

# Ch. 13 Introduction to Numerical Weather Prediction

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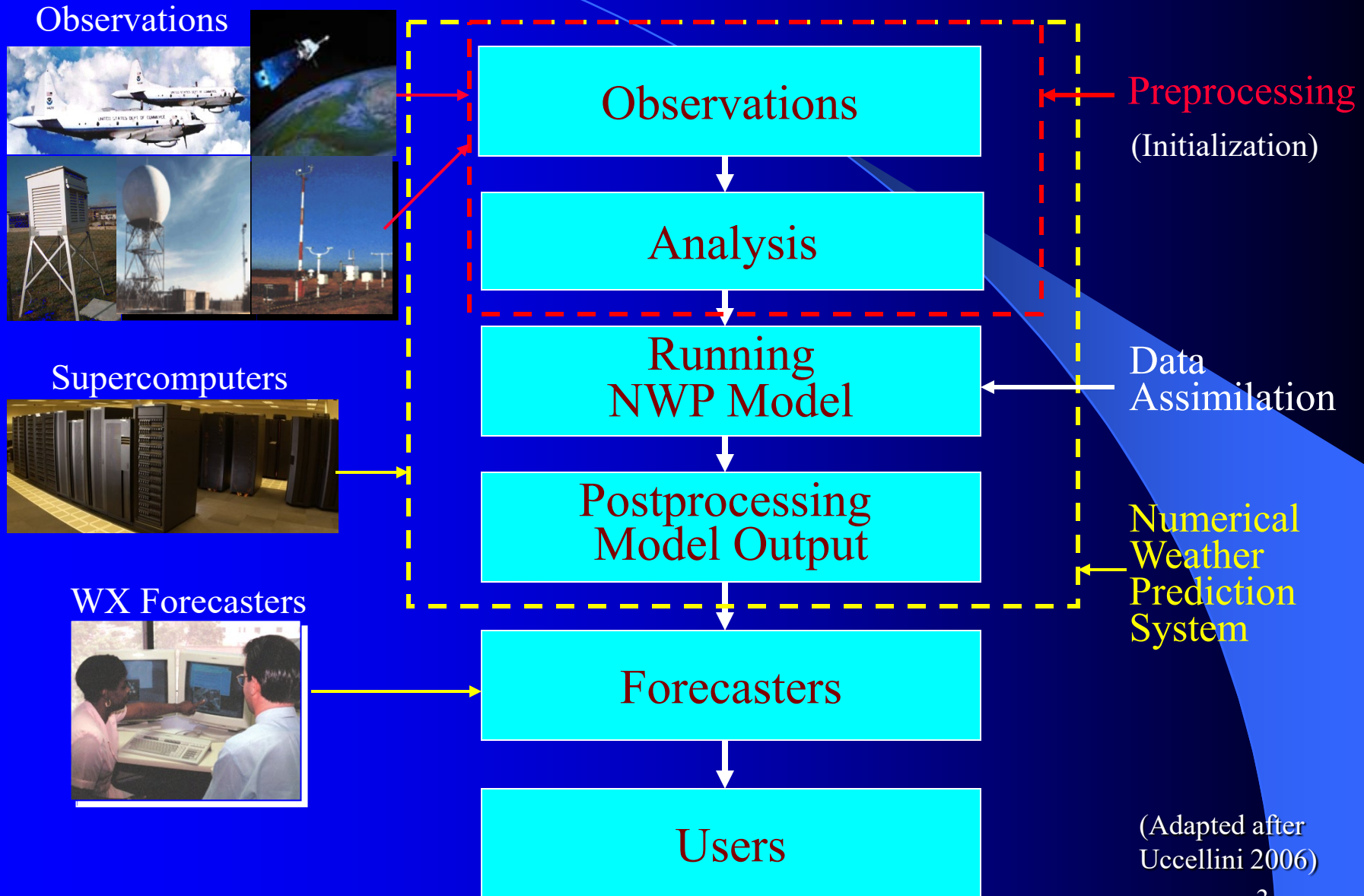
North Carolina A&T State University

# 1.1 Introduction to Numerical Weather Prediction

- NWP models use numerical methods to make approximations of a set of partial differential equations (PDEs) on discrete grid points to predict weather systems in a finite area for a certain time in the future.
- Mathematically, NWP is equivalent to solving an *initial- and boundary-value problem*.

Thus, the accuracy of NWP depends on the accuracies of the i.c. & b.c. of the governing PDEs.

