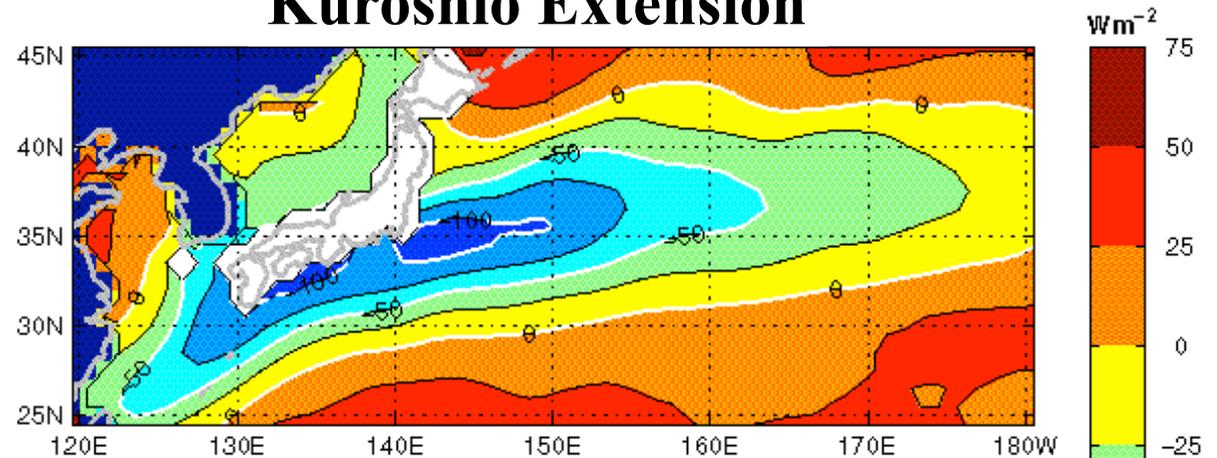
J. Apel (1987), Principles of Ocean Physics

The mean surface currents are (largely) wind-driven

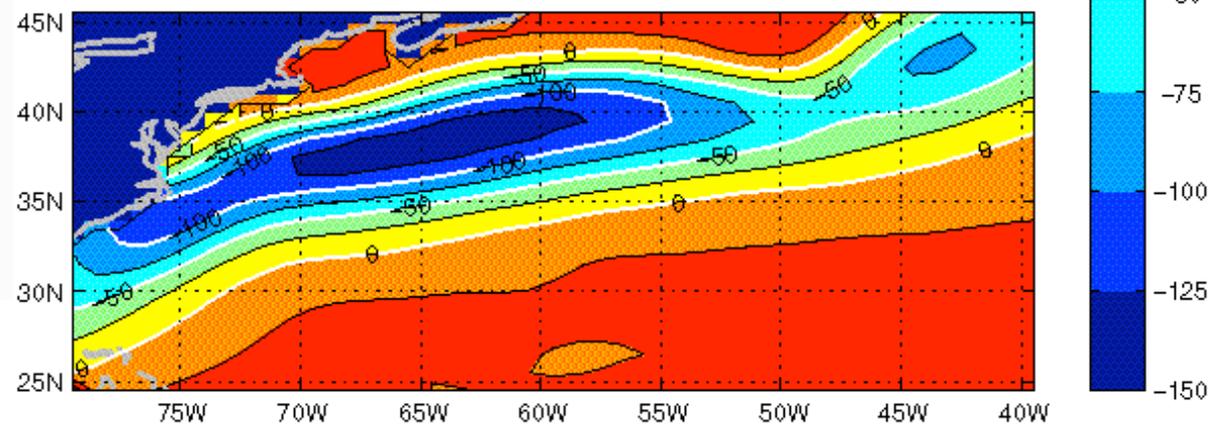
Annual Mean Net Surface Heat Flux

*Large heat loss
balanced by
poleward heat
transport
(advection)
Latent heat flux
is large relative
to sensible.*

Kuroshio Extension



Gulf Stream



Kelly, Jan 2009



APPLIED PHYSICS LABORATORY
University of Washington

Southampton Oceanography Centre

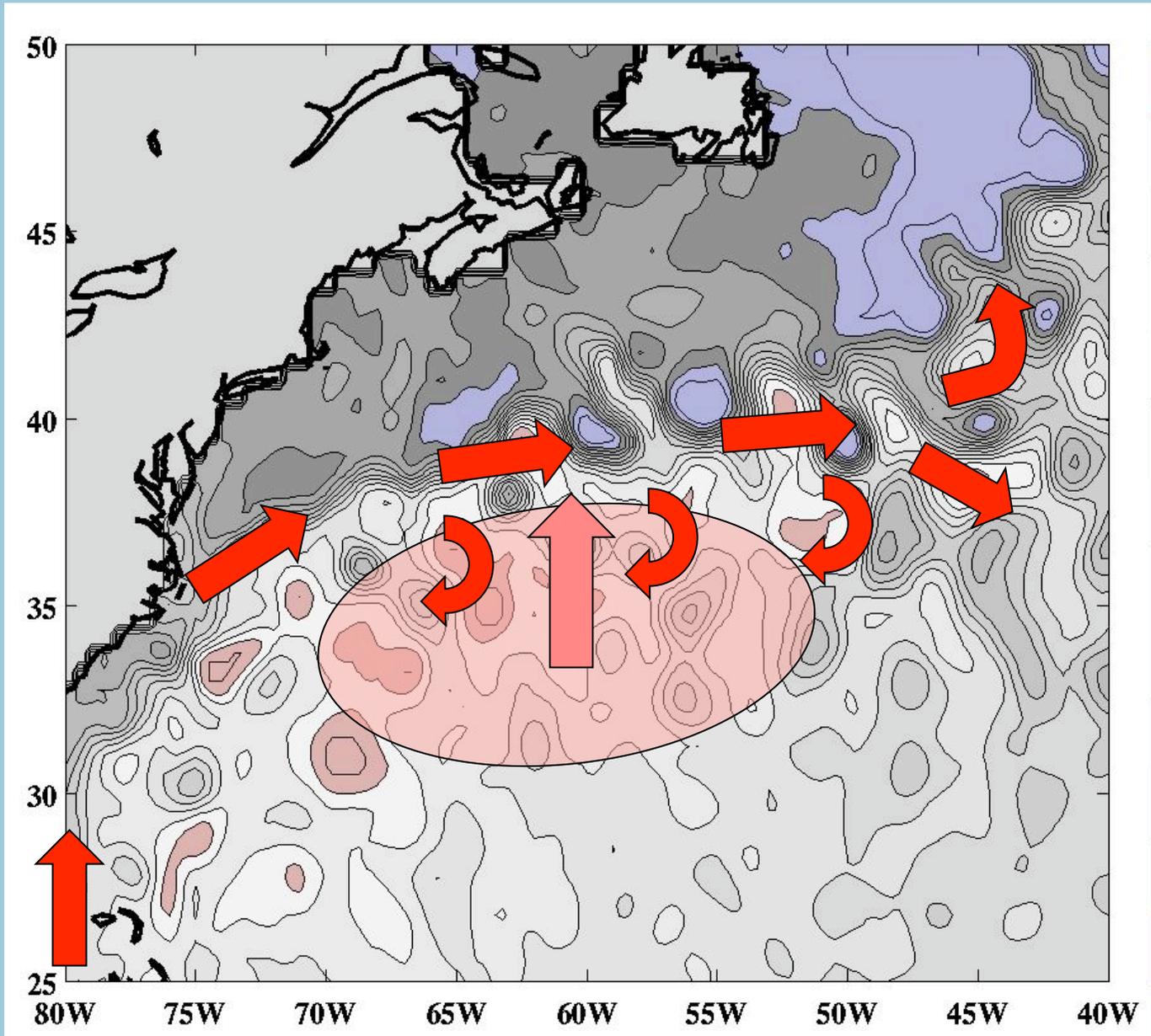
Western North Atlantic Circulation

*Florida Current
brings warm
water north*

*Gulf Stream
separates &
recirculates*

*Recirculation
creates heat
reservoir*

*Heat fluxed to
atmosphere*



Kelly, Jan 2009

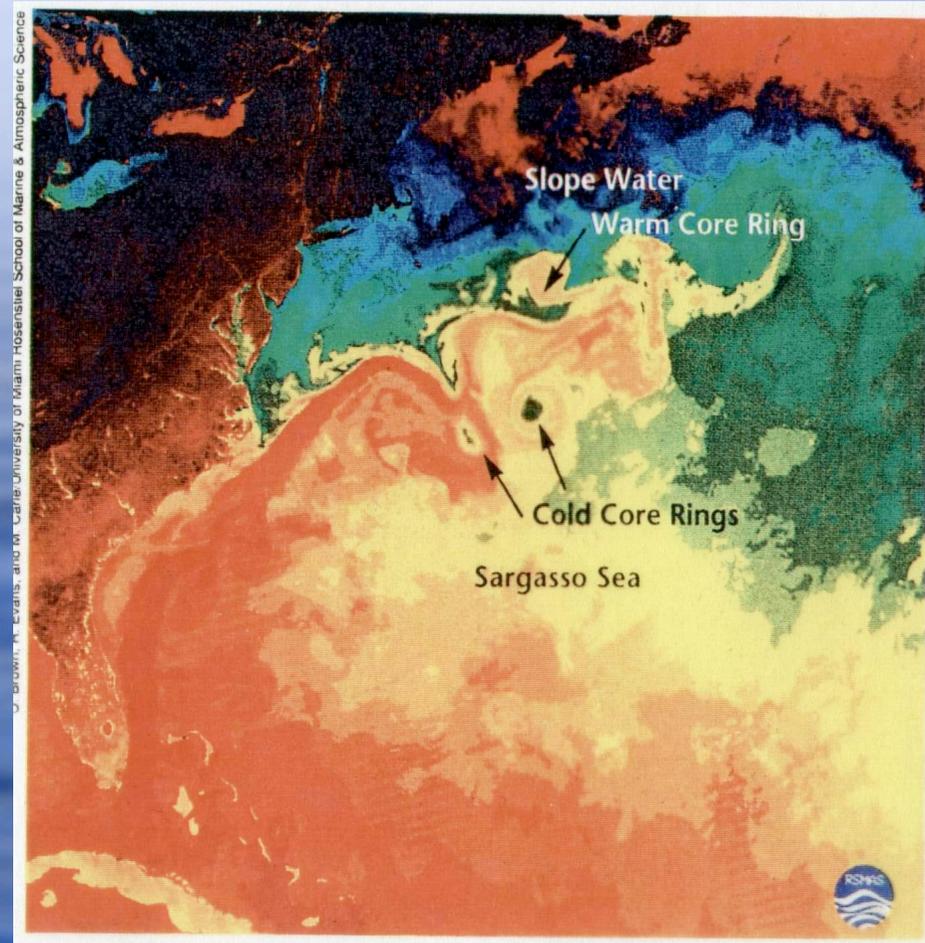


APL
APPLIED PHYSICS LABORATORY
University of Washington

The gyres and the eddies

Many scales of motion, dominated in the mid-latitudes by
(i) *the double-gyre circulation*;
and (ii) *the rings and eddies*.

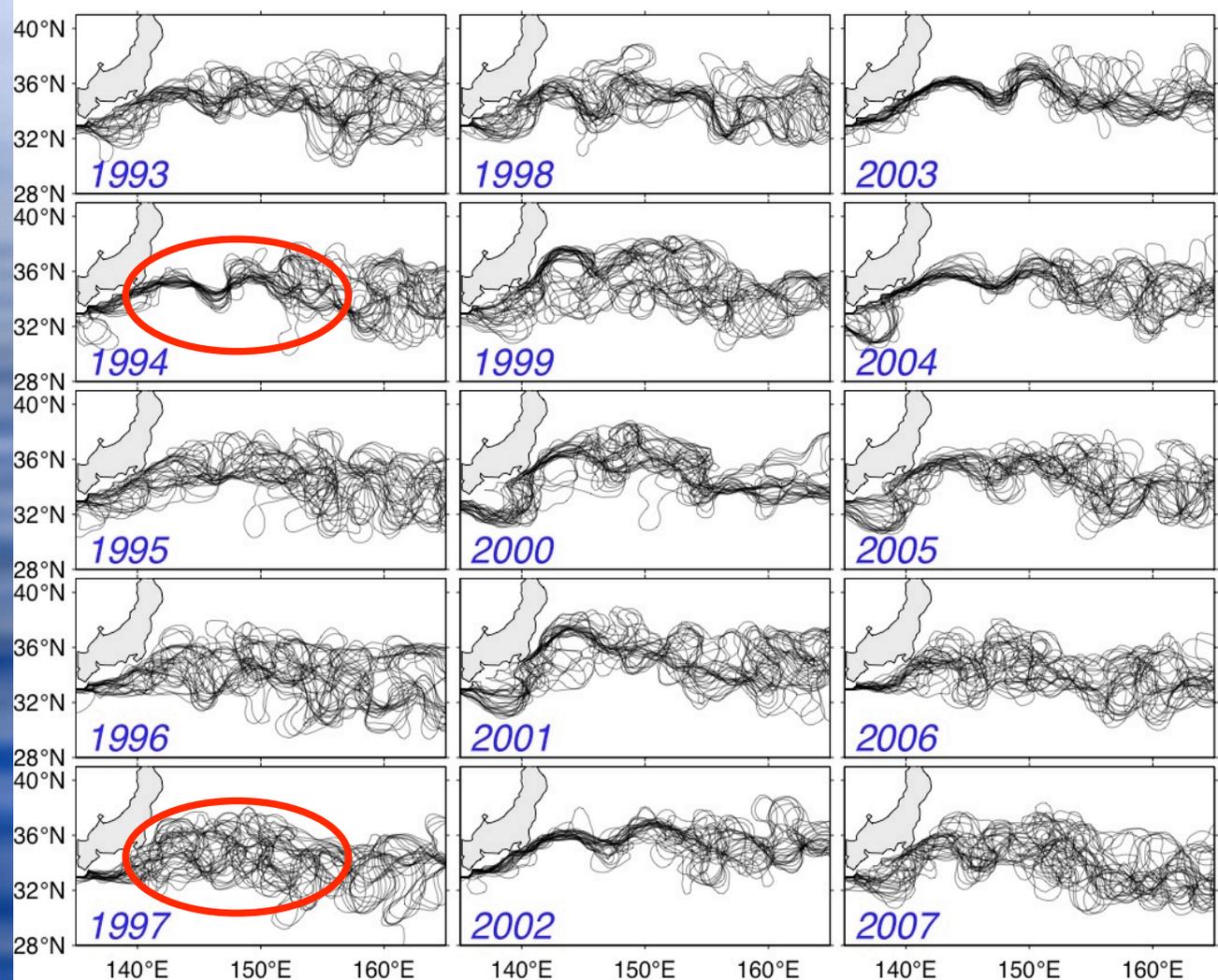
Much of the focus of physical oceanography over the '70s to '90s has been with the "*meso-scale*": the meanders, rings & eddies, and the associated two-dimensional and quasi-geostrophic *turbulence*.



