

# Basic physical equations

1904: Vilhelm Bjerknes identified the “primitive equations”

These capture the flow of mass and energy in the atmosphere;

Sets out a manifesto for practical forecasting



Zonal (East-West) Wind:

$$\frac{\partial u}{\partial t} = \eta v - \frac{\partial \Phi}{\partial x} - c_p \theta \frac{\partial \pi}{\partial x} - z \frac{\partial u}{\partial \sigma} - \frac{\partial \left( \frac{u^2 + v^2}{2} \right)}{\partial x}$$

Meridional (North-South) Wind:

$$\frac{\partial v}{\partial t} = -\eta \frac{u}{v} - \frac{\partial \Phi}{\partial y} - c_p \theta \frac{\partial \pi}{\partial y} - z \frac{\partial v}{\partial \sigma} - \frac{\partial \left( \frac{u^2 + v^2}{2} \right)}{\partial y}$$

Temperature:

$$\frac{\delta T}{\partial t} = \frac{\partial T}{\partial t} + u \frac{\partial T}{\partial x} + v \frac{\partial T}{\partial y} + w \frac{\partial T}{\partial z}$$

Precipitable Water:

$$\frac{\delta W}{\partial t} = u \frac{\partial W}{\partial x} + v \frac{\partial W}{\partial y} + w \frac{\partial W}{\partial z}$$

Air pressure:

$$\frac{\partial}{\partial t} \frac{\partial p}{\partial \sigma} = u \frac{\partial}{\partial x} x \frac{\partial p}{\partial \sigma} + v \frac{\partial}{\partial y} y \frac{\partial p}{\partial \sigma} + w \frac{\partial}{\partial z} z \frac{\partial p}{\partial \sigma}$$

# Towards Numerical Forecasts

**1910s:** Lewis Fry Richardson performs the first numerical weather forecast,  
imagines a giant computer to do this regularly;  
First plan for massively parallel computation



Image Source: Lynch, P. (2008). The origins of computer weather prediction and climate modeling.



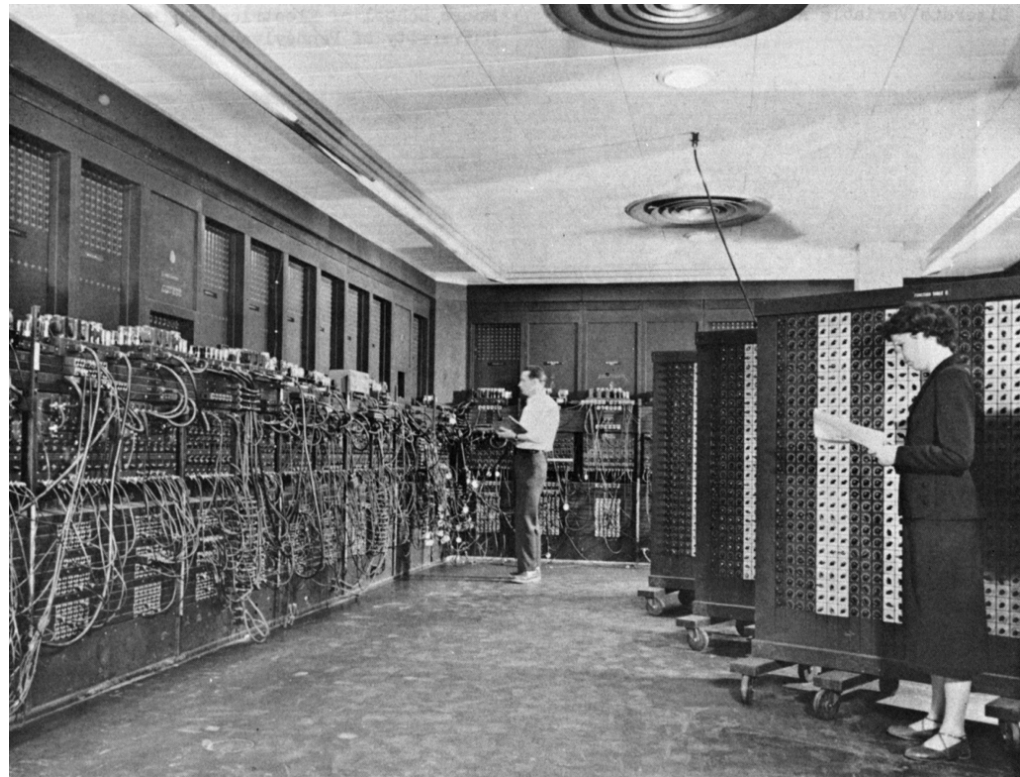
(What a forecast factory actually looks like)



The Yellowstone supercomputer at the NCAR Wyoming Supercomputing Center, Cheyenne

# First Computer Model of Weather

**1950s:** John Von Neumann develops a killer app for the first programmable electronic computer ENIAC: weather forecasting  
Imagines uses in weather control, geo-engineering, etc.