# 3. Numerical Weather Prediction (NWP)



(Adapted after Uccellini 2006)

Physically, the **Newton's second law** is applied to describe air motion in  $x$ ,  $y$ , and  $z$  directions:

$$F = ma \quad \Rightarrow \quad a = \frac{F}{m}; \quad \Rightarrow \quad a_x = \frac{du}{dt} = \frac{F_x}{m}$$
$$\frac{du}{dt} = \frac{F_x}{m}; \quad \frac{dv}{dt} = \frac{F_y}{m}; \quad \frac{dw}{dt} = \frac{F_z}{m}$$

The above 3 equations give the **momentum equations**.

The **conservation of mass** is then applied to derive the **continuity equation**.

The **conservation of energy** and ideal gas law are applied to derive the thermodynamics equation.

Mathematically, a NWP model solves an initial- and boundary-value problem (IVP & BVP) in a rotating frame of reference: (Primitive Equations)

$$\frac{du}{dt} = -\frac{1}{\rho} \frac{\partial p}{\partial x} + fv + F_{rx} \quad \text{x-momem. eq.} \quad (1)$$

$$\frac{dv}{dt} = -\frac{1}{\rho} \frac{\partial p}{\partial y} - fu + F_{ry} \quad \text{y-momem. eq.} \quad (2)$$

$$\frac{dw}{dt} = -\frac{1}{\rho} \frac{\partial p}{\partial z} - g + F_{rz} \quad \text{z-momem. eq.} \quad (3)$$

$$\frac{d\rho}{dt} = -\rho \left( \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} + \frac{\partial w}{\partial z} \right) \quad \text{Continuity eq.} \quad (4)$$

$$\frac{dT}{dt} = Q \quad \text{Thermo. energy eq.} \quad (5)$$

$$p = \rho RT \quad \text{Eq. of state} \quad (6)$$

**NWP Model Development:** A numerical model based on the above primitive equations may be developed step by step.

For example, the **inviscid nonlinear Burger equation** can be solved numerically using finite difference method, even though it can be solved analytically.

$$\frac{\partial u'}{\partial t} + (U + u') \frac{\partial u'}{\partial x} = 0$$

Apply a finite difference method at discrete points in  $x$  and  $t$

$$\frac{u_i^{\tau+1} - u_i^{\tau-1}}{2\Delta t} + (U + u_i^{\tau}) \frac{u_{i+1}^{\tau} - u_{i-1}^{\tau}}{2\Delta x} = 0$$

Solve for  $u_i^{\tau+1}$

$$u_i^{\tau+1} = u_i^{\tau-1} - \frac{\Delta t}{\Delta x} (U + u_i^{\tau}) (u_{i+1}^{\tau} - u_{i-1}^{\tau})$$

**1D Burger equation**

$$\frac{\partial u}{\partial t} + u \frac{\partial u}{\partial x} = \nu \frac{\partial^2 u}{\partial x^2}$$