Based on SSTs, from satellite IR data

Kuroshio Extension (KE) Path Changes

Monthly
paths from
altimeter:
Stable vs.
unstable
periods



Qiu & Chen
(*Deep-Sea Res.*, 2009)

“Limited-contour” analysis for atmospheric low-frequency variability

*10-day sequences of
subtropical jet paths:
blocked vs. zonal
flow regimes*

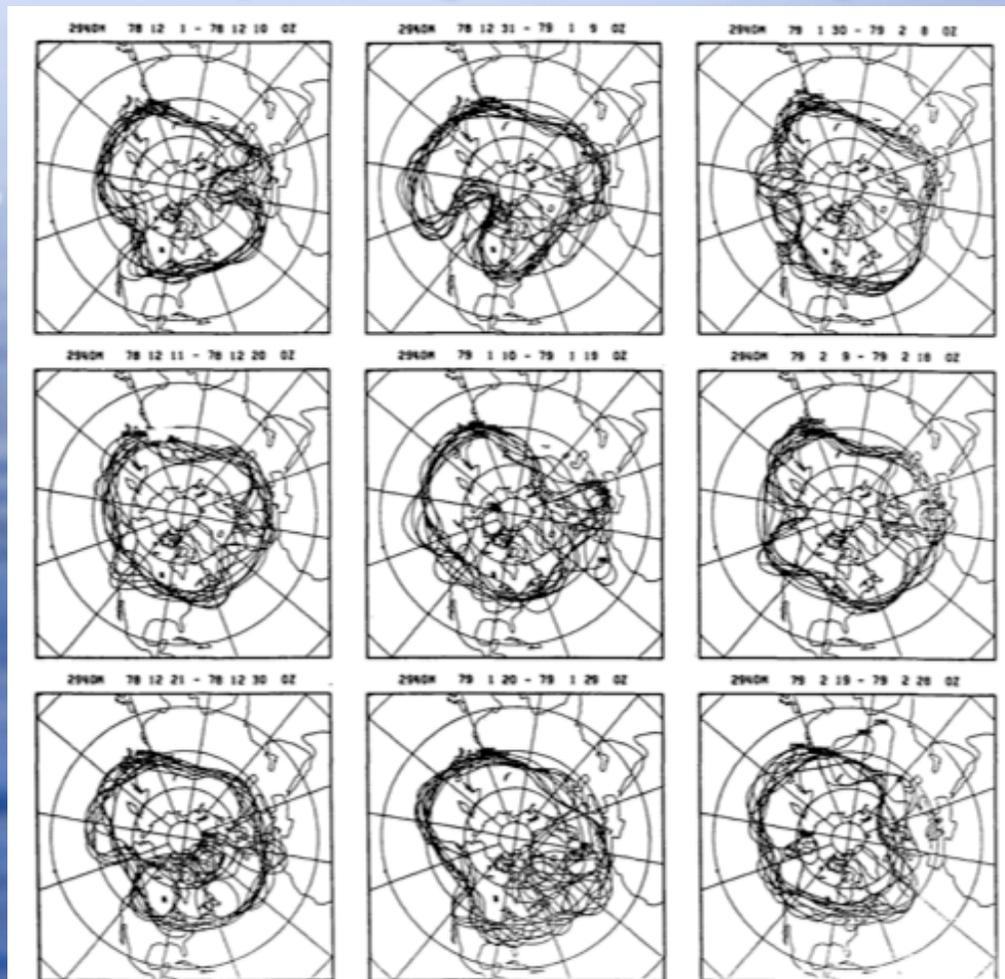
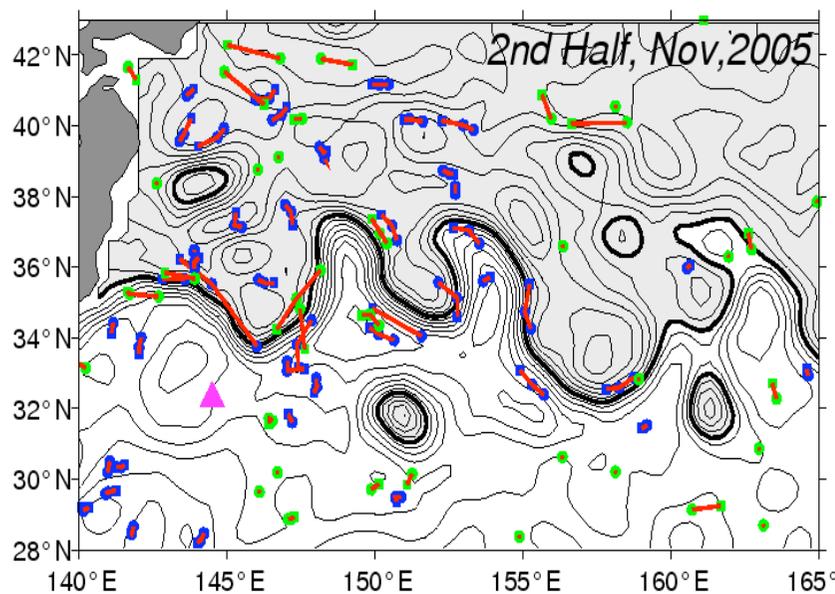


FIG. 1. Limited contour analysis of Northern Hemisphere (NH) flows. Daily contours of a prescribed height (2940 m in this case—roughly corresponding to the jet axis) are superimposed for successive 10-day intervals during NH winter 1978/79. Persistence is illustrated by some of the panels (see text for details).

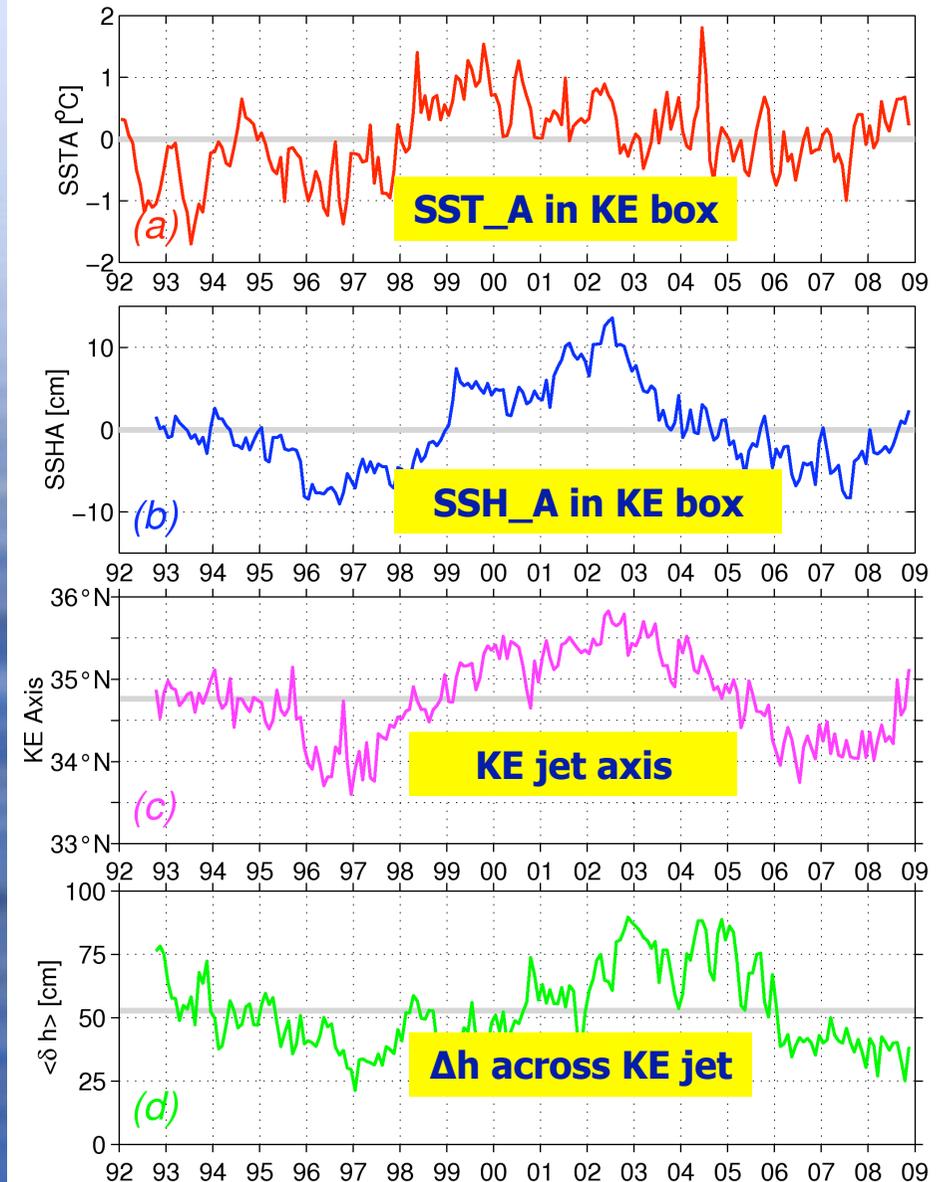
Kimoto & Ghil, JAS, 1993a

Kuroshio Extension (KE) box

SST anomalies are largely caused by **strength changes of the KE jet**



Courtesy of Bo Qiu, Jan. '09



Climate models (atmospheric & coupled) : A classification

• *Temporal*

- ♣ stationary, (quasi-)equilibrium
- ♣ transient, climate variability

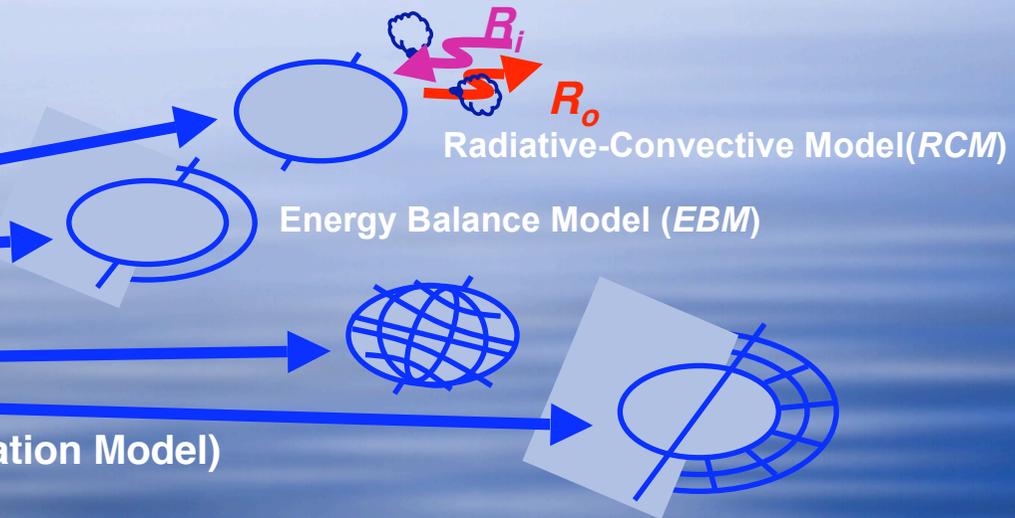
• *Space*

- ♣ 0-D (dimension 0)
- ♣ 1-D
 - vertical
 - latitudinal
- ♣ 2-D
 - horizontal
 - meridional plane
- ♣ 3-D, GCMs (Général Circulation Model)
 - horizontal
 - meridional plane
- ♣ Simple and intermediate 2-D & 3-D models

• *Coupling*

- ♣ Partial
 - unidirectional
 - asynchronous, hybrid
- ♣ Full

Hierarchy: from the simplest to the most elaborate,
iterative comparison with the observational data



Modeling Hierarchy for the Oceans

Ocean models

- ◆ 0-D: box models – chemistry (BGC), paleo
- ◆ 1-D: vertical (mixed layer, thermocline)
- ◆ 2-D – meridional plane – THC
 - also 1.5-D: a little longitude dependence
 - horizontal – wind-driven
 - also 2.5-D: reduced-gravity models (n.5)
- ◆ 3-D: OGCMs - simplified
 - with bells & whistles (“kitchen sink”)

Coupled 0-A models

- ◆ Idealized (0-D & 1-D): intermediate couple models (ICM)
- ◆ Hybrid (HCM) - diagnostic/statistical atmosphere
 - highly resolved ocean
- ◆ Coupled GCM (3-D): CGCM

Outline

- ◆ Introduction: the NAO and the oceans' wind-driven circulation
- ◆ The low-frequency variability of the double-gyre circulation
 - bifurcations in a toy model
 - => multiple equilibria, periodic and chaotic solutions
 - some intermediate model results
- ◆ Atmospheric impacts
 - simple and intermediate models + GCMs
- ◆ Some data analysis – atmospheric and oceanic
- ◆ A very promising coupled O–A model
- ◆ Conclusions
 - The coupled climate system: is it the tail or the dog?
 - Natural climate variability: a source of decadal predictability
- ◆ Some references

The double-gyre circulation and its low-frequency variability

An “intermediate” model of the mid-latitude, wind-driven ocean circulation: 20-km resolution, about 15 000 variables

Shallow-water model

$$\begin{aligned} \frac{\partial U}{\partial t} + \nabla \cdot (\mathbf{u}U) &= -g'h \frac{\partial h}{\partial x} + fV + \underline{\alpha_A} A \nabla^2 U - RU - \frac{\alpha_\tau \tau^x}{\rho} \\ \frac{\partial V}{\partial t} + \nabla \cdot (\mathbf{u}V) &= -g'h \frac{\partial h}{\partial y} - fU + \underline{\alpha_A} A \nabla^2 V - RV \\ \frac{\partial h}{\partial t} &= -\left(\frac{\partial U}{\partial x} + \frac{\partial V}{\partial y}\right) \end{aligned}$$

where

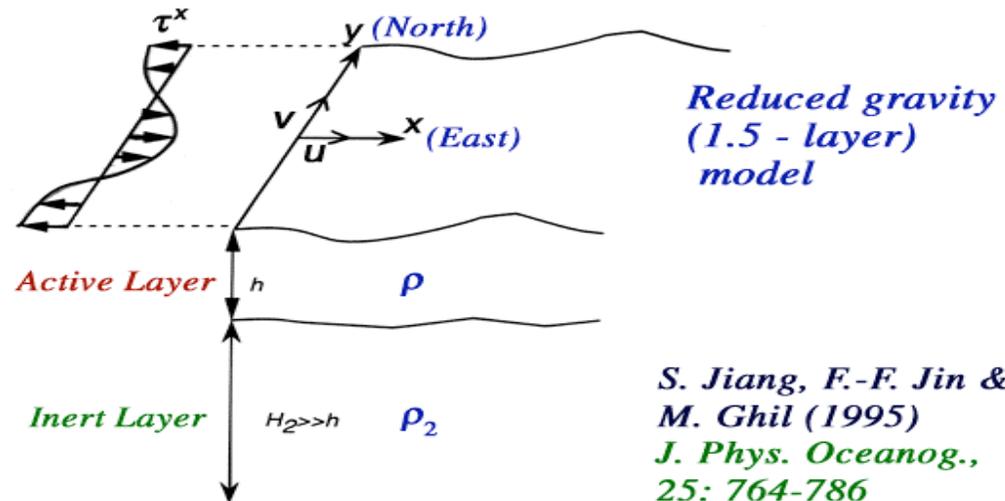
$$U\hat{e}_x + V\hat{e}_y = h\mathbf{u} = h(u\hat{e}_x + v\hat{e}_y)$$

g' : reduced gravity ($= g(\rho_2 - \rho)/\rho$)

A : viscosity coefficient ($= 300 \text{ m}^2\text{s}^{-1}$)

R : Rayleigh coefficient ($= 1/200 \text{ day}^{-1}$)

τ^x : wind stress $= \tau_0 \cos 2\pi/L$ ($\tau_0 = 1 \text{ dyn cm}^{-2}$ & $L = 2000 \text{ km}$)

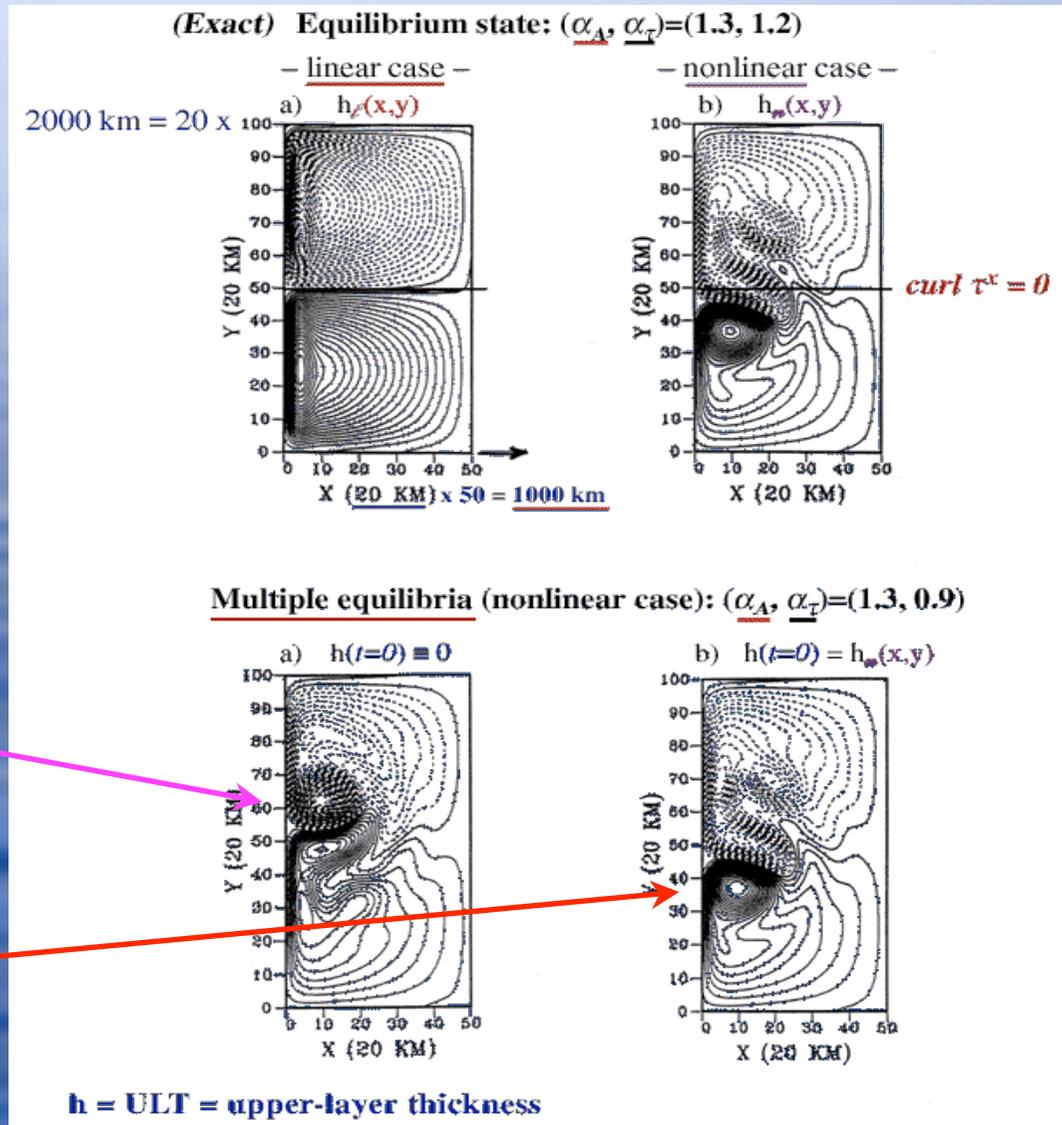


The JJG model's equilibria

Nonlinear (advection) effects break the (near) symmetry: (perturbed) pitchfork bifurcation?