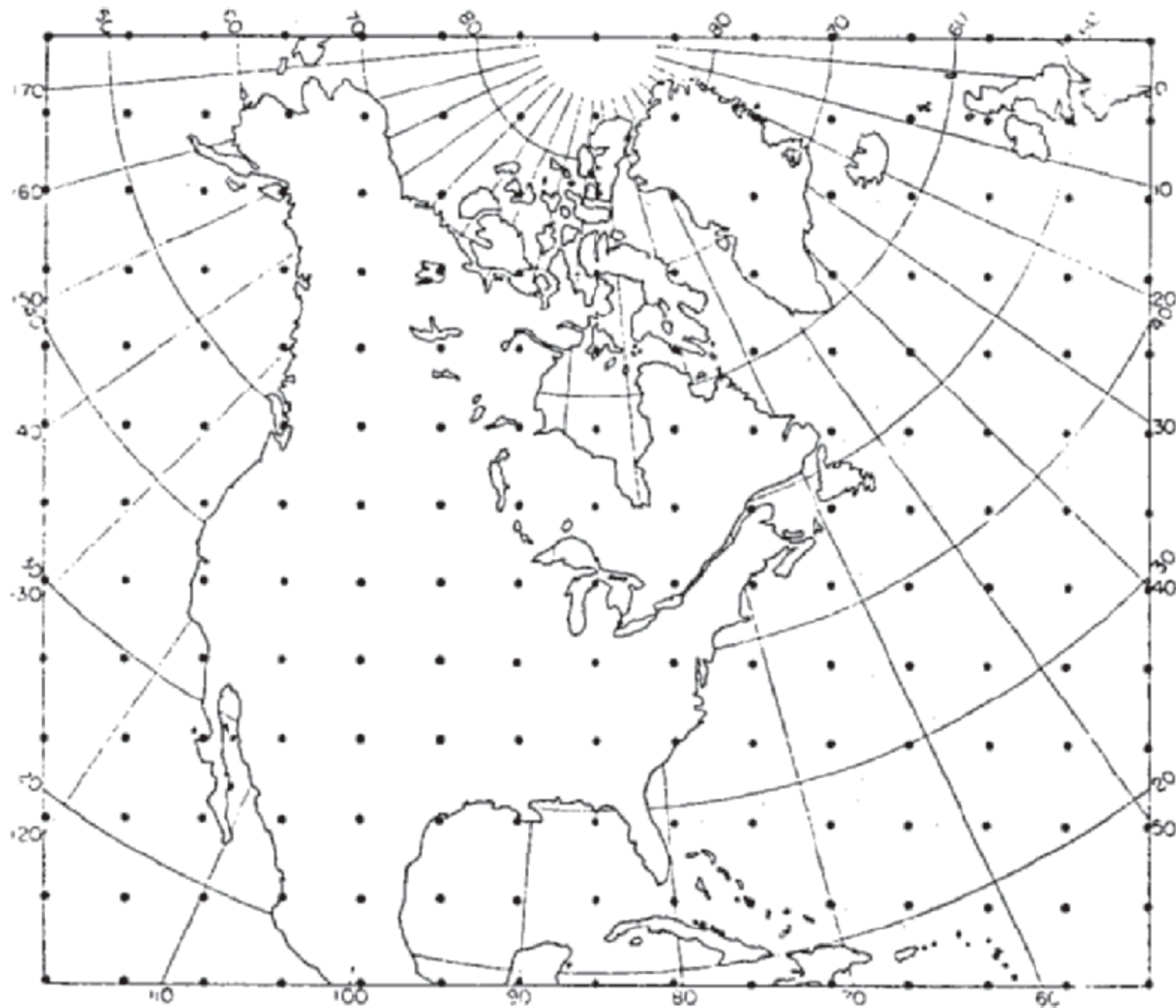