# NWP Model Development

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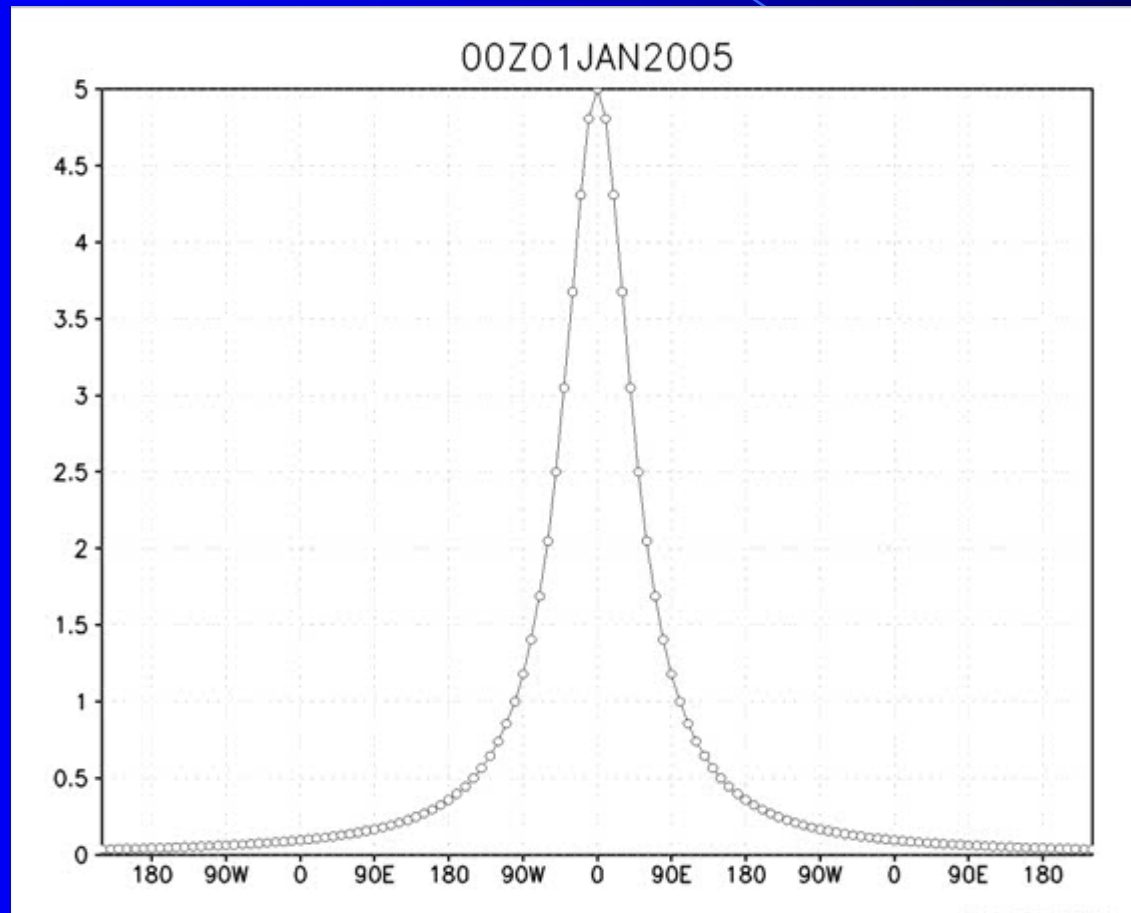
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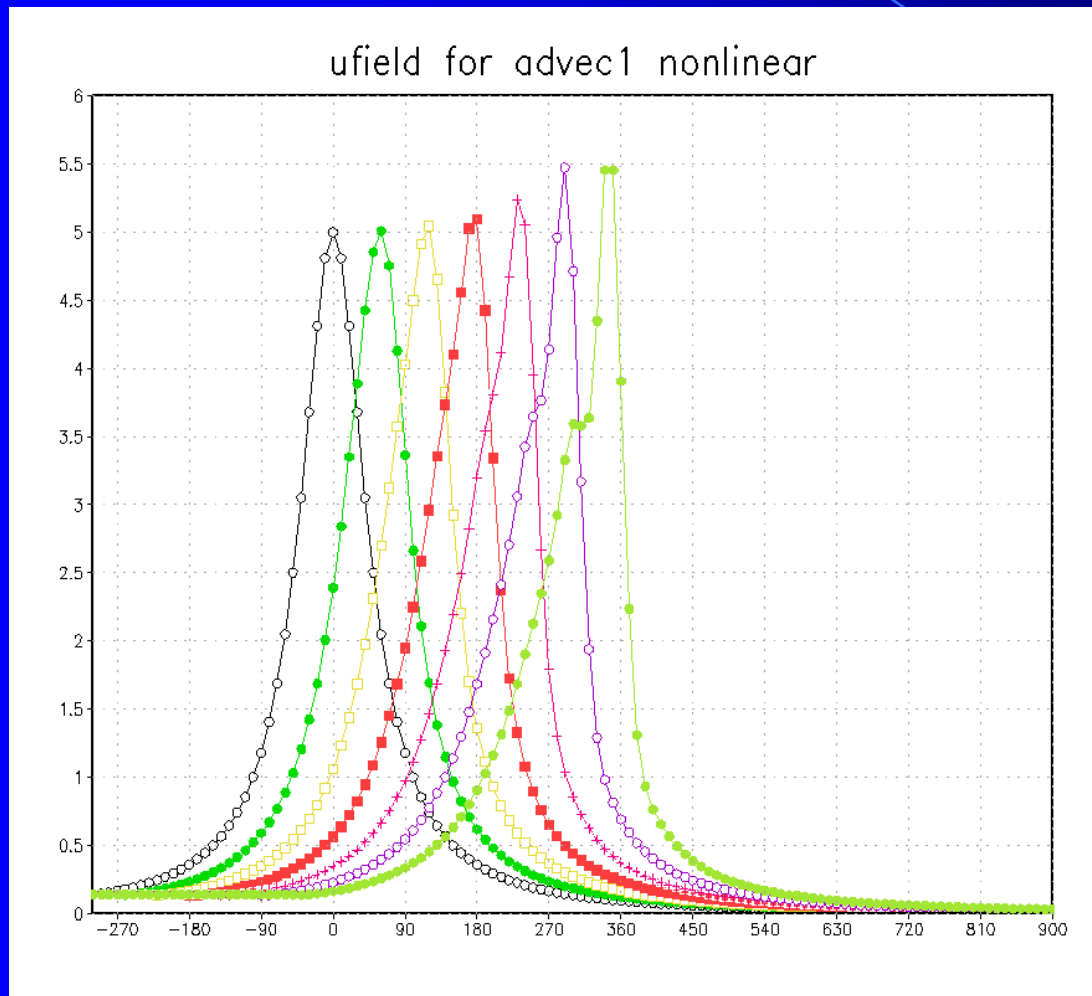
## 1D Burger equation