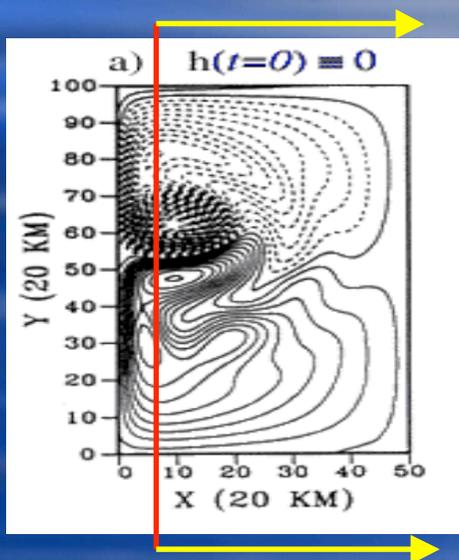
Subpolar gyre dominates

Subtropical gyre dominates



Time-dependent solutions: periodic and chaotic

To capture space-time dependence, meteorologists and oceanographers often use Hovmöller diagrams

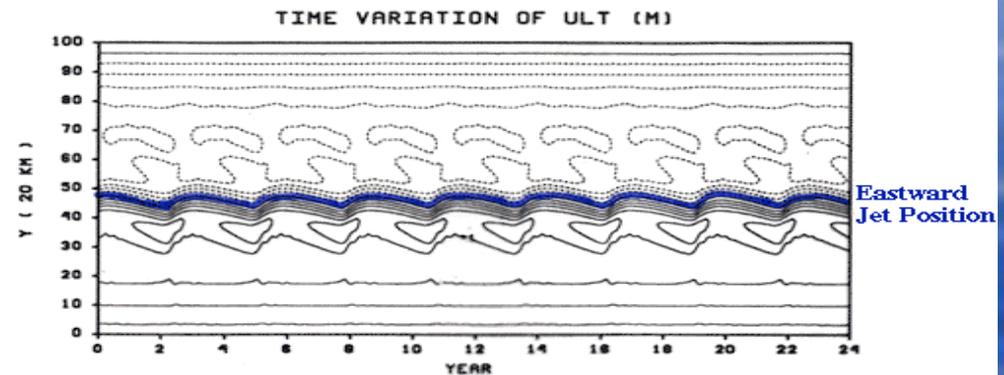


Time-dependent solutions

1. Periodic, w/ interannual period (2.8 years)

$$\alpha_A = 1.0$$

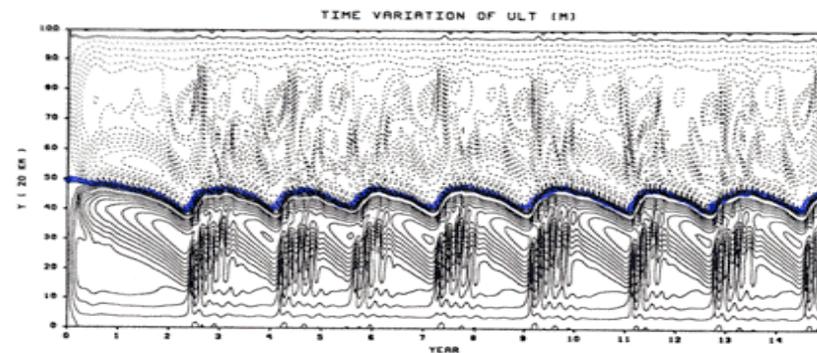
$$\alpha_\tau = 0.8$$



2. Aperiodic (weakly chaotic)

$$\alpha_A = 1.0$$

$$\alpha_\tau = 1.6$$

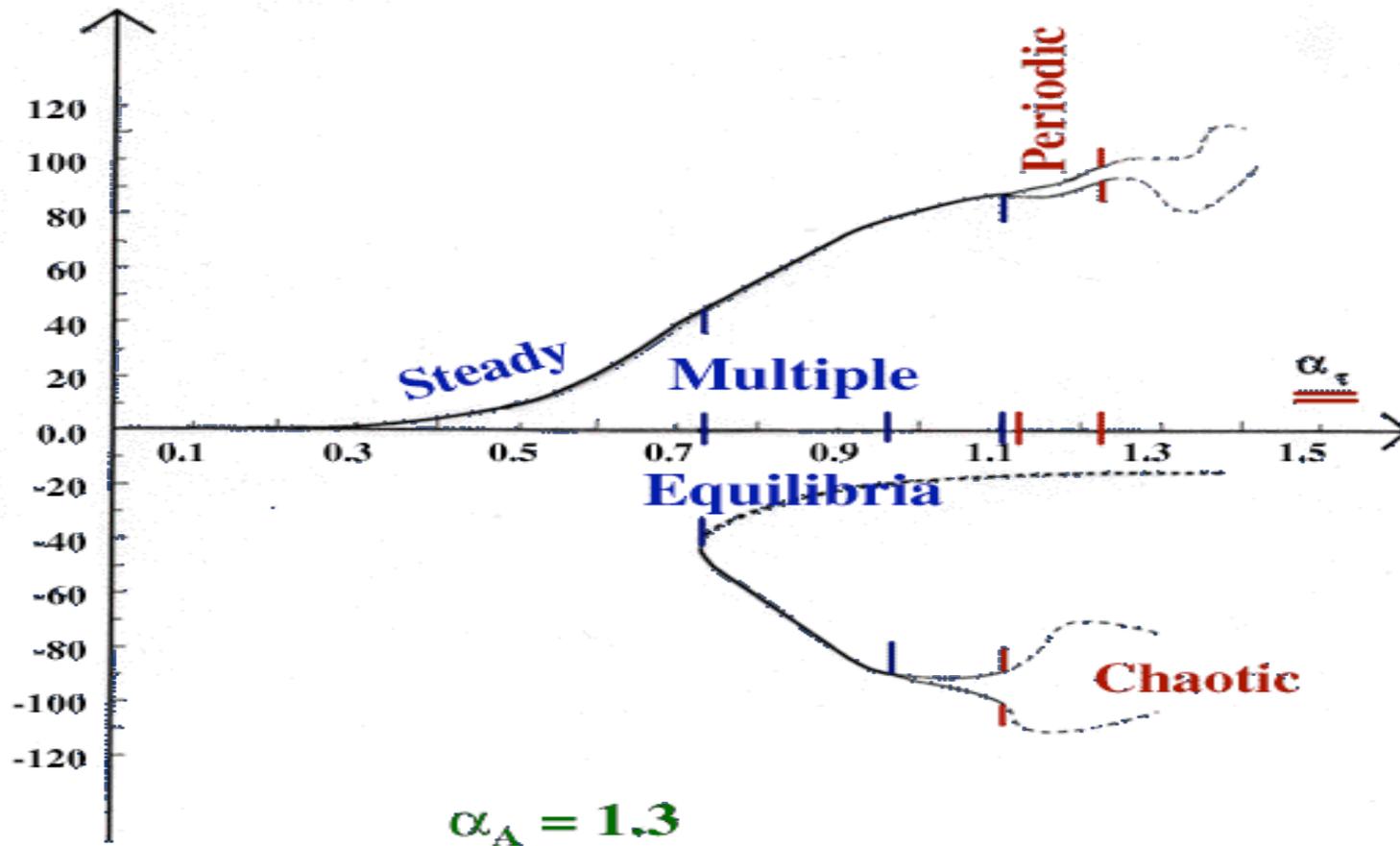


Poor man's continuation method

Bifurcation diagram

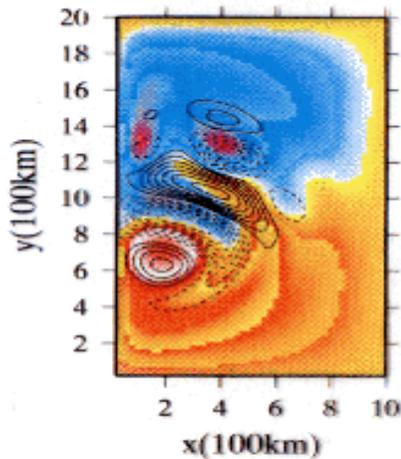
Perturbed pitchfork + Hopf + transition to chaos

Position of Merging Point (km)

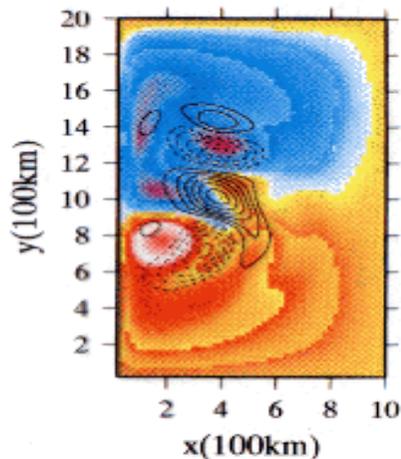


Interannual variability: relaxation oscillation

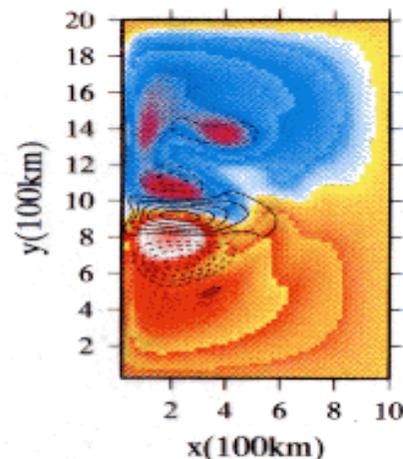
0 years



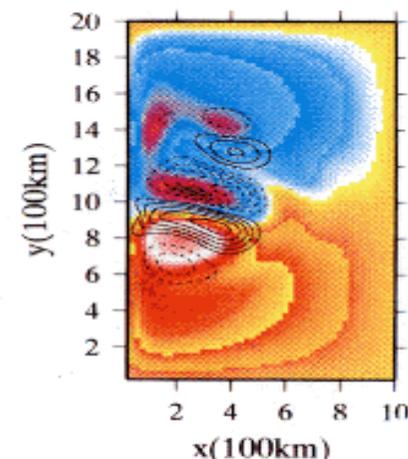
0.4 years



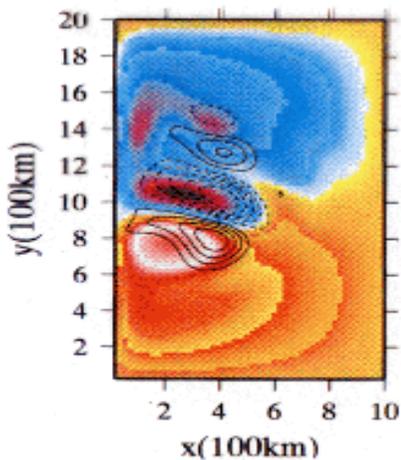
0.8 years



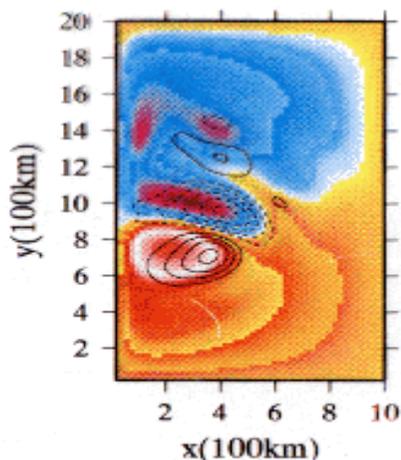
1.2 years



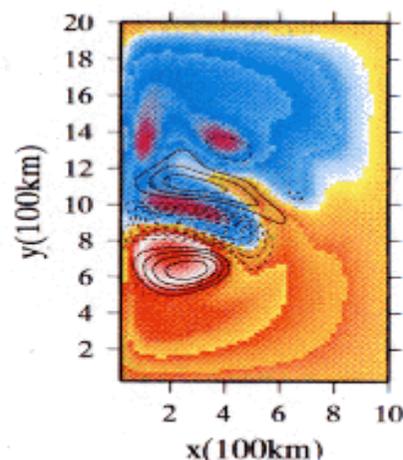
1.6 years



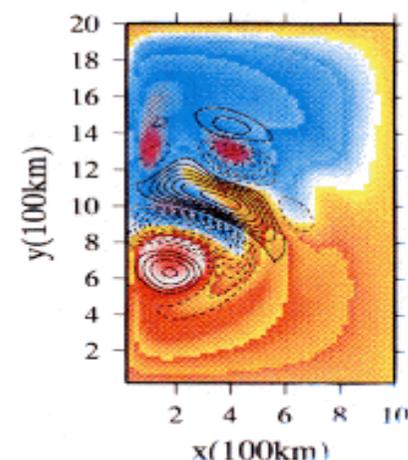
2.0 years



2.4 years



2.8 years



Global bifurcations in “intermediate” models

Bifurcation tree in a QG, equivalent-barotropic, high-resolution (10 km) model: pitchfork, mode-merging, Hopf, and homoclinic

2005]

Simonnet et al.: Quasi-geostrophic double-gyre circulation

937

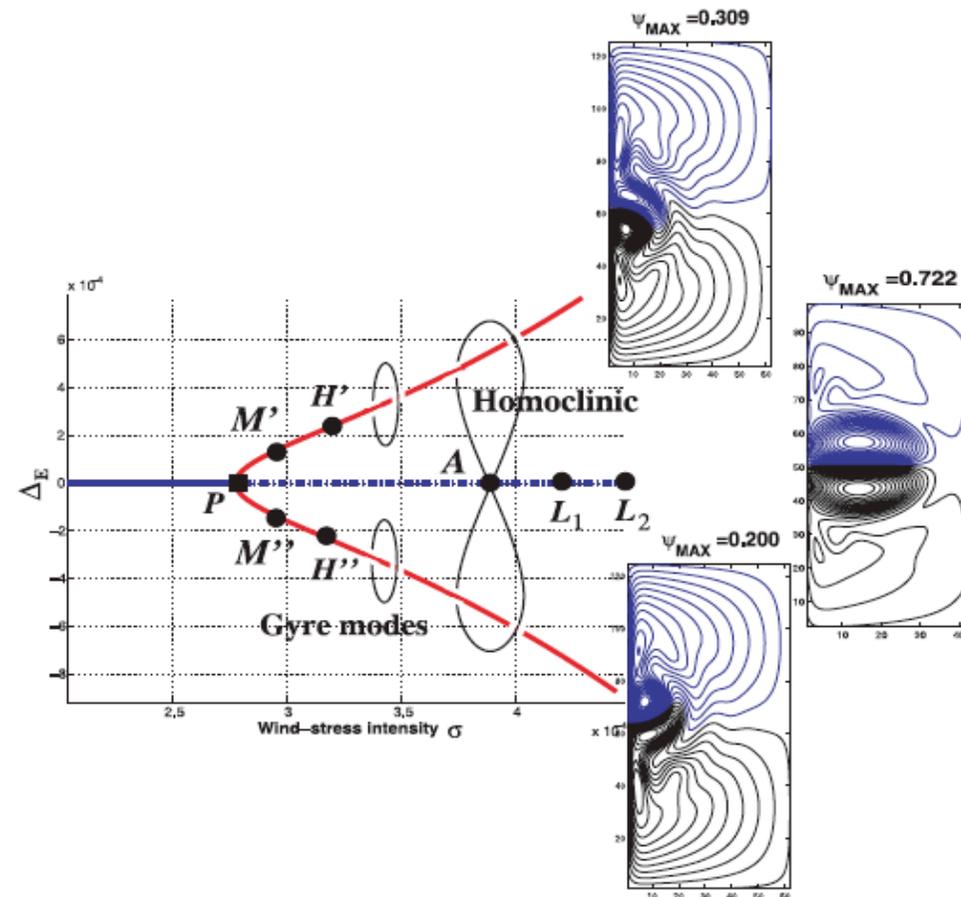


Figure 1. Schematic bifurcation diagram of an equivalent-barotropic QG model, plotted in terms of an asymmetry measure Δ_E (see Section 3a further below) vs. wind-stress intensity. The limit cycles are schematically drawn for illustrative purpose and the streamfunction patterns corresponding to the three steady-state branches—subtropical, antisymmetric, and subpolar (from top to