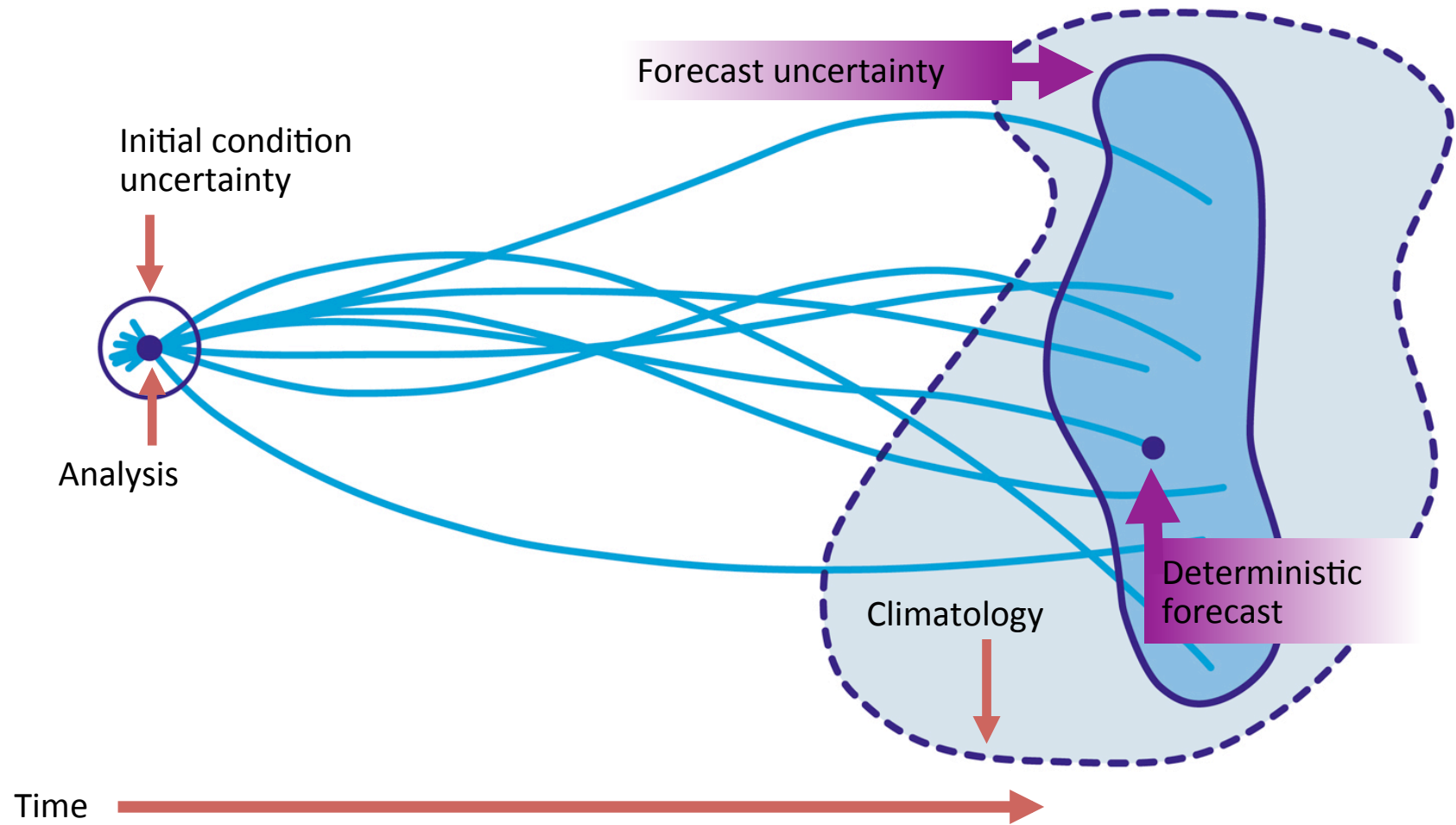
