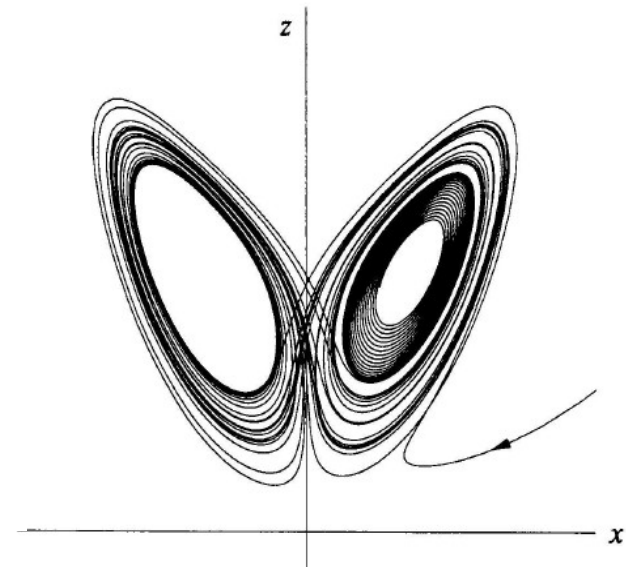
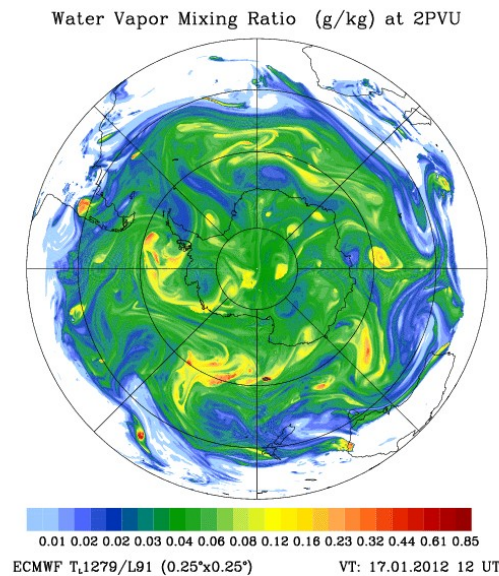
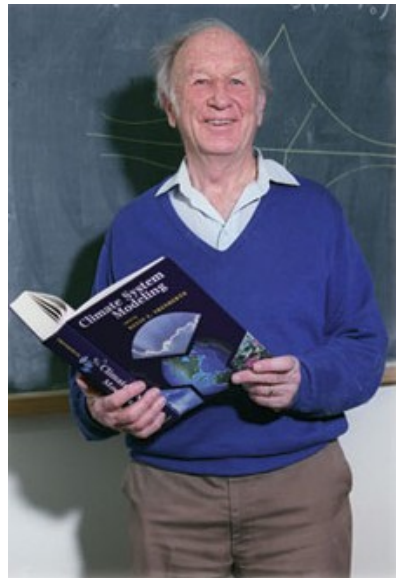


# Edward Lorenz: Predictability

Master Literature Seminar, speaker: Josef Schröttele



*Edward Lorenz in 1994, Northern Hemisphere, Lorenz Attractor*

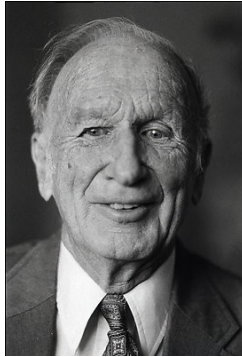
**I) Lorenz, E.N.: Deterministic Nonperiodic Flow (JAS, 1963)**