Homoclinic orbit: numerical and analytical

2005]

Simonnet et al.: Quasi-geostrophic double-gyre circulation

939

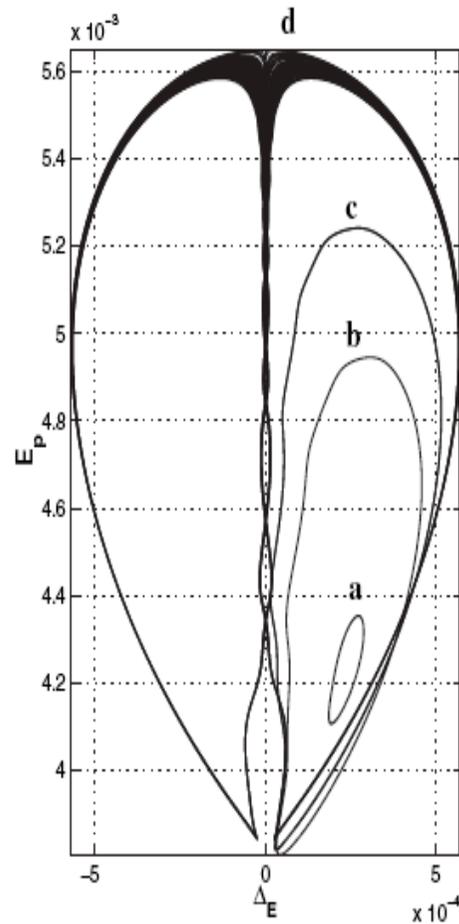


Figure 2. Unfolding of the relaxation oscillations induced by the gyre modes, shown in the plane spanned by the total potential energy of the solution E_p and the difference Δ_E between the subpolar potential energy and the subtropical one (see text for details). The orbits of several limit cycles are

2005]

Simonnet et al.: Quasi-geostrophic double-gyre circulation

941

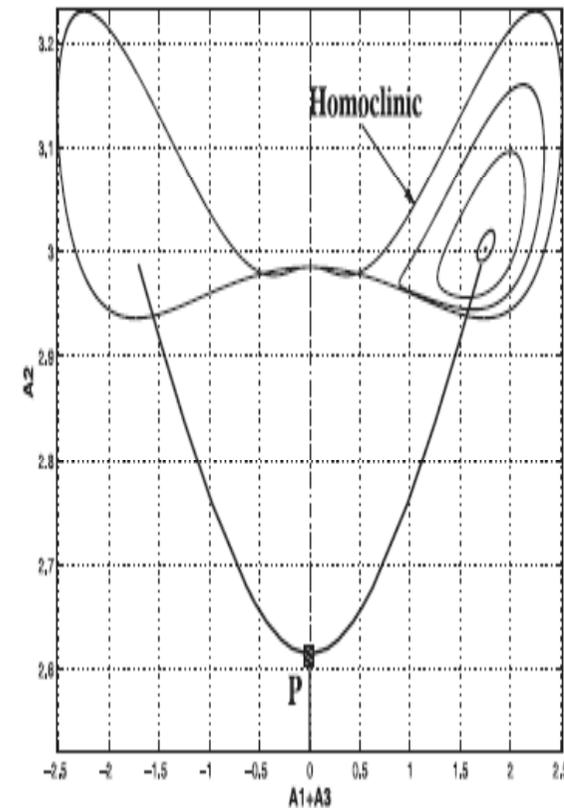


Figure 3. Bifurcation diagram of the highly truncated, four-mode model (5), projected onto the $(A_1 + A_3, A_2)$ plane for $\mu = 1$ and $s = 2$; P stands for pitchfork bifurcation at $\sigma = \sigma_p = 7.61$, while $\sigma = \sigma_{hc} \approx 10.4299$ at the homoclinic bifurcation. The branches of periodic orbits are replaced by several explicitly computed limit cycles.

The double-gyre circulation: A different rung of the hierarchy

Another “intermediate” model of the double-gyre circulation: slightly different physics, higher resolution – down to 10 km in the horizontal and more layers in the vertical, much larger domain, ...

Bo Qiu, U. of Hawaii,
pers. commun., 1997

Quasi - geostrophic model

2.5-layer model

$$\frac{\partial}{\partial t}(\nabla^2 h_1 - \lambda_1^2(h_1 - h_2)) + \beta \frac{\partial h_1}{\partial x} = -\frac{g'}{f_0} J[h_1, \nabla^2 h_1 - F_1(h_1 - h_2)]$$

$$+ A_h \nabla^4 h_1 - C \nabla^2(h_1 - h_2) + \frac{f_0}{\rho_0 g' H_1} \text{curl } \vec{\tau}$$

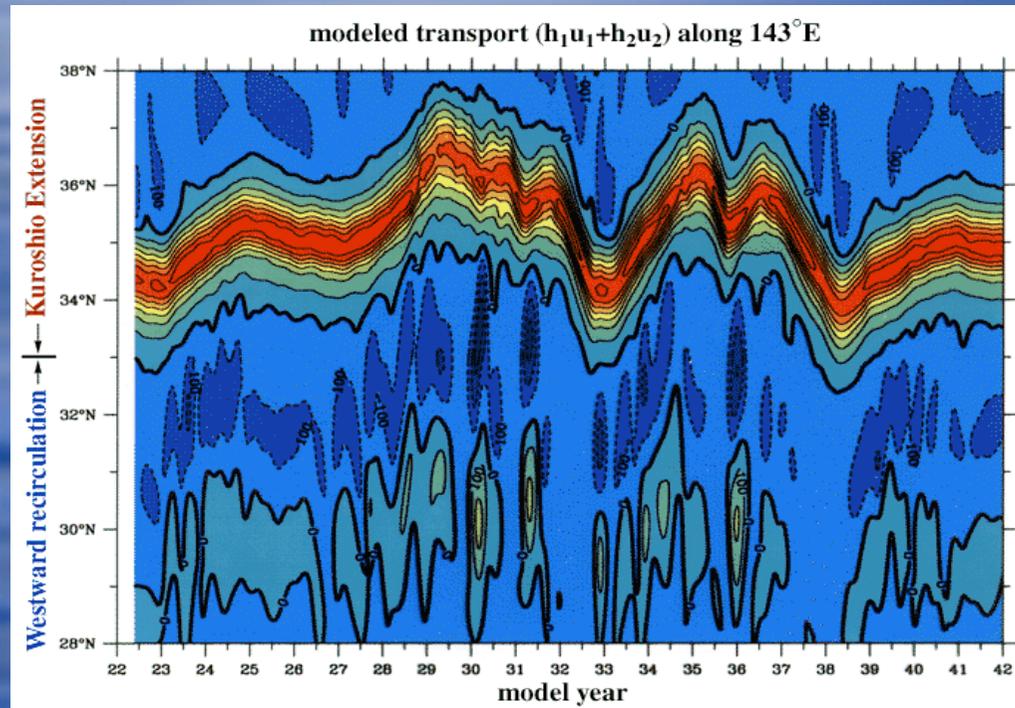
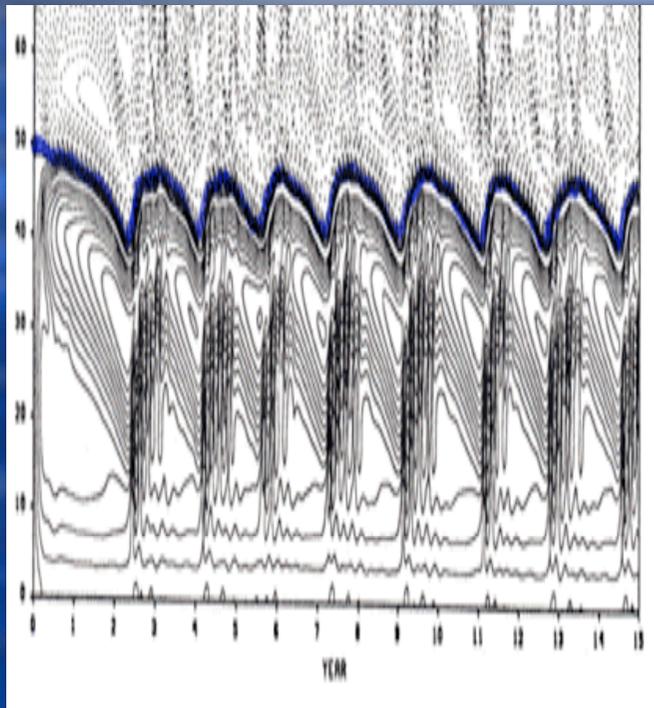
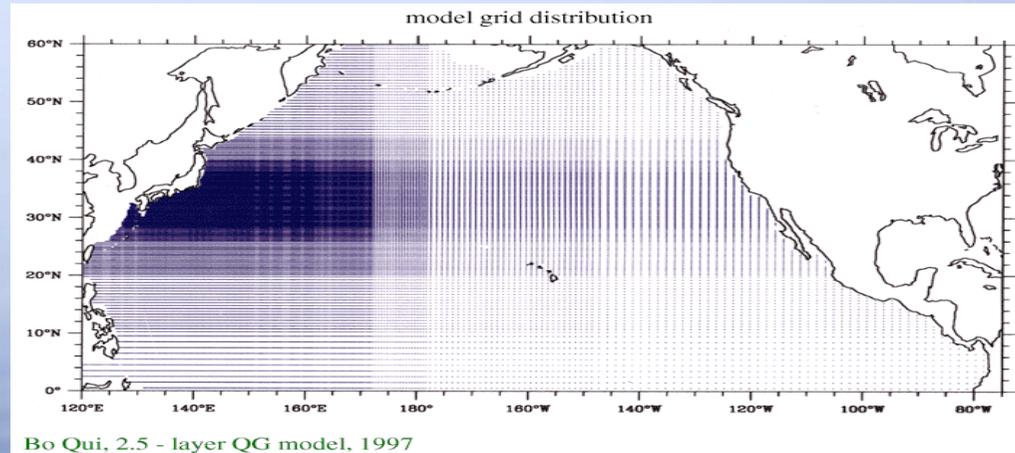
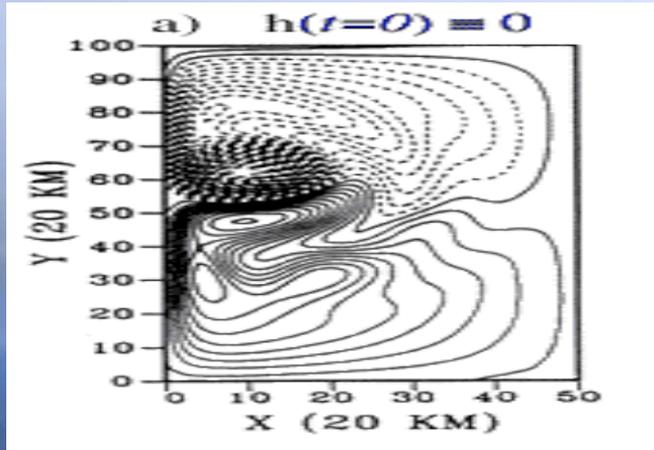
$$\frac{\partial}{\partial t}(\nabla^2 h_2 - \lambda_2^2(h_2 - h_1)) + \beta \frac{\partial h_2}{\partial x} = -\frac{g'}{f_0} J[h_2, \nabla^2 h_2 - F_2(h_2 - h_1)]$$

$$+ A_h \nabla^4 h_2 - C \nabla^2(h_2 - h_1) - R \nabla^2 h_2$$

where

- h_1, h_2 : height anomaly for upper and lower layer (stream functions)
- H_1, H_2 : mean height for upper and lower layer
- λ_1, λ_2 : Rossby radius of deformation $\equiv \sqrt{h' H_1 / f_0^2}, \sqrt{h' H_2 / f_0^2}$
- $\vec{\tau}$: wind stress
- A_h : viscosity coefficient
- C, R : Rayleigh coefficient for interface and lower layer
- f_0, β : Coriolis and beta parameters
- ρ_0, g' : mean density and reduced gravity

Model-to-model, qualitative comparison



Model-and-observations, quantitative comparison

Spectra of
(a) kinetic energy of
2.5-layer shallow-water
model in North-Atlantic-
shaped basin; and
(b) Cooperative Ocean-
Atmosphere Data Set
(COADS) Gulf-Stream
axis data

2005]

Simonnet et al.: Quasi-geostrophic double-gyre circulation

947

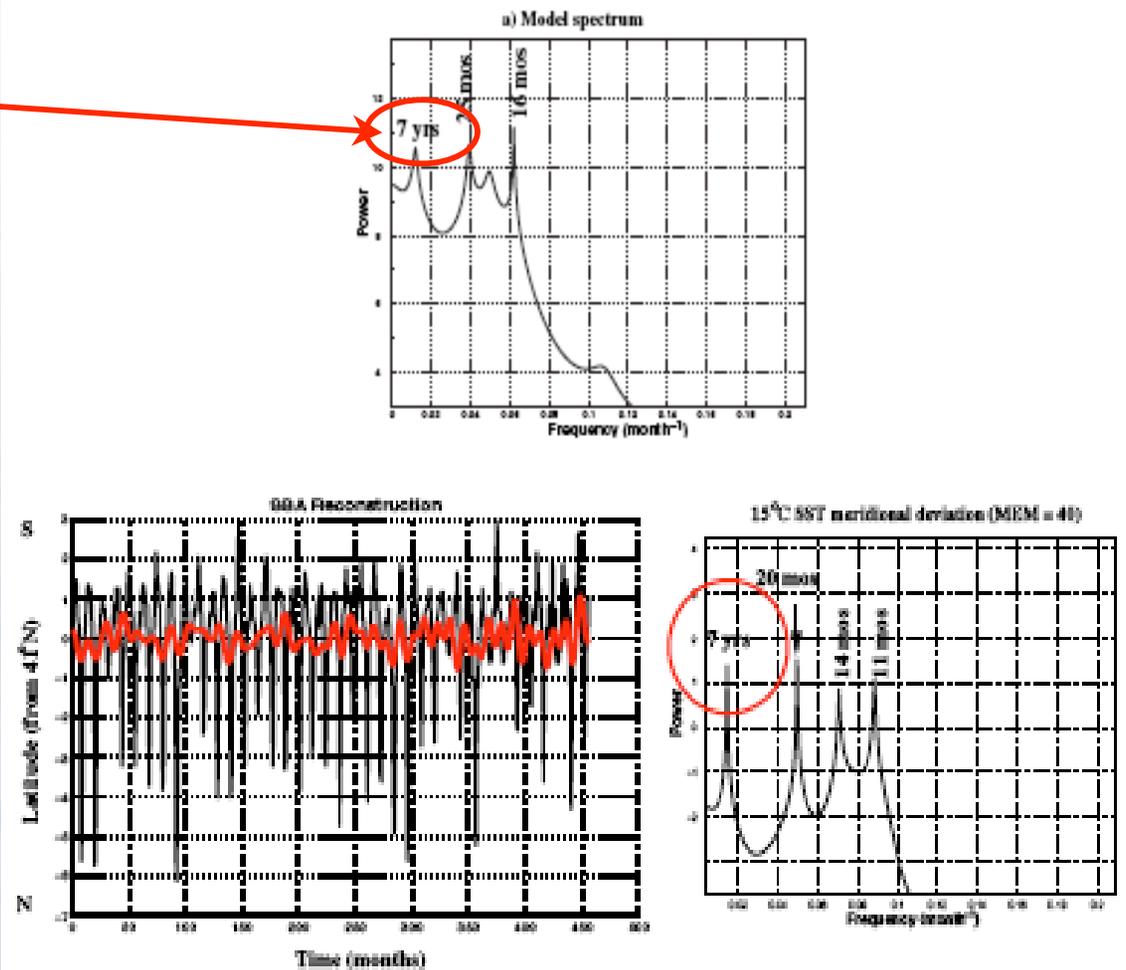


Figure 7. Comparison between low-frequency variability in an idealized double-gyre model and in observations of the Gulf Stream axis. (a) Spectral results for a 2.5-layer SW model for a basin that approximates the North Atlantic in size and shape, using an idealized wind stress. Maximum

More spatio-temporal data

Multi-channel SSA analysis of the UK Met Office monthly mean SSTs for the century-long 1895–1994 interval

Marked similarity with the 7–8-year “gyre mode” of a full hierarchy of ocean models, on the one hand, and with the North Atlantic Oscillation (NAO), on the other: explanation?