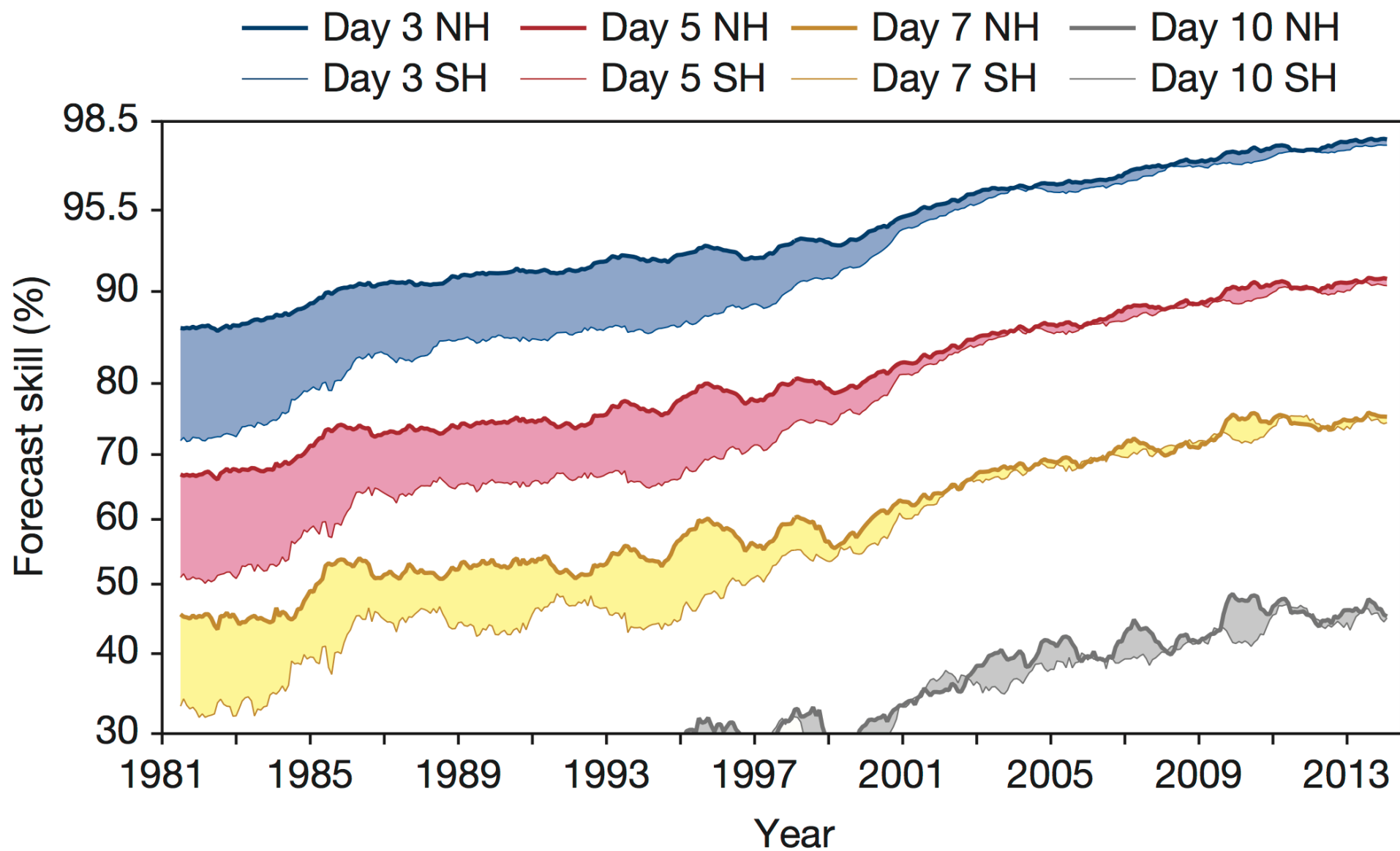