$$\frac{\partial u}{\partial t} + u \frac{\partial u}{\partial x} = \nu \frac{\partial^2 u}{\partial x^2}$$

The **Advection Model** may be used to study some basic wave properties and extend to more complicated models.

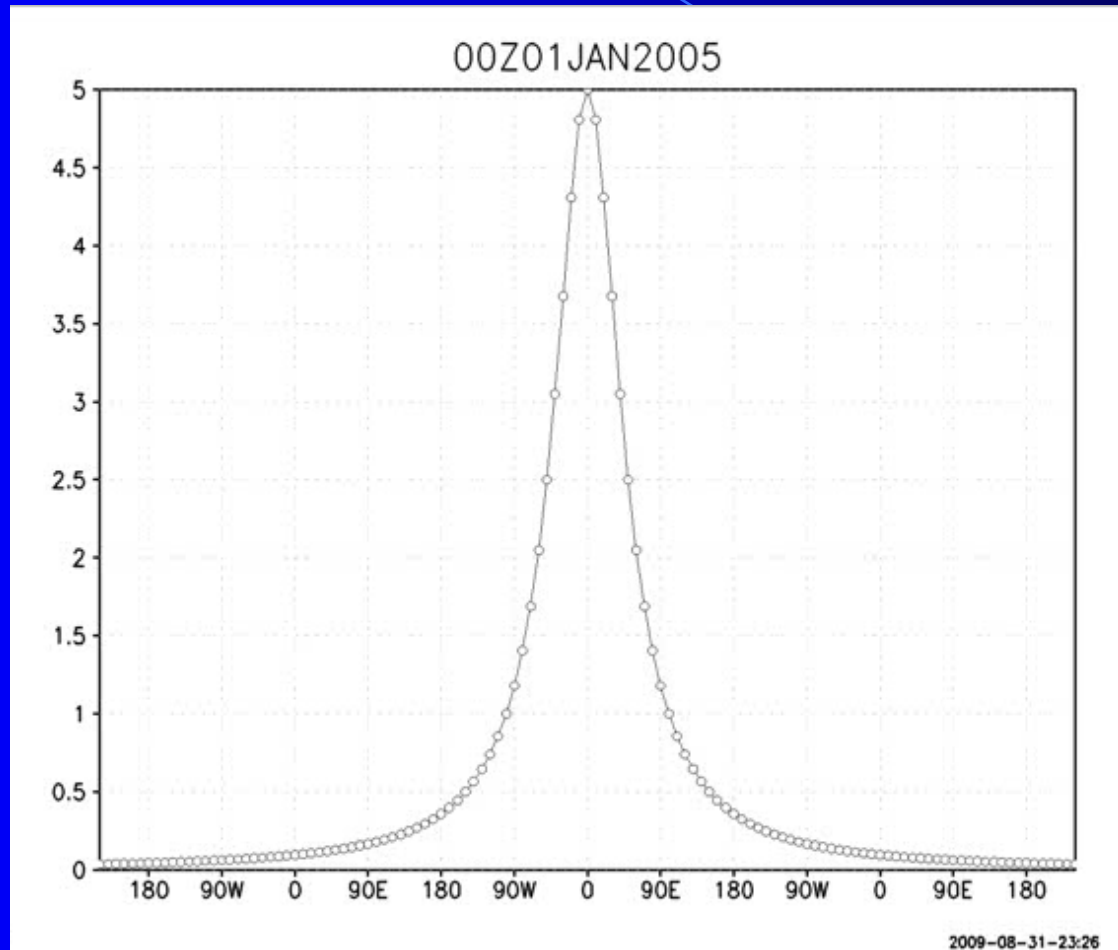


The Advection Model may be used as a powerful way to study some basic wave properties and extend to more complicated models.