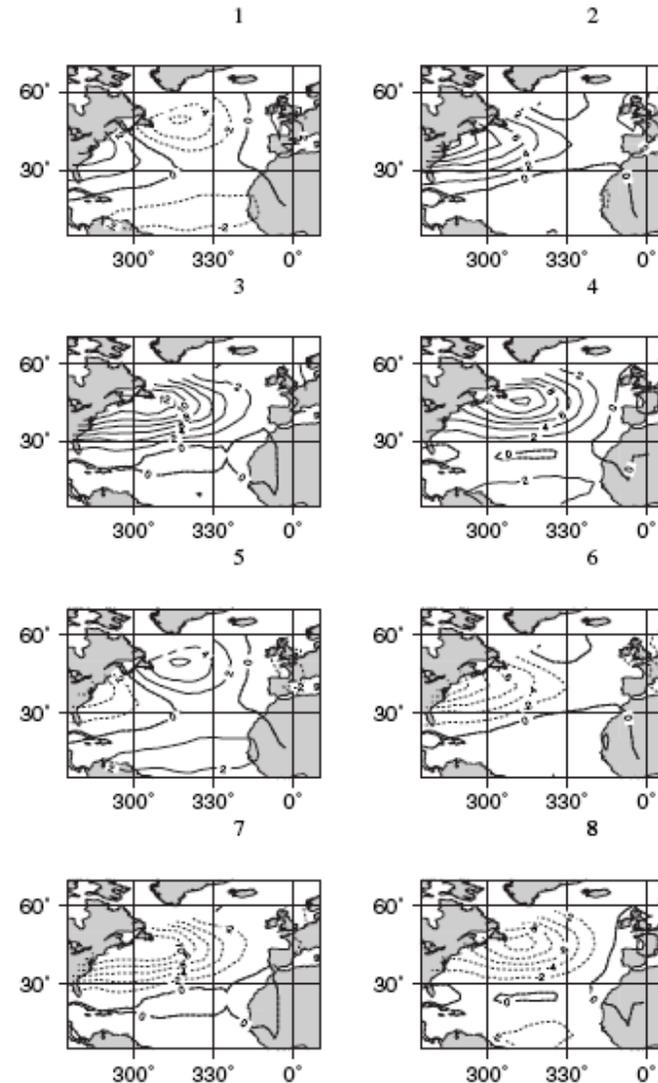
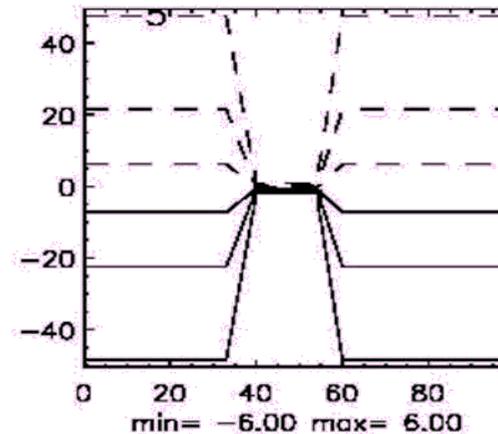


Figure 8. Phase composites of the reconstructed 7–8-year SST oscillation. The MSSA window length is 40 year and the contour interval is 0.02°C.

Outline

- ◆ Introduction: the NAO and the oceans' wind-driven circulation
- ◆ The low-frequency variability of the double-gyre circulation
 - bifurcations in a toy model
 - => multiple equilibria, periodic and chaotic solutions
 - some intermediate model results
- ◆ **Atmospheric impacts**
 - simple and intermediate models + GCMs
- ◆ Some data analysis – atmospheric and oceanic
- ◆ A very promising coupled O–A model
- ◆ Conclusions
 - The coupled climate system: is it the tail or the dog?
 - Natural climate variability: a source of decadal predictability
- ◆ Some references

Atmospheric impact of mid-latitude SST anomalies: A highly contentious issue



- ◆ A quasi-geostrophic (QG) atmospheric model in a periodic β -channel, first barotropic (Feliks *et al.*, *JAS*, 2004; FGS'04), then baroclinic (FGS'07).
- ◆ Marine atmospheric boundary layer (ABL), analytical solution.
- ◆ Forcing by idealized oceanic SST front.

Ocean-atmosphere coupling mechanism (II)

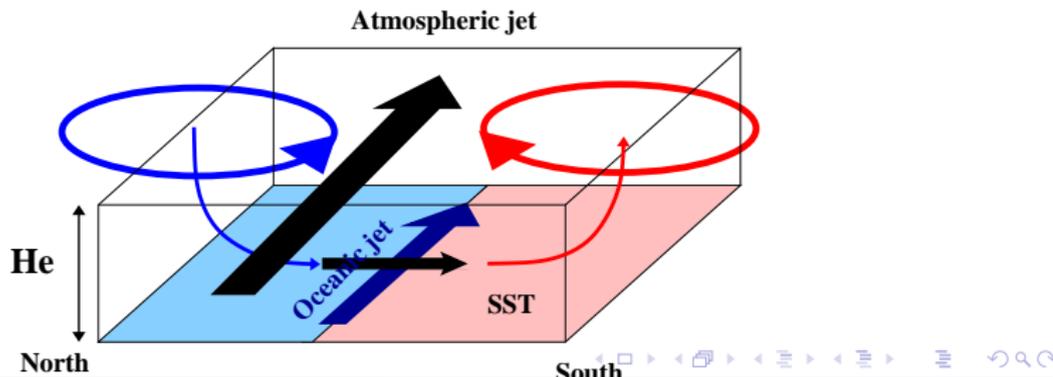
Vertical velocity at the top of the marine ABL

- The nondimensional $w(H_e)$ is given by

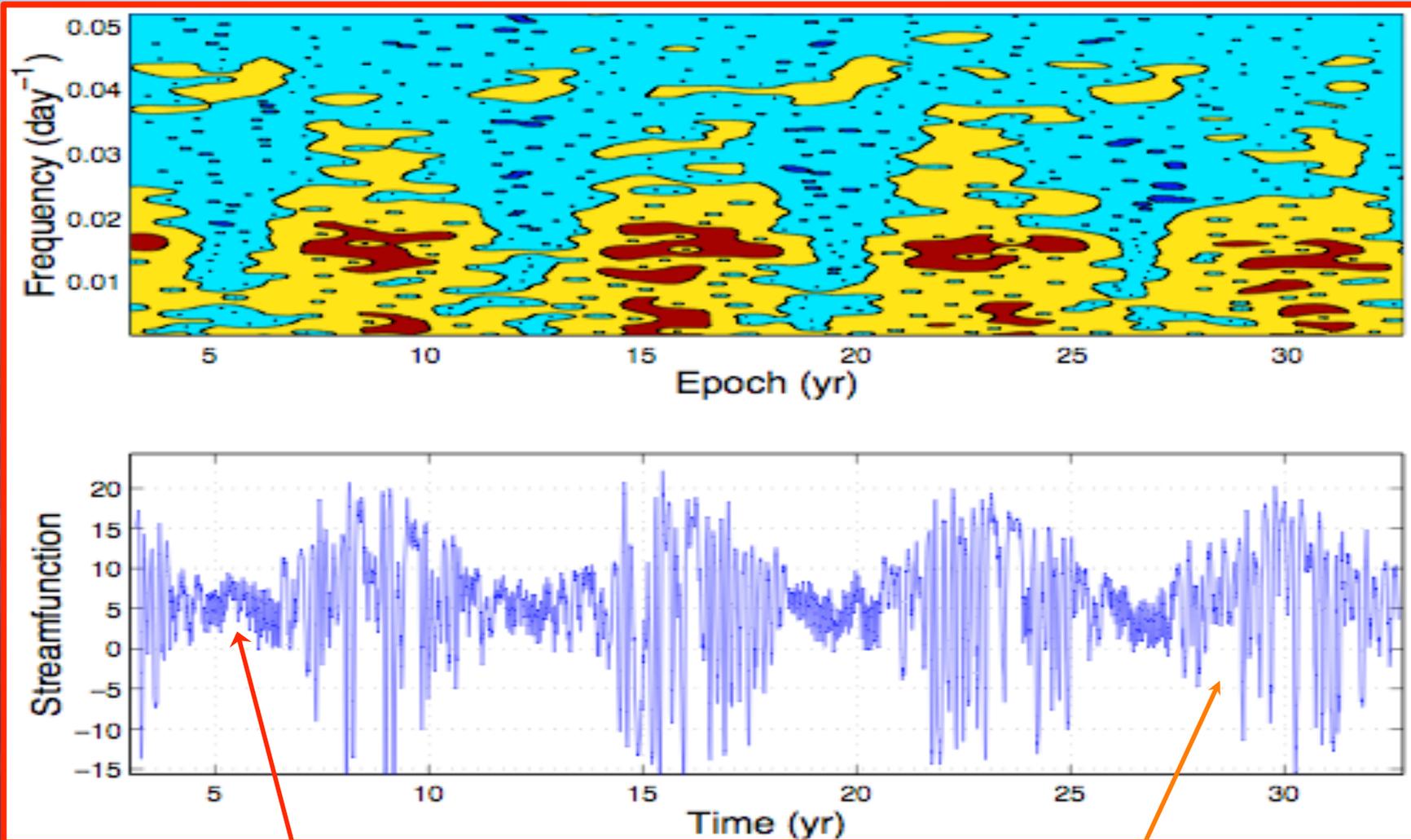
$$w(H_e) = \left[\gamma \zeta_g - \alpha \nabla^2 T \right],$$

with $\gamma = c_1(f_0 L/U)(H_e/H_a)$ and $\alpha = c_2(g/T_0 U^2)(H_e^2/H_a)$, where H_a is the layer depth of the free atmosphere (~ 10 km), and ζ_g the atmospheric geostrophic vorticity.

- Two components: one **mechanical**, due to the geostrophic flow ζ_g above the marine ABL and one **thermal**, induced by the SST front.



Evolutionary spectral analysis



30-day oscillation

70-day oscillation

IPCC-class GCM: LMD-Z has zooming capability

Model set-up

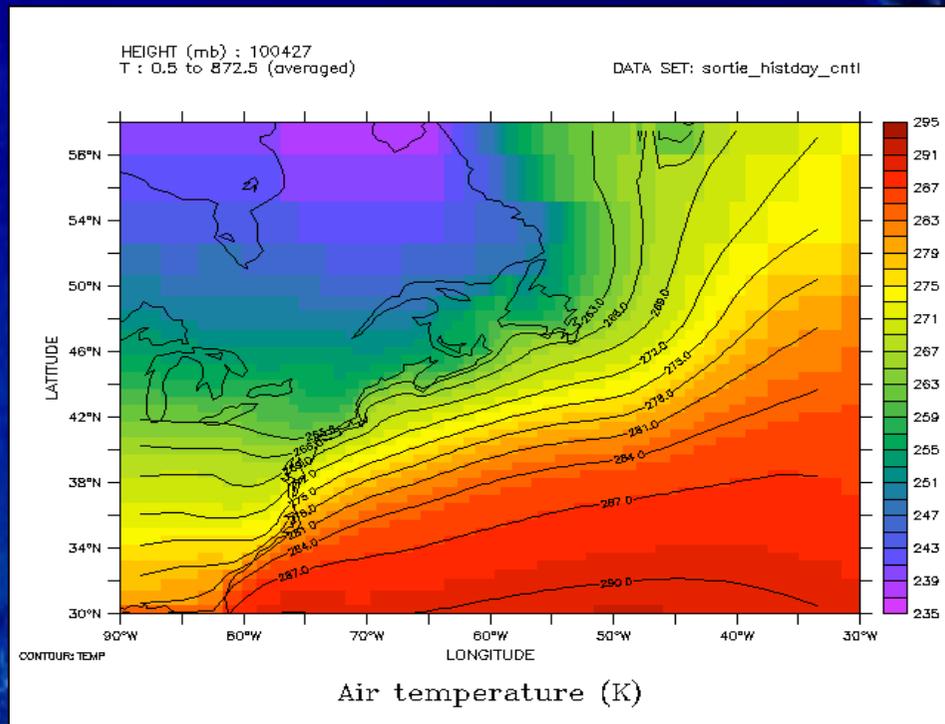
- **19 levels**, $3^\circ \times 3^\circ$ outside the zoomed area and $0.5^\circ \times 0.5^\circ$ inside it;
- **zoomed area** of (20° lat. x 40° long.), centered at ($65^\circ\text{W}, 40^\circ\text{N}$);
- **perpetual forcing**, corresponding to February 15.

3 simulations, 800-day long:

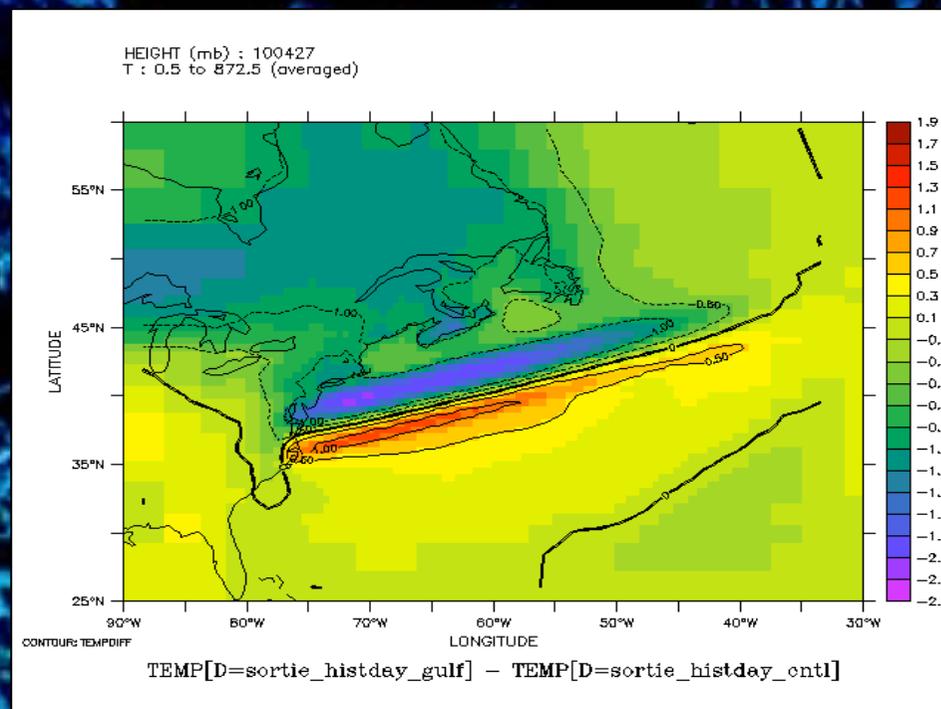
- a control simulation with the climatological SST field and no zoom;
- one with zoom and the climatological SST field still; and
- and one with zoom and a sharper SST front.

IPCC-class GCM: LMD-Z

Climatology



Superimpose $f(T) = 2\cos(x) * (-8)\sin(y)$, for a Gulf Stream that has an axis inclination of 25° to zonal.