Image Source: Lynch, P. (2008). The ENIAC Forecasts: A Recreation. Bulletin of the American Meteorological Society



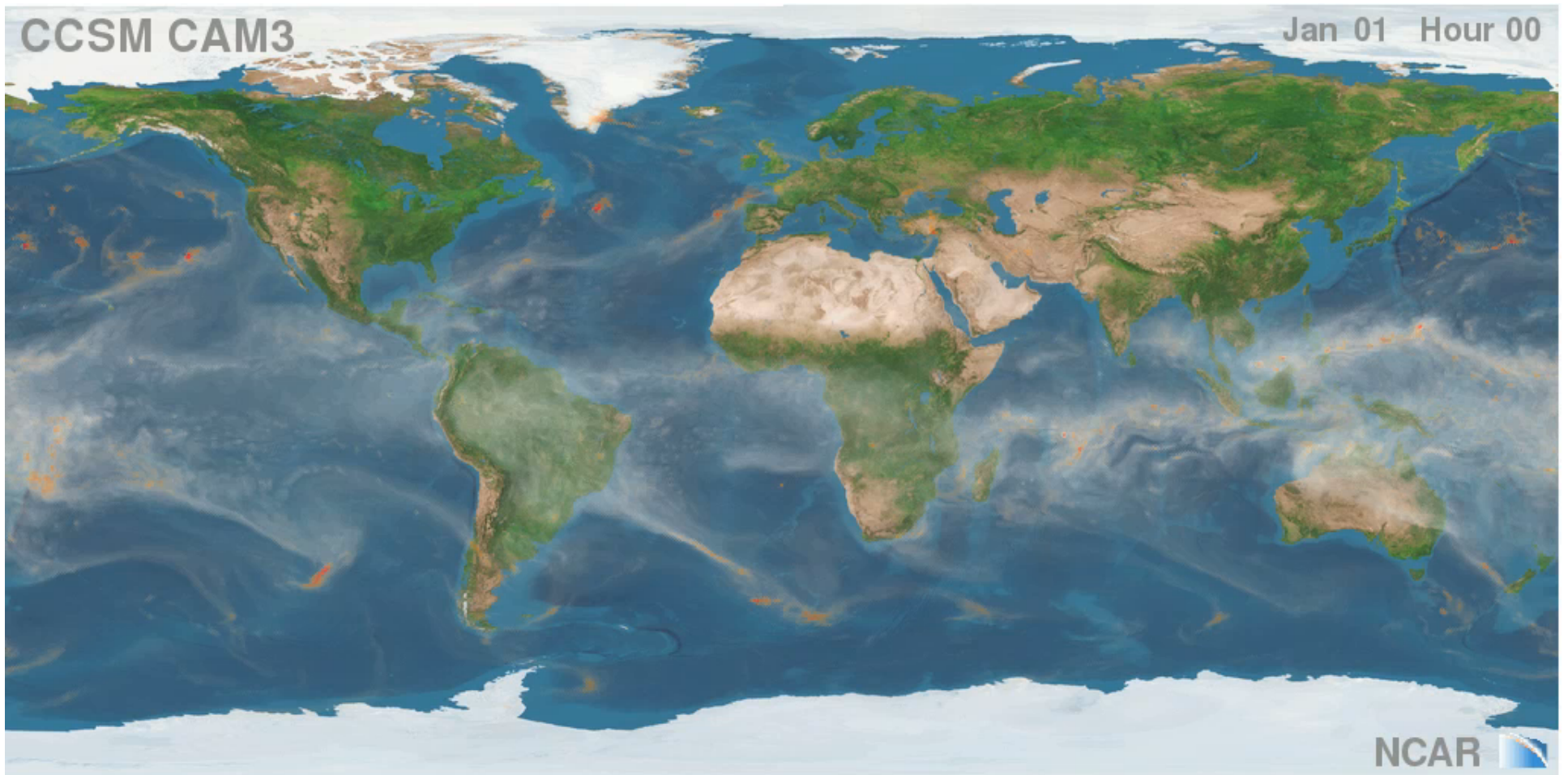
# Forecasting Weather and Climate





Bauer, P., Thorpe, A., & Brunet, G. (2015). The quiet revolution of numerical weather prediction. *Nature*, 525(7567), 47–55.

# Global Precipitation in CCSM CAM3



Source: <http://www.vets.ucar.edu/vg/T341/index.shtml>



# The discovery of Chaos

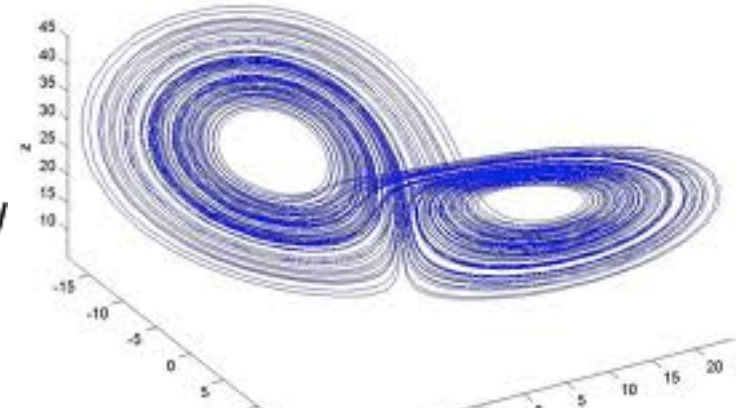
- **1950s:** Edward Lorenz discovers non-linear effects in weather forecasting, develops Chaos Theory;
  - Basis for understanding what is predictable and what isn't



$$\frac{dx}{dt} = \sigma(y - x)$$

$$\frac{dy}{dt} = x(\rho - z) - y$$

$$\frac{dz}{dt} = xy - \beta z$$





# Chaos Theory

- Chaos is not the same as randomness
- Simple rules can create chaotic patterns
- Chaos Game:

<https://trinket.io/python/7922fc9d9c>

- Lorenz's Example:

[\$x' = x^2 - C\$](#)