**II) Lorenz, E.N.: Predictability – a problem partly solved (1996)**

# Beyond Newton, 20<sup>th</sup> century ...



**Richardson**  
1881-1954



**Lorenz**  
1917-2008



**Mandelbrot**  
1924-2010



**Schumann et al.**



**Poincaré**  
1854-1912

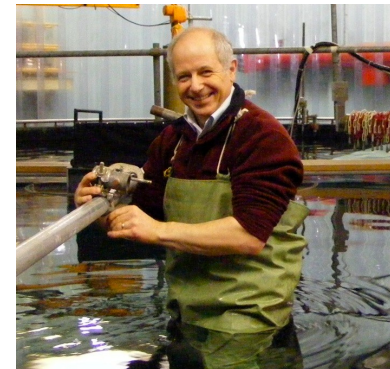
**Hide**



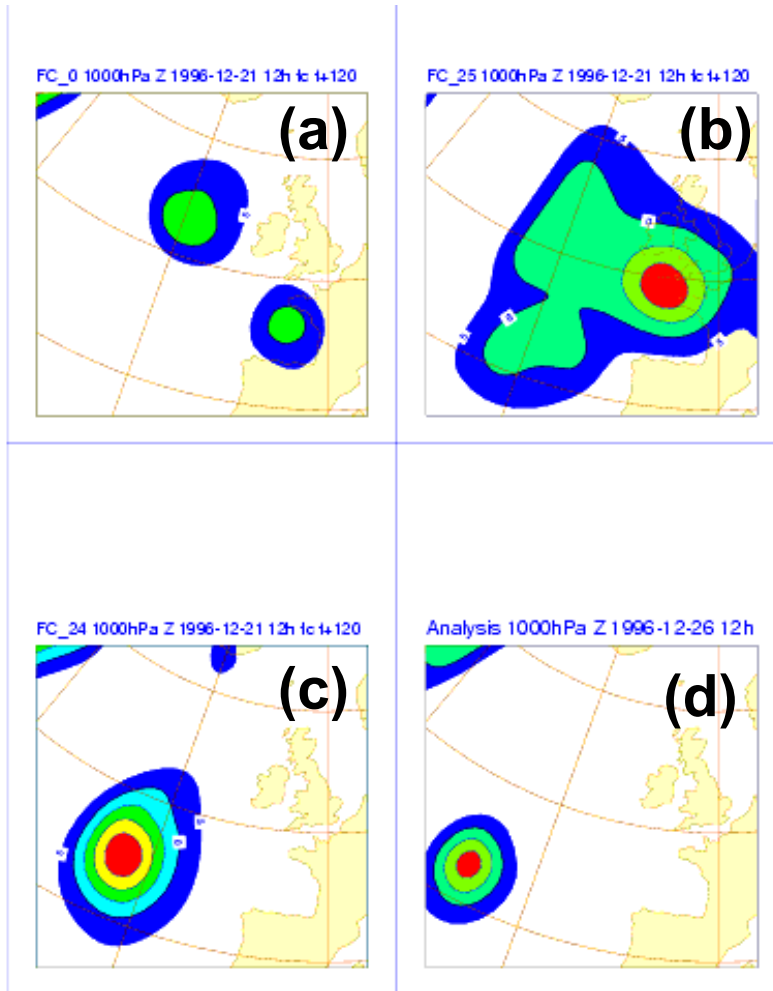
**Feigenbaum**



**Read et al.**



# Nowadays: Ensemble forecasts



Here, an **ensemble forecast** was performed for three different scenarios (a, b and c). Shown is the geopotential height field at 1000 hPa. The initial conditions were **slightly perturbed**. After the 5 day integration period, all three forecasts significantly **diverged**. Closest to the validation d is forecast c, where a **cyclone evolves** west of France over the Atlantic, less intense than predicted.

*'5 days ECMWF ensemble forecast', R. Buizza (2000):*

# Hydrodynamical System

$$\frac{\partial u}{\partial t} + \underbrace{u \frac{\partial u}{\partial x}} + \dots = -\frac{1}{\rho} \nabla p - \underbrace{\nu \Delta u} + \underline{F}$$