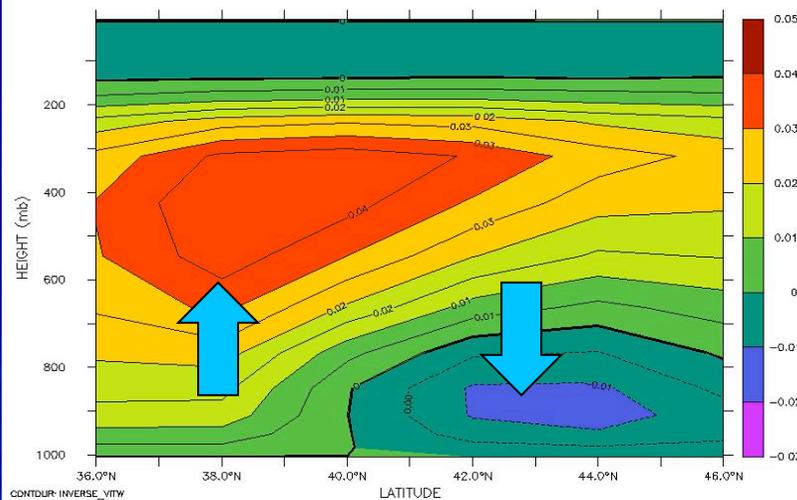


Results

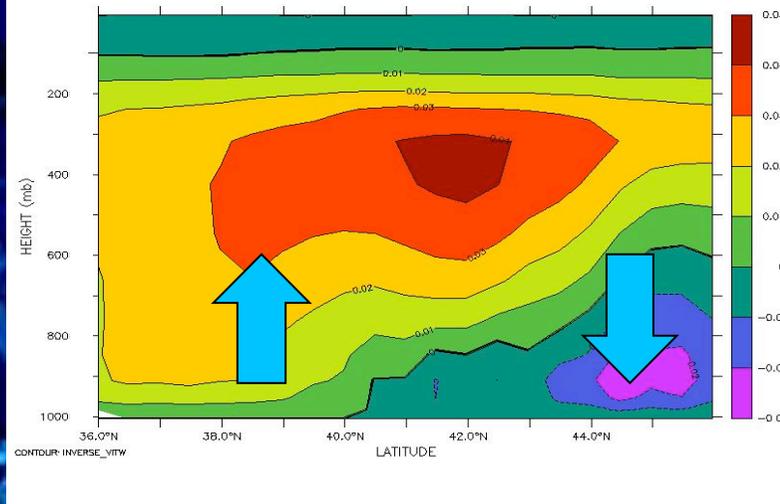
Mean w averaged from 70°W to 40°W.

Height vs. latitude cross-section; red/blue means +ve/-ve upward velocity.

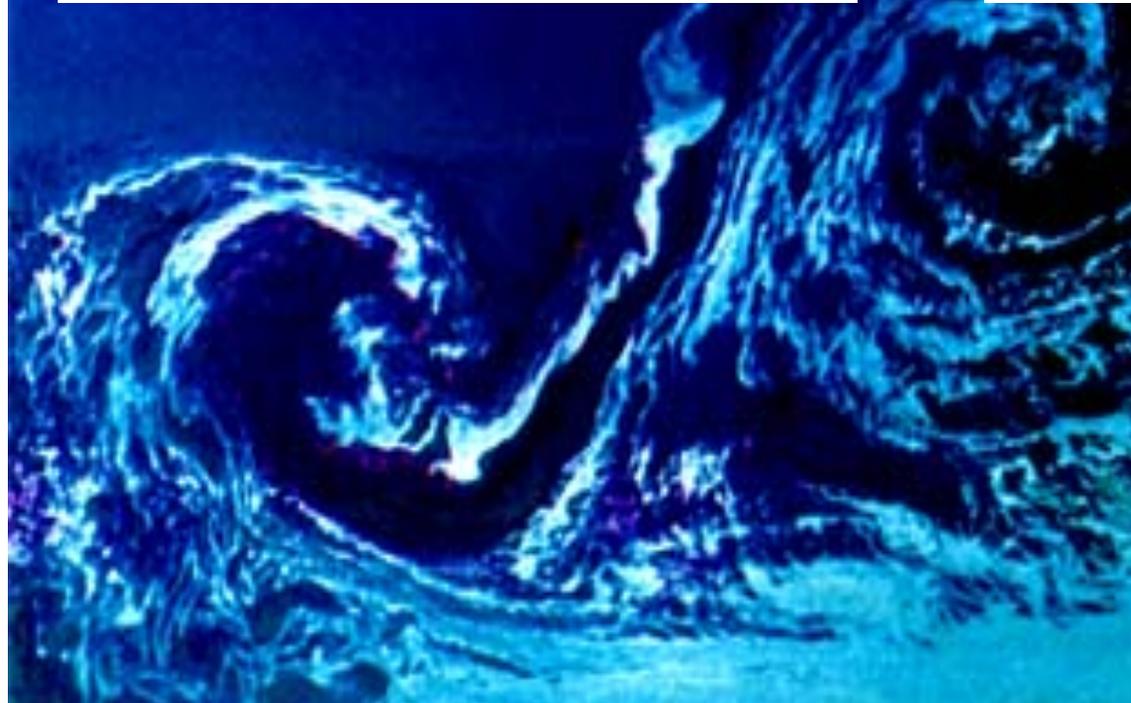
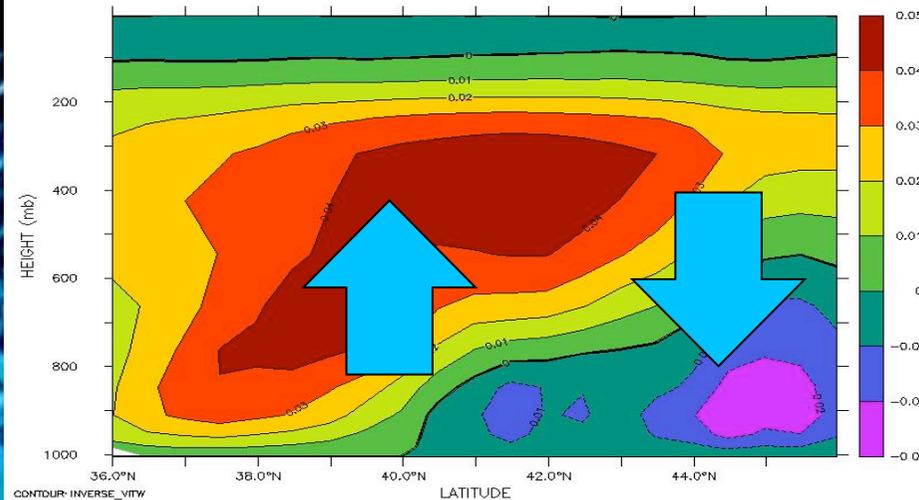
Without Zoom & without SST front



With Zoom & without SST front



With Zoom & with SST front

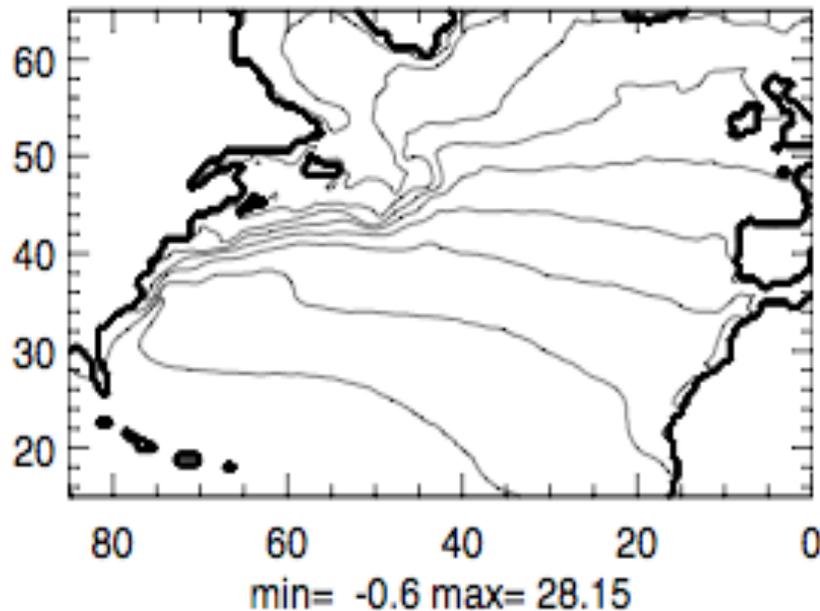


Outline

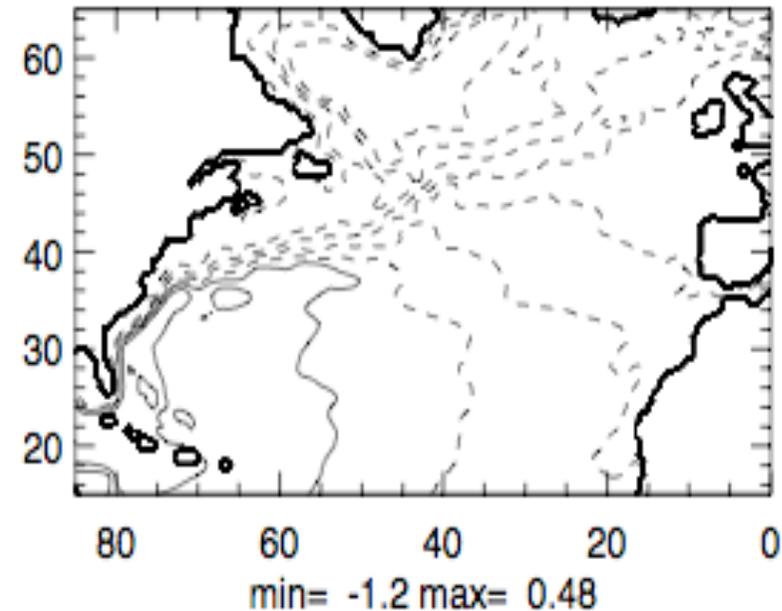
- ◆ Introduction: the NAO and the oceans' wind-driven circulation
- ◆ The low-frequency variability of the double-gyre circulation
 - bifurcations in a toy model
 - ⇒ multiple equilibria, periodic and chaotic solutions
 - some intermediate model results
- ◆ Atmospheric impacts
 - simple and intermediate models + GCMs
- ◆ **Some data analysis** – atmospheric and oceanic
- ◆ A very promising coupled O–A model
- ◆ Conclusions
 - The coupled climate system: is it the tail or the dog?
 - Natural climate variability: a source of decadal predictability
- ◆ Some references

The 7–8-yr mode in oceanic data – I: A still contentious issue

Mean SST field



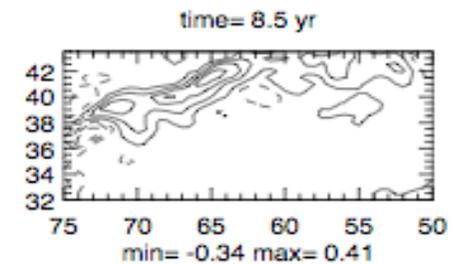
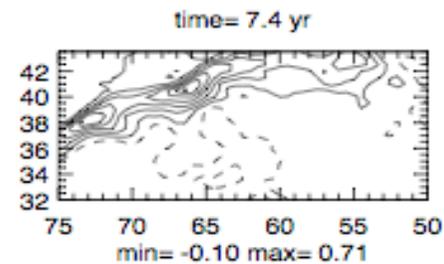
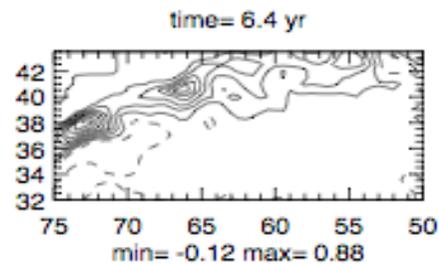
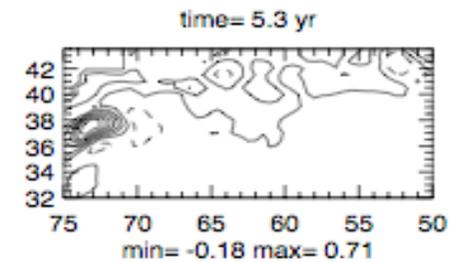
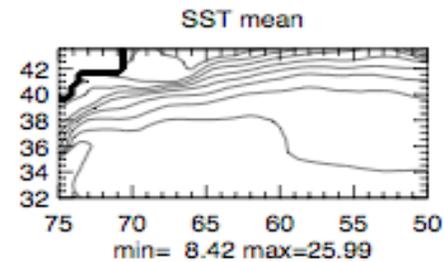
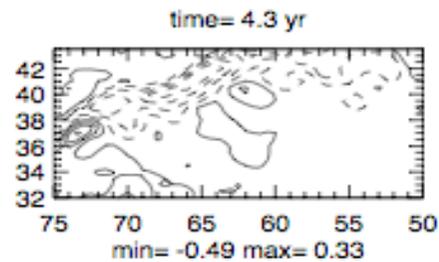
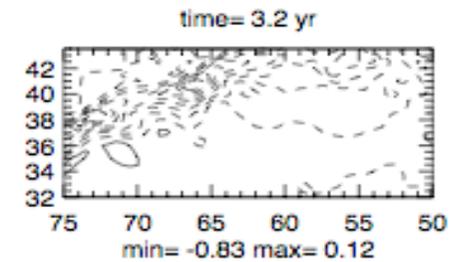
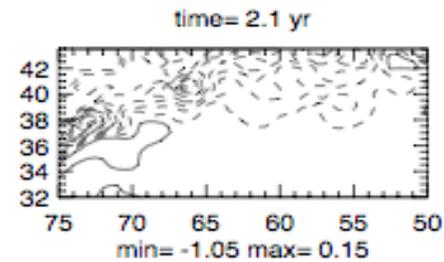
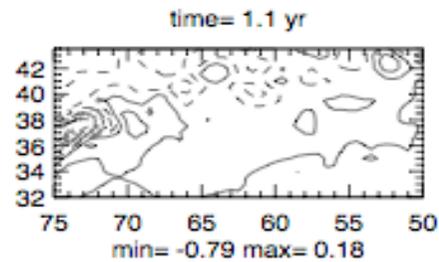
Mean SSH field



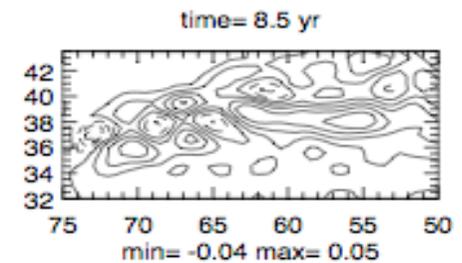
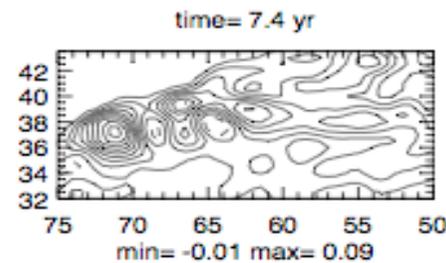
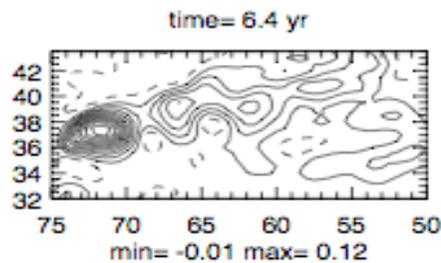
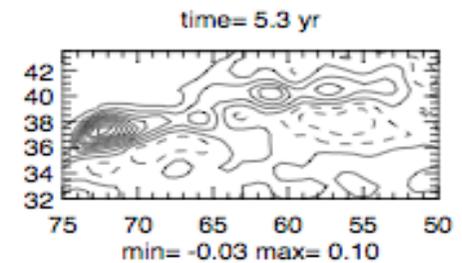
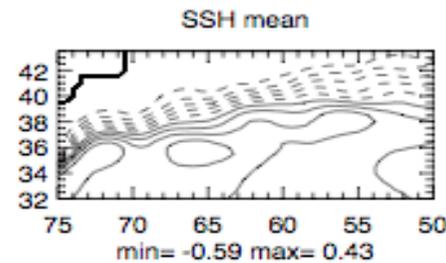
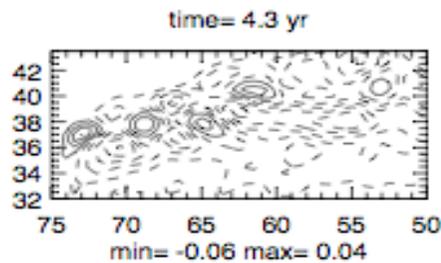
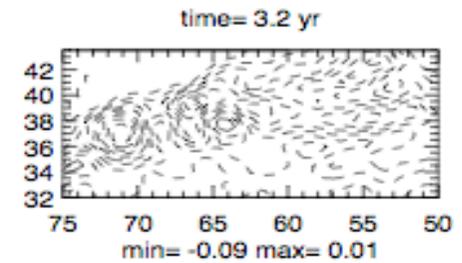
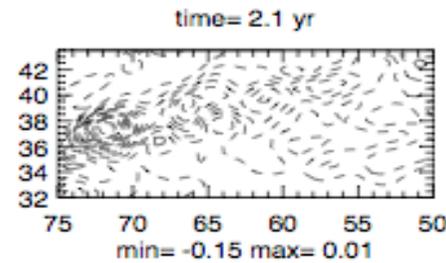
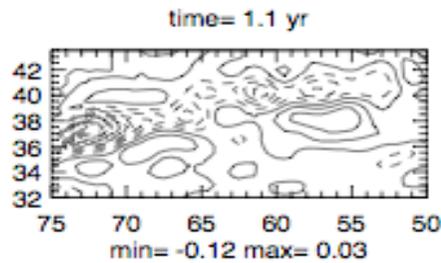
Simple Ocean Data Assimilation (SODA) reanalysis:

- ◆ Western North-Atlantic “rectangle” (28 N–42.5 N, 80 W–67.5 W);
- ◆ 50 years = Jan. 1958–Dec. 2007 (Carton and Giese, *MWR*, 2008).