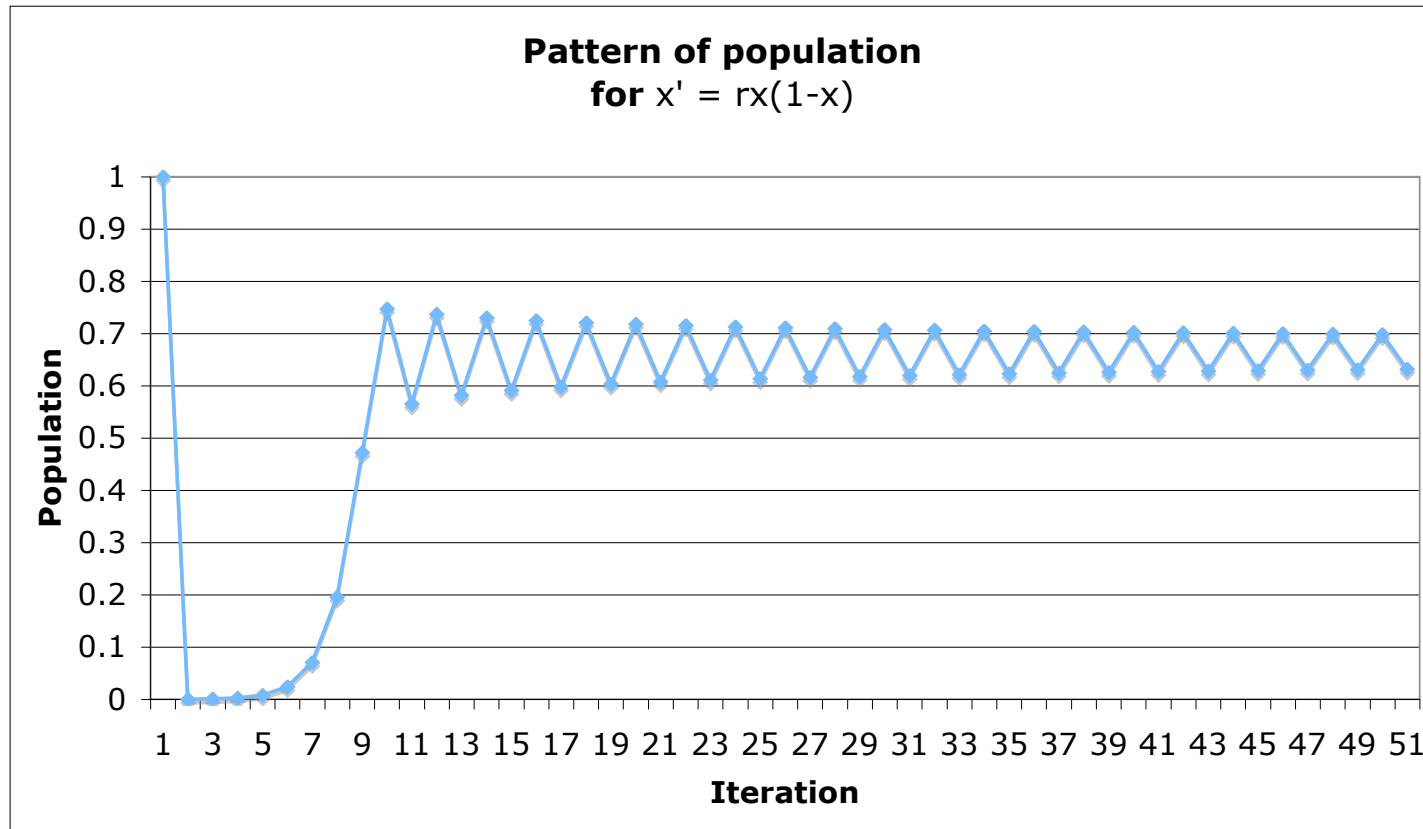
[The logistic equation](#)