## CHARACTERISTICS

- Viscous dissipation

Thermal diffusion

Energy dissipation

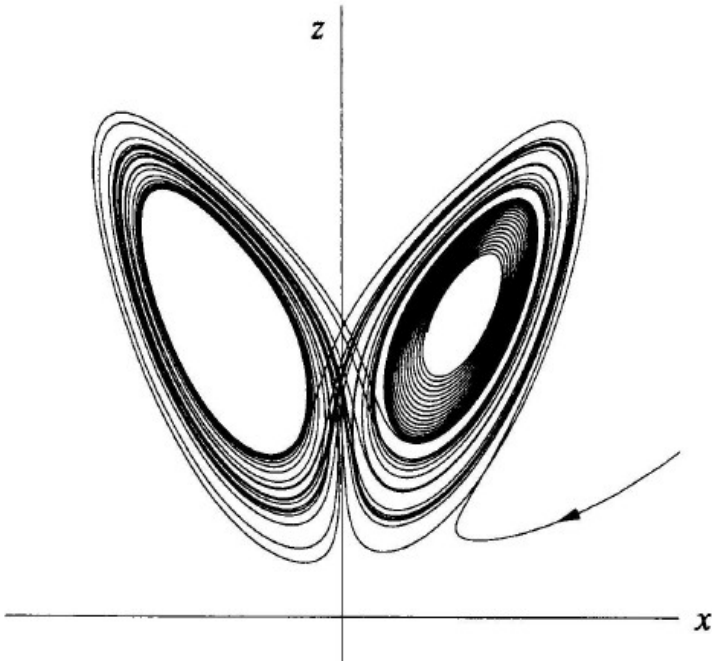
**Nonconservative** in terms of Hamiltonian mechanics

- **External** deterministic forcing (e.g. buoyancy, coriolis, centrifugal)
- Nonlinear, e.g. advection



*Convection rolls in the atmosphere*

# Lorenz 1963 Model



$$\dot{X} = -\underline{\sigma} X + \underline{\sigma} \underline{Y}$$

$$\underline{\dot{Y}} = -\underline{X} Z + \gamma X - \underline{Y}$$

$$\dot{Z} = \underline{X} \underline{Y} - \beta Z$$

## PHASE SPACE IN THE LORENZ SYSTEM

$X$  Intensity of convective motion

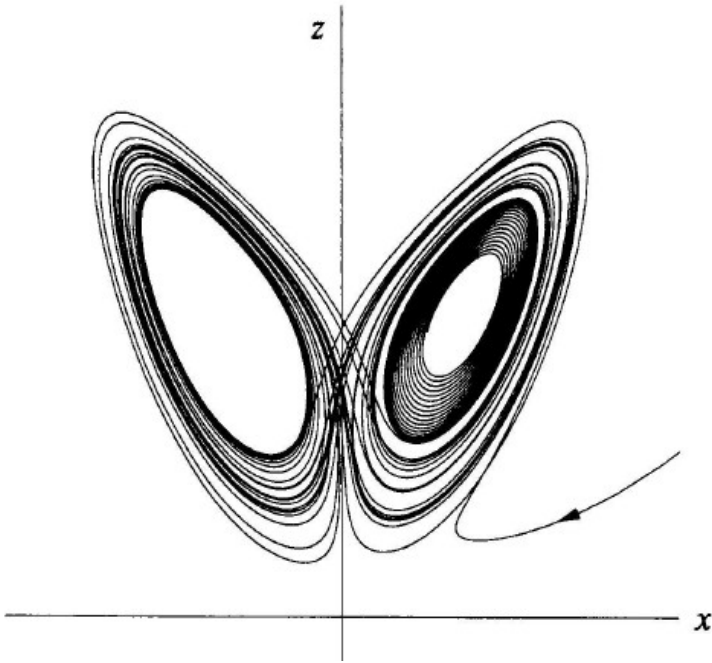
$Y$  Temperature difference of ascending/descending particles