The 7–8-yr mode in oceanic data – II: The SST field



The 7–8-yr mode in oceanic data – III: The SSH field

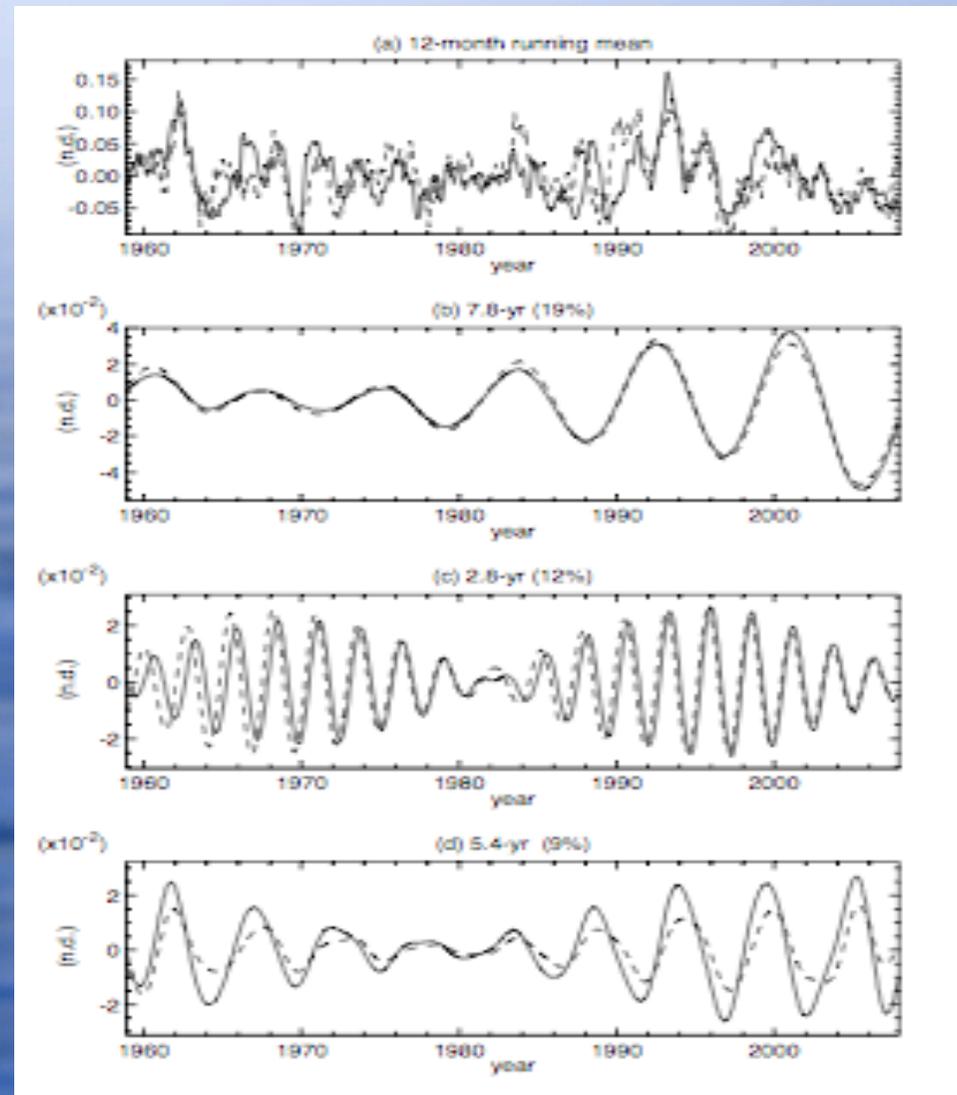


The 7–8-yr mode in atmospheric data

Likewise a contentious issue

Simulate atmospheric response to SODA data over the Gulf Stream region

- ◆ Use SST (–5 m) data from the SODA reanalysis (50 years)
- ◆ Use the FGS'07 QG model in periodic β -channel
 - baroclinic + marine ABL
- ◆ Figure shows NAO index:
 - simulated (solid)
 - observed (dashed)



Outline

- ◆ Introduction: the NAO and the oceans' wind-driven circulation
- ◆ The low-frequency variability of the double-gyre circulation
 - bifurcations in a toy model
 - ⇒ multiple equilibria, periodic and chaotic solutions
 - some intermediate model results
- ◆ Atmospheric impacts
 - simple and intermediate models + GCMs
- ◆ Some data analysis – atmospheric and oceanic
- ◆ A very promising coupled O–A model
- ◆ Conclusions
 - The coupled climate system: is it the tail or the dog?
 - Natural climate variability: a source of decadal predictability
- ◆ Some references

A model of the North Atlantic basin (I)

The next step in the modeling hierarchy

- Realistic East Coast contour, at -200 m isobath.
- An oceanic QG baroclinic model with **four layers** and internal Rossby radii from observational dataset (Mercier et al., JPO, 1993).
- Climatological, annual-mean COADS wind-stress forcing (1 deg).
- **Realistic bathymetry.**
- Transport equation for the SST relaxed to the climatological SST field.
- **Full coupling** with a QG barotropic atmosphere in a periodic β -channel, with vorticity feedback to the ocean.
- No-slip B.C.s for the ocean at the coasts parametrized following Verron and Blayo (JPO, 1996); free-slip B.C.s elsewhere.
- Neuman B.C.s for **SST** field, thus ensuring that $\int_{\Omega} \nabla^2 T \, dx = 0$.
- Free-slip and periodic B.C.s for the atmosphere.

A model of the North Atlantic basin (II)

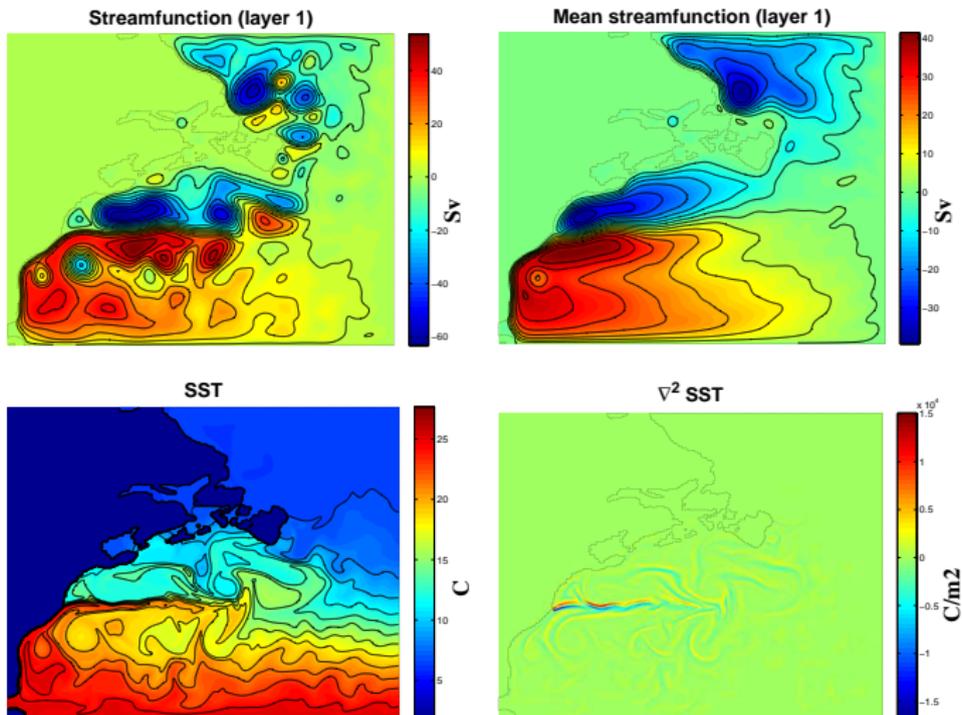
Gulf Stream (GS) separation and WBC instabilities: issues

- Correct no-slip oceanic B.C.s crucial to obtain separation at Cape Hatteras (well-known) \Rightarrow positive vorticity advected into Florida Current.
- Strong inertial flow is necessary to obtain correct GS path (see Chassignet et al., etc.); trade-off between viscosity and wind-stress intensity
 \Rightarrow **sufficiently high resolution is necessary!**
- Model is sensitive to stratification parameters: too strong baroclinic and/or bathymetric instabilities destroy GS path along Florida coast
 \Rightarrow **barotropization of the GS.**
- Occurrence of GS retroflexion: **true bimodality or model artifact?**
- **Correct stratification parameters enhance GS penetration into the ocean interior!**
- Thermal diffusivity is important to insure smoothness of the SST front w.r. to spatial resolution. It also controls the atmospheric jet strength.

**QG modeling is far more difficult than in rectangular basins
but it **works!****

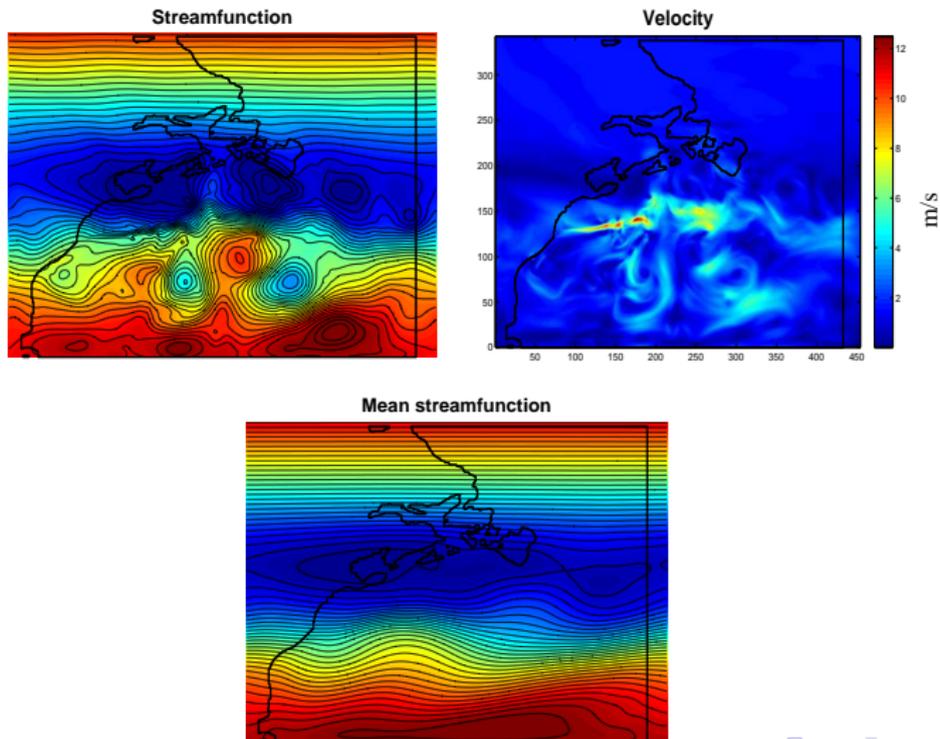
Coupled model results, at (1/9) deg resolution (I)

$$A_h|_{\text{ocean}} = 200 \text{ m}^2/\text{s}, \kappa|_{\text{SST}} = 1200 \text{ m}^2/\text{s}$$



Coupled model results, at (1/9) deg resolution (II)

$$H_e = 800 \text{ m}, A_h|_{\text{atmos}} = 400 \text{ m}^2/\text{s}$$



Concluding remarks

Summary

- We have a realistic **coupled** ocean-atmosphere **QG** model of the North Atlantic basin; **700 000** grid-point variables (ocean + SST + atmos.).
- Coupling mechanism is through Ekman pumping in the **marine ABL**.
- Persistent, **eastward atmospheric jet** $\sim 10m/s$ in the troposphere.
- Atmospheric oscillations with periods of **80 days** and 11 months.
- Interannual oscillations in the ocean and atmosphere.

Ongoing work

- Robustness of intraseasonal and interannual oscillations in the model.
- Spatio-temporal structure of the 80-day intraseasonal oscillation.
- Interannual variability in the coupled ocean-atmosphere \simeq NAO?
- Bimodality of the Gulf Stream?
- Baroclinic atmosphere.
- Finer spatial resolution: effects on the Gulf Stream and troposphere.

Outline

- ◆ Introduction: the NAO and the oceans' wind-driven circulation
- ◆ The low-frequency variability of the double-gyre circulation
 - bifurcations in a toy model
 - ⇒ multiple equilibria, periodic and chaotic solutions
 - some intermediate model results
- ◆ Atmospheric impacts
 - simple and intermediate models + GCMs
- ◆ Some data analysis – atmospheric and oceanic
- ◆ Conclusions
 - The coupled climate system: is it **the tail** or **the dog**?
 - **Natural climate variability**: a source of **decadal predictability**
- ◆ Some references

Concluding remarks

What do we know?

- There's an NAO, & it's important.
- It has decadal variability (7–8 yr).
- An oscillatory mode, albeit weak, can help prediction.

Concluding remarks

What do we know?

- There's an NAO, & it's important.
- It has decadal variability (7–8 yr).
- An oscillatory mode, albeit weak, can help prediction.

What do we know less well?

- How does the climate system really work?
- Is it the tail that wags the dog —
i.e., weather noise that drives a passive ocean?
- Or does the dog bite its tail —
i.e., coupled O–A modes of decadal variability?
- Or does the old dog ocean plain wag its tail, the atmosphere?

Concluding remarks

What do we know?

- There's an NAO, & it's important.
- It has decadal variability (7–8 yr).
- An oscillatory mode, albeit weak, can help prediction.

What do we know less well?

- How does the climate system really work?
- Is it the tail that wags the dog —
i.e., weather noise that drives a passive ocean?
- Or does the dog bite its tail —
i.e., coupled O–A modes of decadal variability?
- Or does the old dog ocean plain wag its tail, the atmosphere?

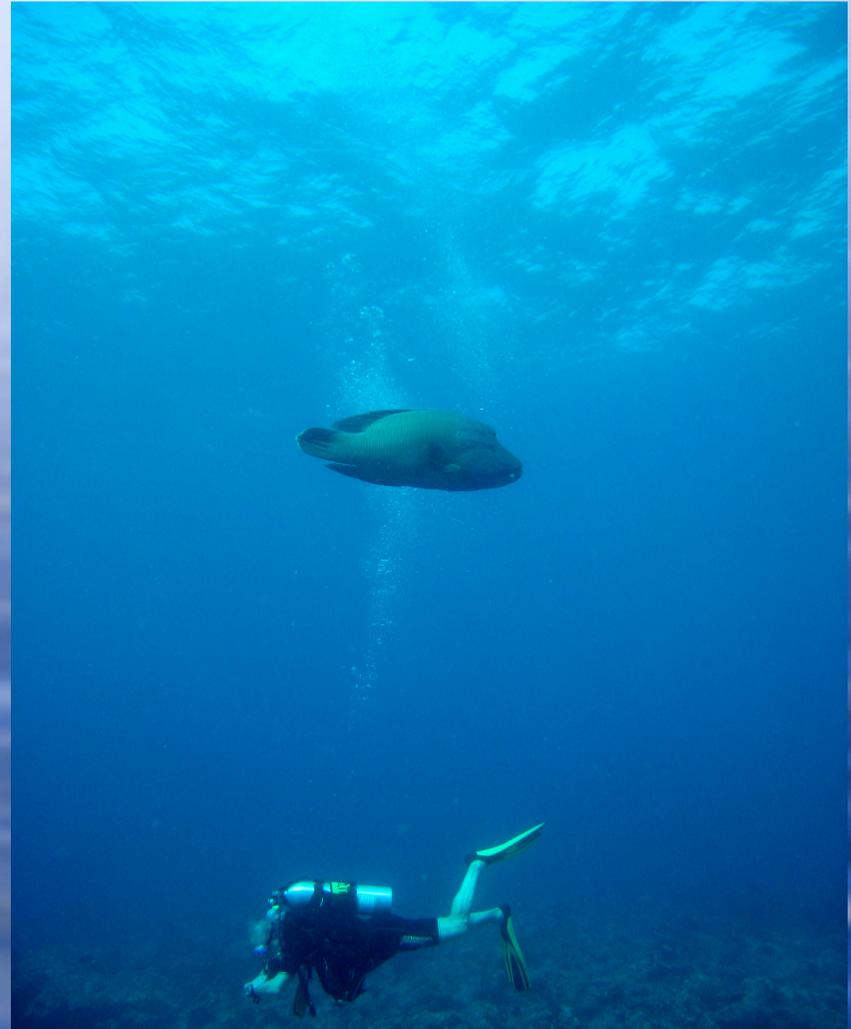
What to do?