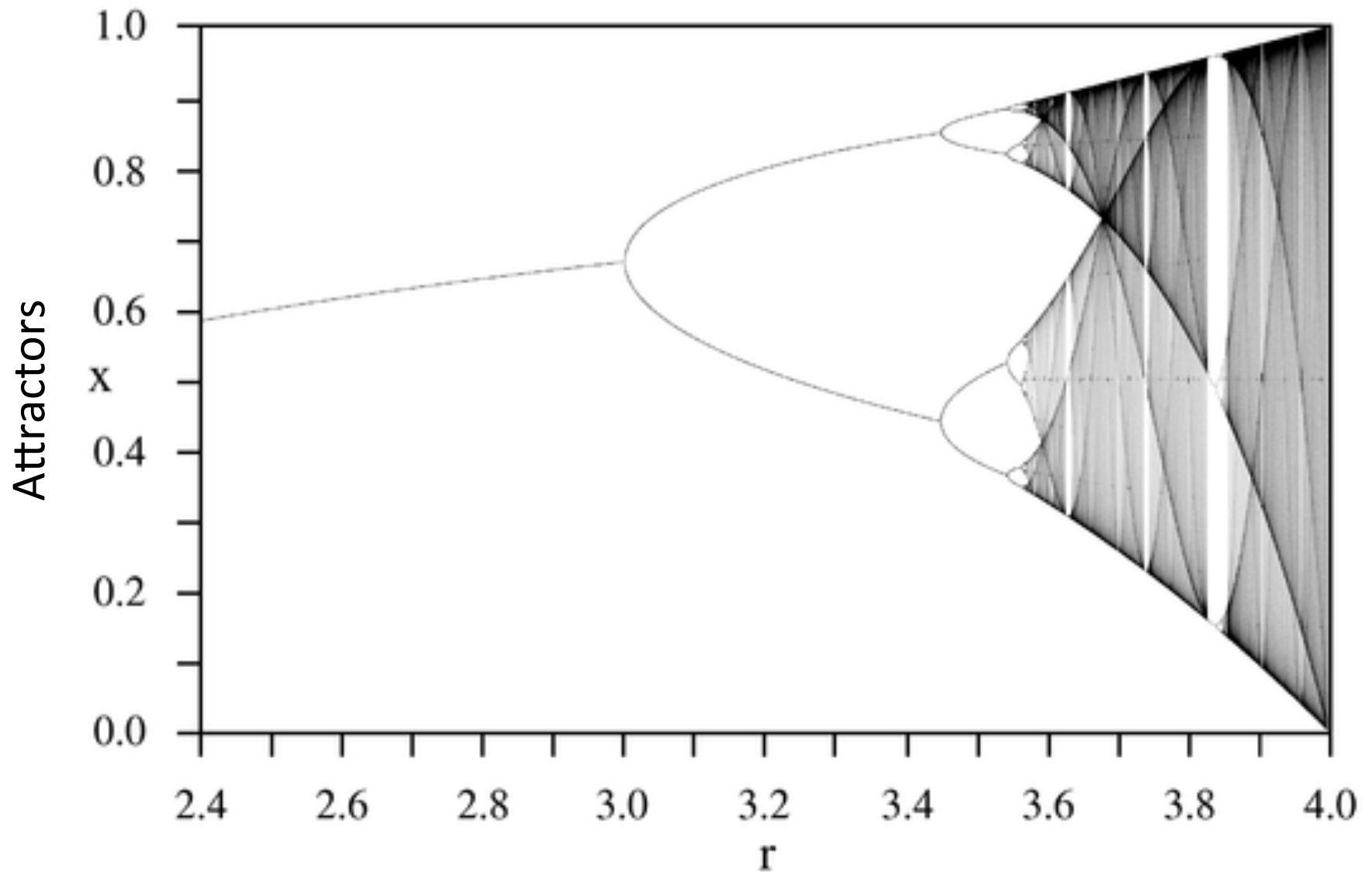
# Key concepts

- Non-linear Dynamical Systems
  - Inputs are not proportional to outputs
  - Determinism: Can you work out future states?
- Sensitivity to Initial Conditions
  - The “butterfly effect”
  - E.g. [The Lorenz Attractor](#)
- Denseness
- Attractors (Simple and Strange)
- Criticality and Tipping Points
- Self-similarity and Fractals