$Z$  Distortion of vertical temperature profile

$\sigma$  Prandtl number



# Lorenz 1963 Model



$$\dot{X} = -\sigma X + \sigma Y$$

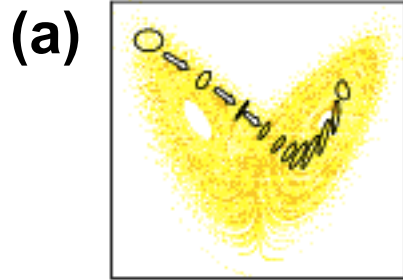
$$\dot{Y} = -XZ + \gamma X - Y$$

$$\dot{Z} = XY - \beta Z$$

## PROPERTIES

- Nonlinear
- Dissipative, Nonconservative:  $\nabla \cdot (\dot{X}, \dot{Y}, \dot{Z}) = -\sigma - 1 - b \neq 0$
- Exterior forcing due to buoyancy, temperature difference  $Y$
- Chaotic: **Lyapunov Exponent  $\lambda_1 > 0$**  exists

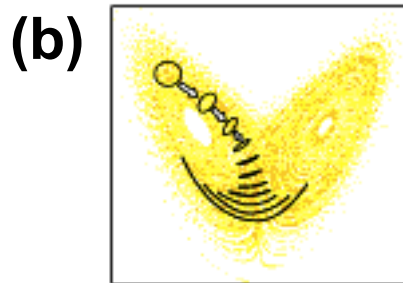
# Lorenz 1963 Model – so what?



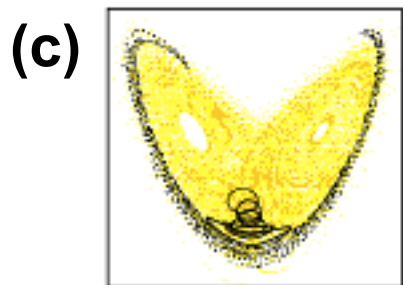
## SOLUTION

Two **fixed points** as states of steady convection:

$$(6\sqrt{2}, 6\sqrt{2}, 27) \text{ and } (-6\sqrt{2}, -6\sqrt{2}, 27)$$



Here, three experiments show the propagation of initial states in the phase space of the Lorenz system to a later stage. Considering the left and right side of the **attractor** as