- Work the model hierarchy, and the data!

With many thanks to numerous collaborators on related work over 15 years:



and to the 4 most recent ones:
S. Brachet, Y. Feliks,
A. W. Robertson, and
E. Simonnet!

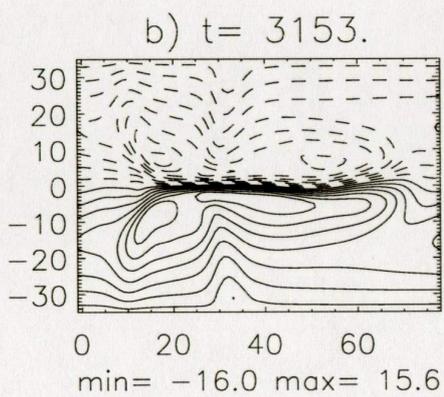
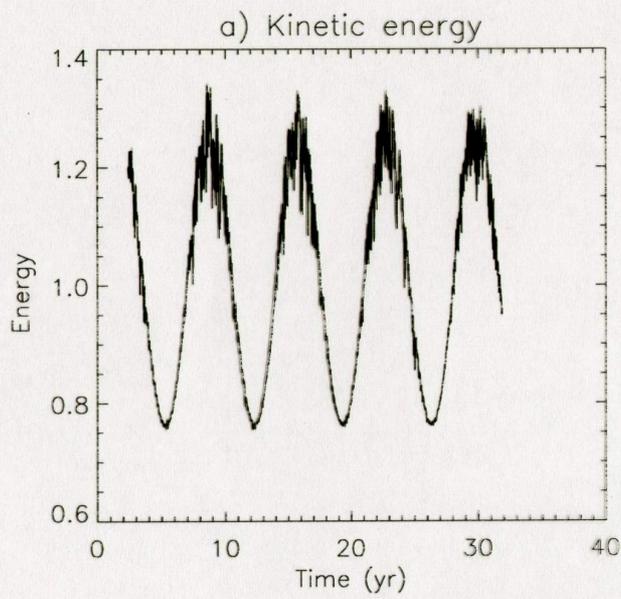


Some general references

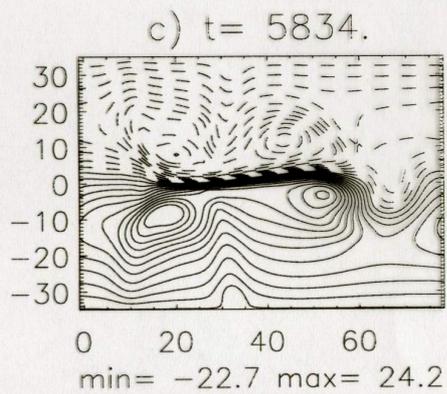
- Dijkstra, H. A., and M. Ghil, 2005: Low-frequency variability of the large-scale ocean circulation: A dynamical systems approach, *Rev. Geophys.*, **43**, RG3002, doi:10.1029/2002RG000122.
- Feliks, Y., M. Ghil and E. Simonnet, 2004: Low-frequency variability in the midlatitude atmosphere induced by an oceanic thermal front. *J. Atmos. Sci.*, **61**, 961–981.
- Ghil, M., R. Benzi, and G. Parisi (Eds.), 1985: *Turbulence and Predictability in Geophysical Fluid Dynamics and Climate Dynamics*, North-Holland,., 449 pp.
- Ghil, M., 2001: Hilbert problems for the geosciences in the 21st century, *Nonlin.Proc. Geophys.*, **8**, 211–222.
- Ghil, M., M.D. Chekroun, and E. Simonnet, 2008: Climate dynamics and fluid mechanics: Natural variability and related uncertainties, *Physica D*, **237**, 2111–2126, doi:10.1016/j.physd.2008.03.036 .
- Hurrell, J.W., 1995: Decadal trends in the North Atlantic Oscillation: Regional temperatures and precipitation, *Science*, **269**, 676–679.
- Jiang, S., F.-F. Jin, and M. Ghil, 1995b: Multiple equilibria, periodic, and aperiodic solutions in a wind-driven, double-gyre, shallow-water model, *J. Phys. Oceanogr.*, **25**, 764–786.
- Veronis, G., 1963: An analysis of wind-driven ocean circulation with a limited number of Fourier components. *J. Atmos. Sci.*, **20**, 577–593.
- Veronis, G., 1966: Wind-driven ocean circulation. Part II: Numerical solution of the nonlinear problem. *Deep-Sea Res.*, **13**, 30–55.
- Walker, G., 1931: On periodicity in series of related terms. *Proc. Roy. Soc. (London) Ser. A*, **131**, 518–532.
- Walker, G. T., and E. W. Bliss, 1932: World Weather V. *Mem. Roy. Meteor. Soc.*, **4**, 53–84.

Reserve slides

Forced 7-yr cycle

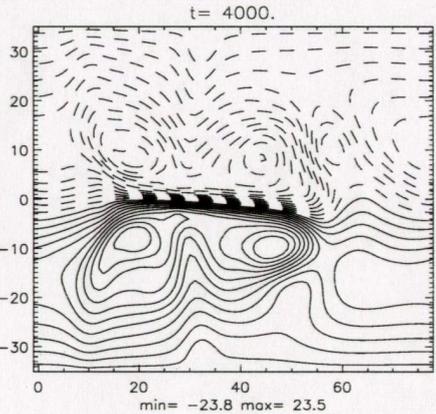
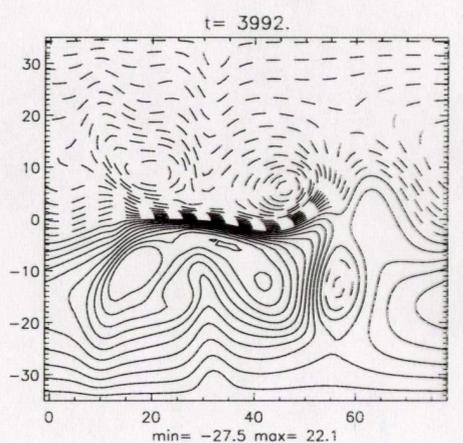
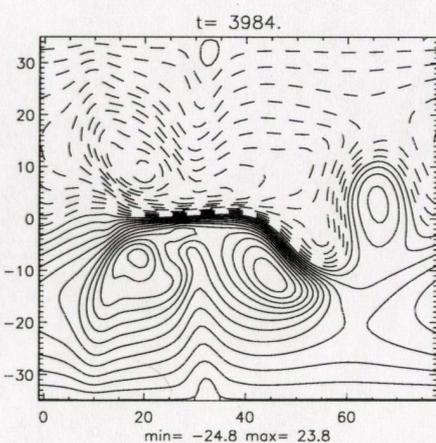
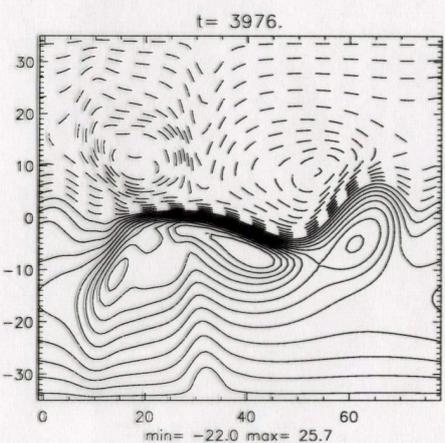
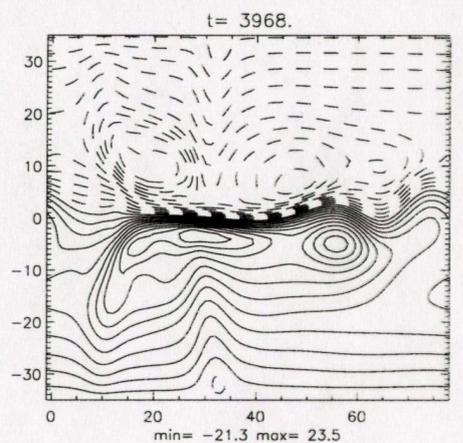
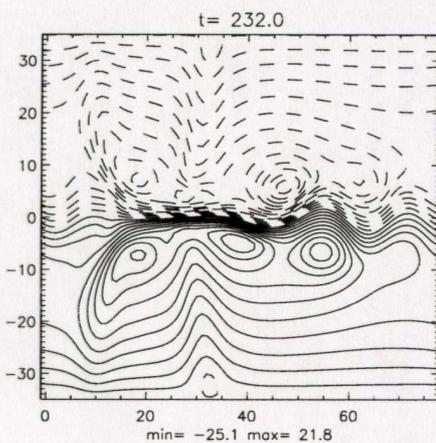
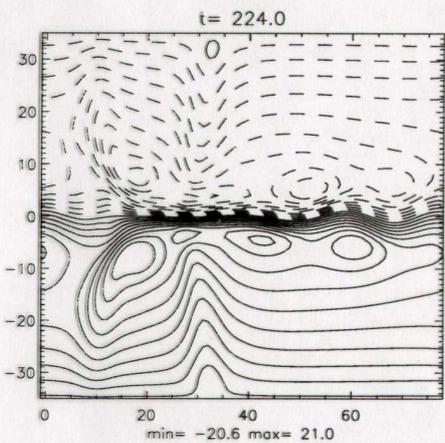
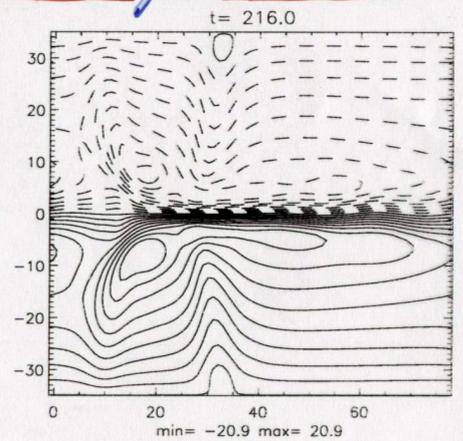
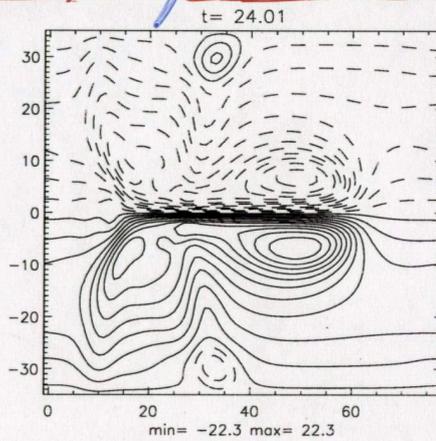
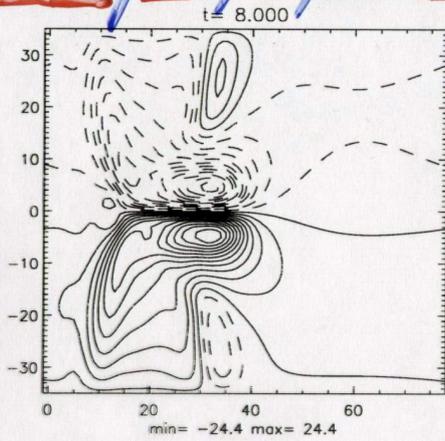


Low-energy phase



High-energy phase

Spin-up of free-atmospheric streamfunction



Appendix. Model equations

Oceanic QG equations ($i = 1, 4$)

$$\partial_t \mathbf{q}_i + \mathbf{J}(\psi_i, \mathbf{q}_i) + \beta \partial_x \psi_i = \nu_i \nabla^4 \psi_i + \delta_{i1} (\sigma \gamma \nabla^2 \psi_a + \nabla \times \mathcal{H}(\mathbf{x}, \mathbf{y})),$$

$$\mathbf{q}_i = \nabla^2 \psi_i - \mathbf{S}_{i+1}(\psi_i - \psi_{i+1}) - \mathbf{S}_{i-1}(\psi_i - \psi_{i-1}) + \delta_{i4} \mathbf{c}_b \mathcal{B}(\mathbf{x}, \mathbf{y})$$

SST equation

$$\partial_t T + \mathbf{J}(\psi_1, T) = \kappa \nabla^2 T + \chi(\bar{T} - T)$$

Atmospheric QG equation

$$\partial_t \mathbf{q}_a + \mathbf{J}(\psi_a, \mathbf{q}_a) + \beta \partial_x \psi_a = \nu_a \nabla^4 \psi_a - \gamma \nabla^2 \psi_a + \alpha \nabla^2 T.$$

Can we, nonlinear people, help?

The uncertainties
might be *intrinsic*,
rather than mere
“tuning problems”

If so, maybe
*stochastic structural
stability could
help!*

Might fit in nicely with
recent taste for
“stochastic
parameterizations”

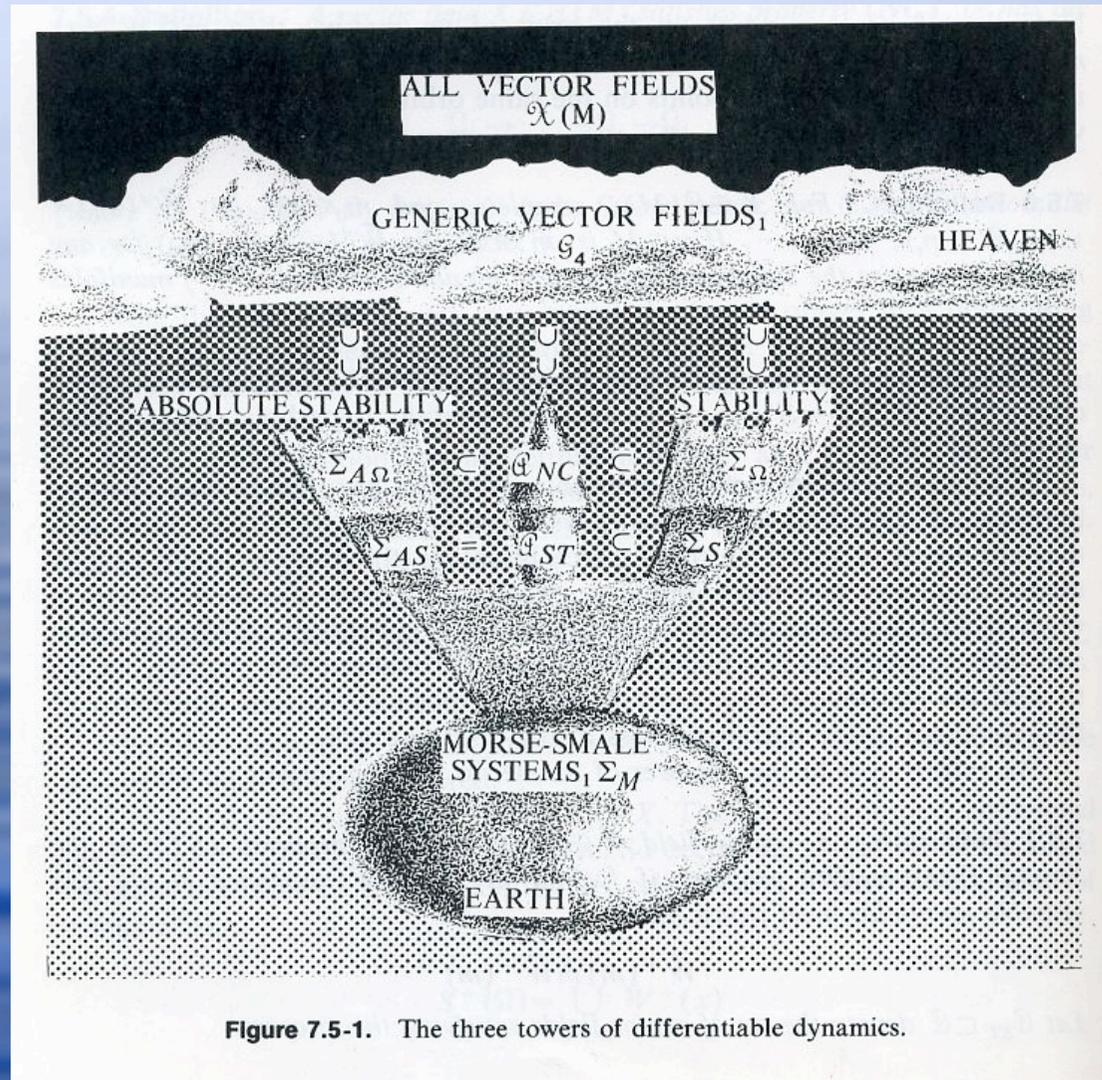


Figure 7.5-1. The three towers of differentiable dynamics.

The DDS dream of structural stability (from Abraham & Marsden, 1978)