# Non-Linear Dynamical Systems

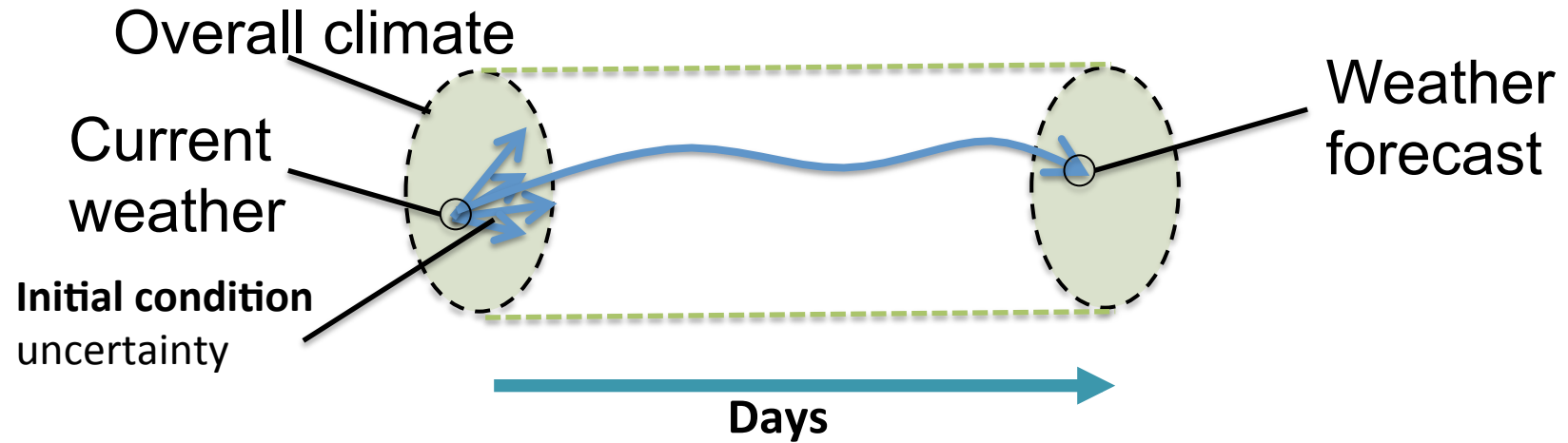


# Bifurcation Diagram for $x' = rx(1-x)$

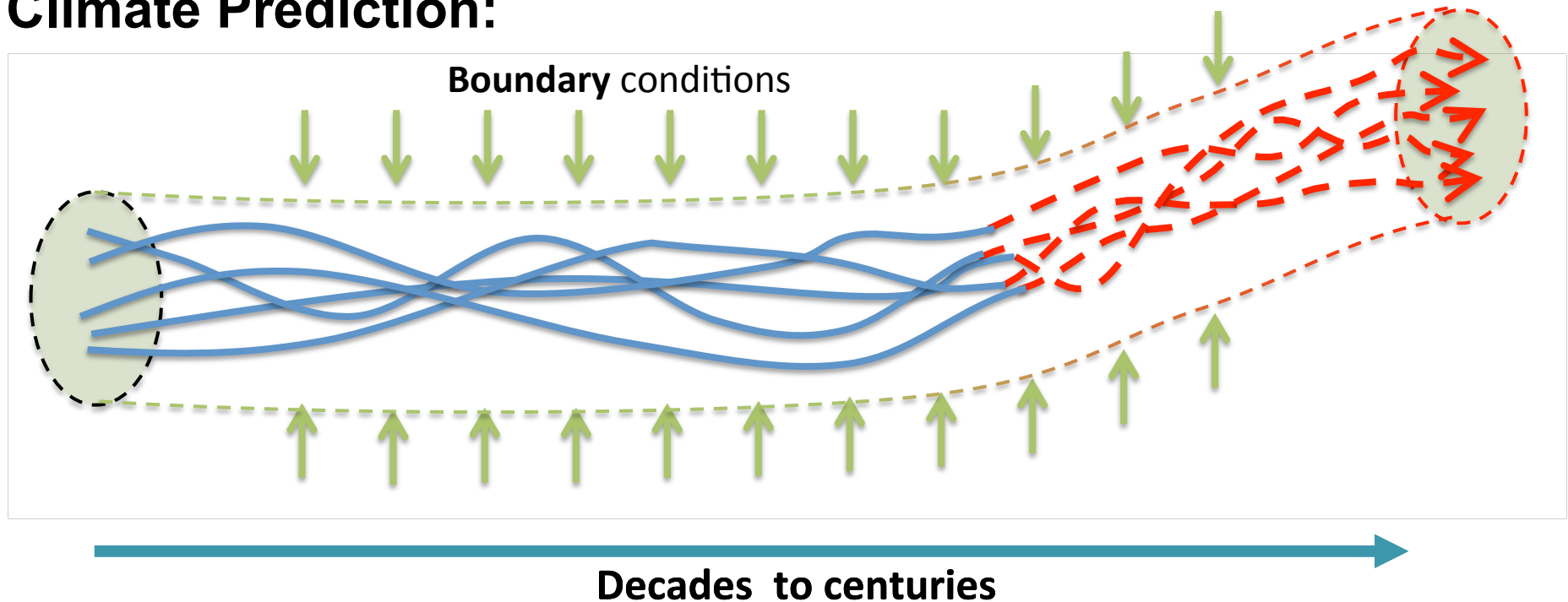




## Weather Forecasting:



## Climate Prediction:



# For Next Week

- Draft of Assignment 1 is due
- Bring a paper copy of your draft to class
  - We'll do a peer review exercise
  - You get to re-submit within 1 week
- Read any 2 articles from Climate Central Blog
  - <http://www.climatecentral.org/news>
  - Think about how they're written