a) a **forecast** is **possible**

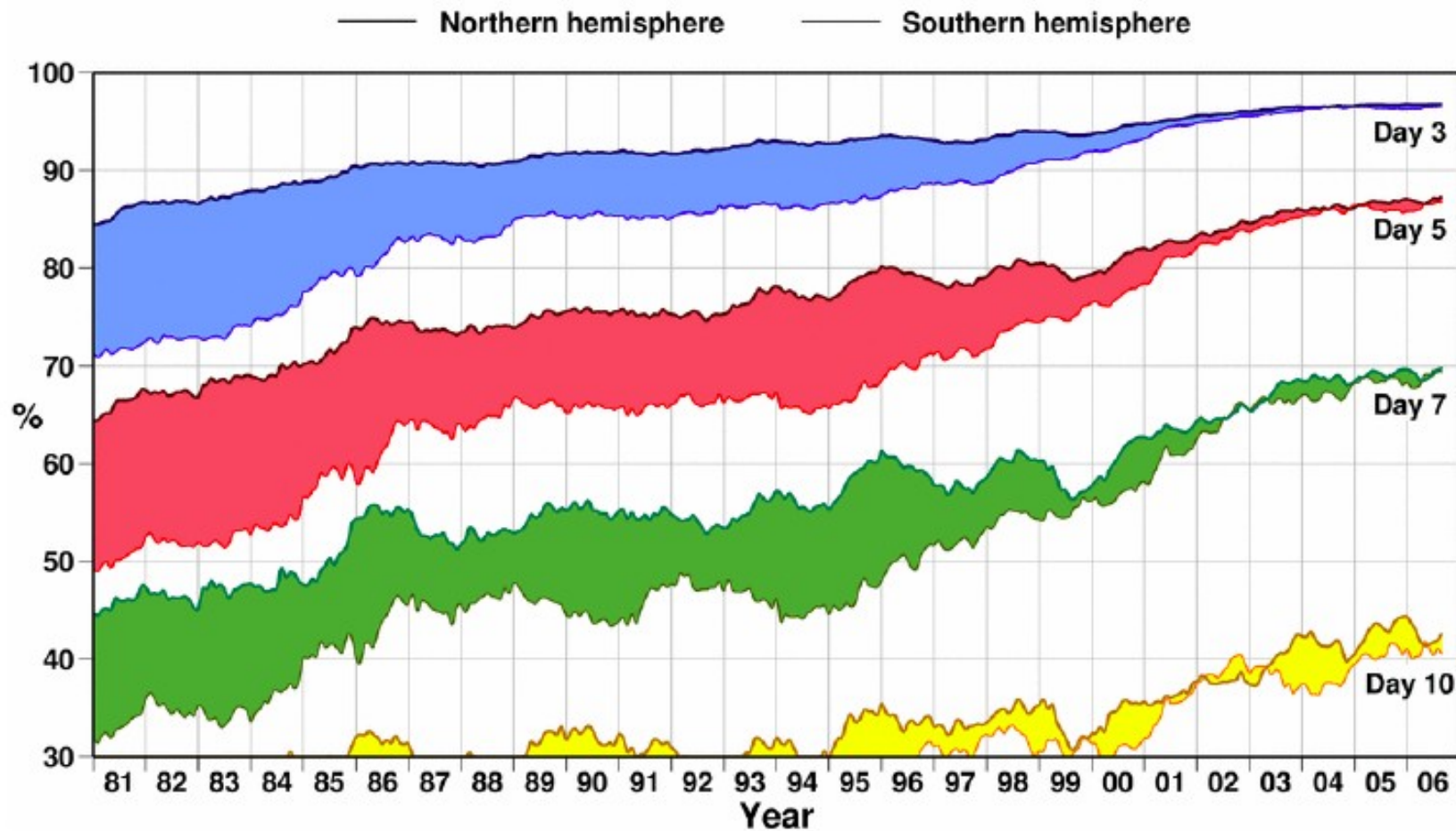
b) predictability is **limited**

c) a prediction is **not possible**

**MOVIE STROGATZ**

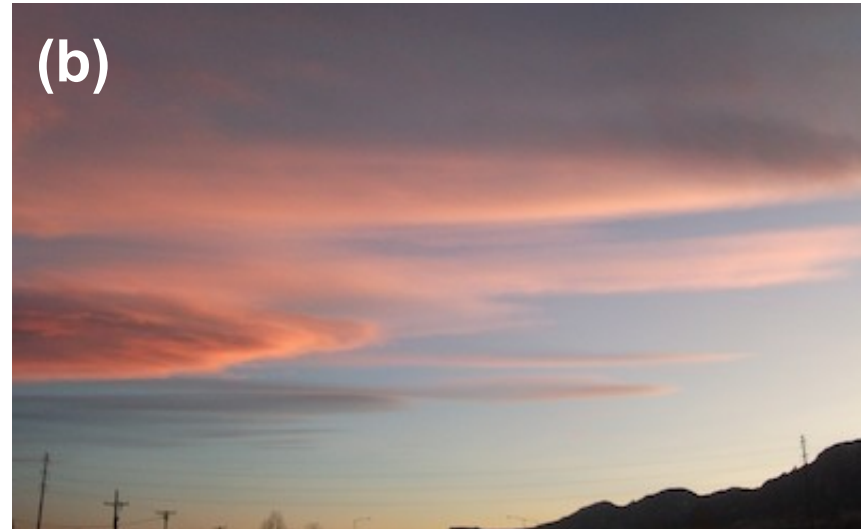
# Weather Prediction

## Anomaly correlation of 500hPa height forecasts





# Multiscale Phenomena



a) ***Cumulus clouds*** in Colorado National Park

b) ***Mountain Wave Clouds*** in Boulder, Colorado

c) ***Cumulus cloud*** in numerical simulation: Craig & Dörnbrack (JAS, 2008)

# Lorenz 1995 Model, System I

$$\frac{dX_k}{dt} = -\underbrace{X_{k-2} X_{k-1}} + \underbrace{X_{k-1} X_{k+1}} - \underbrace{X_k} + \underbrace{F}$$

## SCILAB EXPERIMENT

### PROPERTIES

- Nonlinear in advection terms, dissipative, **cyclic**
- Two advection terms conserve total energy:  $(X_1^2 + X_2^2 + \dots + X_K^2)/2$
- Exterior forcing due to buoyancy, temperature difference  $Y$
- Error **doubling time** 2.1 days

# Lorenz 1995 Model, System II

I) **Large scale** property of the atmosphere e.g. **stratification**

$$\frac{dX_k}{dt} = - \underbrace{X_{k-2} X_{k-1}} + \underbrace{X_{k-1} X_{k+1}} - \underbrace{X_k} - (hc/b) \sum_j \underbrace{Y_{j,k}}$$

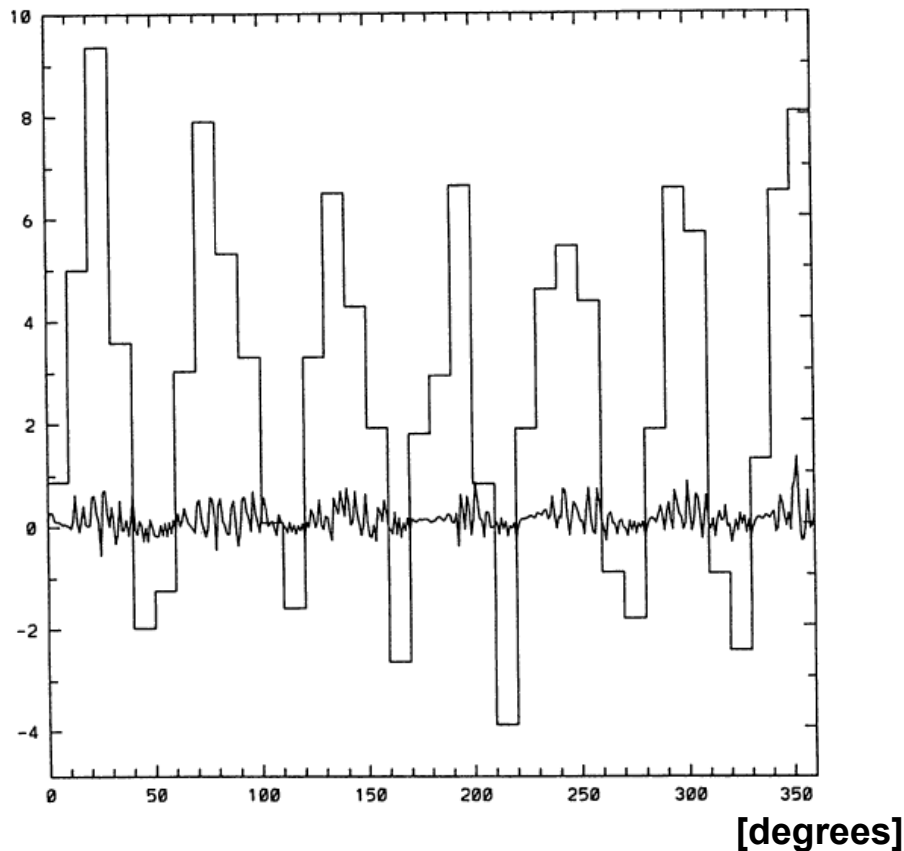
II) **Convective scale** quantity e.g. **cloud**

$$\frac{dY_{j,k}}{dt} = - \underbrace{cb Y_{j+1,k}} \left( \underbrace{Y_{j+2,k} - Y_{j-1,k}} \right) - \underbrace{c Y_{j,k}} + (hc/b) \underbrace{X_k}$$

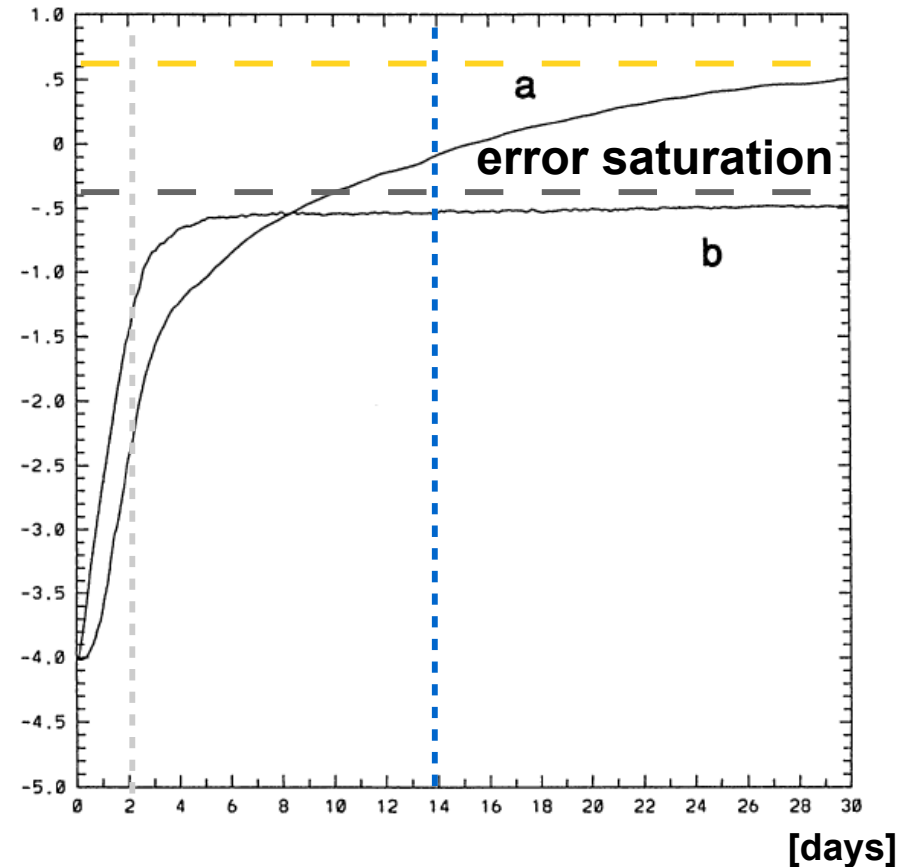
## PROPERTIES

- Nonlinear in advection terms, dissipative
- Two advection terms conserve total energy:  $(X_1^2 + X_2^2 + \dots + X_K^2)/2$
- Exterior forcing, here: coupling between the scales, **cyclic**  
with a total of  $JK$  convective scale equations,  $K = 36$  and  $J = 10$

# Lorenz 1995 Model, System II



*Convective scale motion  $Y_{j,k}$   
and large scale profile of  $X_k$*



*To determine error doubling:  
 $\log_{10} E$  of  $X_k$  (a) and  $Y_{j,k}$  (b)*

**EXPERIMENT HEINER**

# Weather Prediction – happy End?

## Orrel (JAS 2003)

- **Refining parametrizations** strong impact on **climate modeling**
- Introducing **stochastic terms** strong impact on **short term prediction**

*Lorenz 'butterfly effect' made it into a recent movie: 'An Inconvenient Truth' (2006) about former United States Vice President Al Gore. Directed by Davies Guggenheim*





## REFERENCES

**Ghil, M.** “Geophysical flows as dynamical system: the influence of Hide's experiment.” *Astronomy & Geophysics* 51 (2010) 4-28

**Lorenz, E.N.** “Deterministic Nonperiodic Flow” *J. Atmos. Sci.* 20 (1963) 130-141

**Lorenz, E.N.** “Predictability – a problem partly solved.”, *Seminar on Predictability* (1996)

**Lorenz, E.N.** “The Essence of Chaos”, *University of Washington Press* (1993)

**Orrel, D.** “Model error and predictability over different timescales in the Lorenz'96 systems” *J. Atmos. Sci.* 60 (2003) 2219-2228