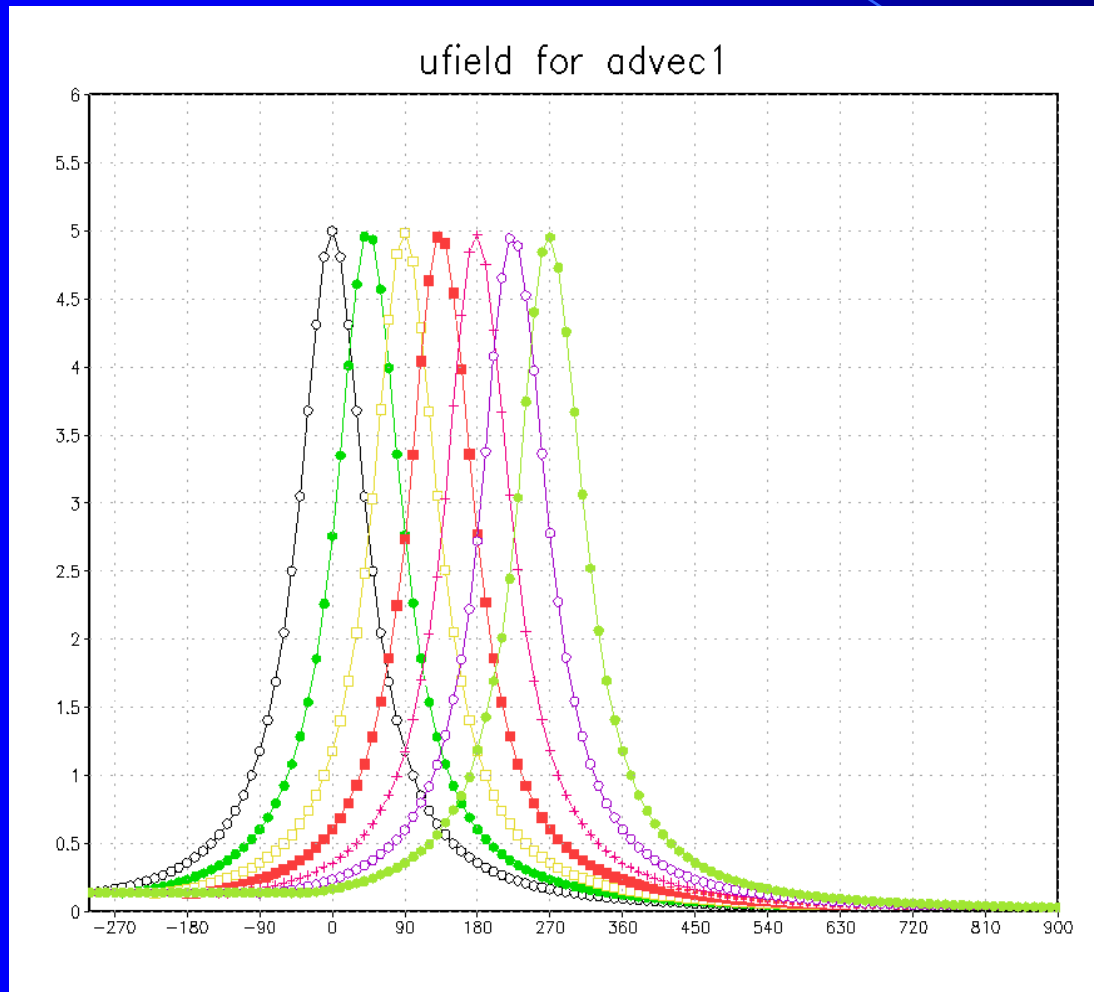
$$\frac{\partial u'}{\partial t} + (U + u') \frac{\partial u'}{\partial x} = 0$$

The above **Advection Model** can be used to study nonlinear effect by turning off the nonlinearity.:



$$\frac{\partial u'}{\partial t} + U \frac{\partial u'}{\partial x} = 0$$

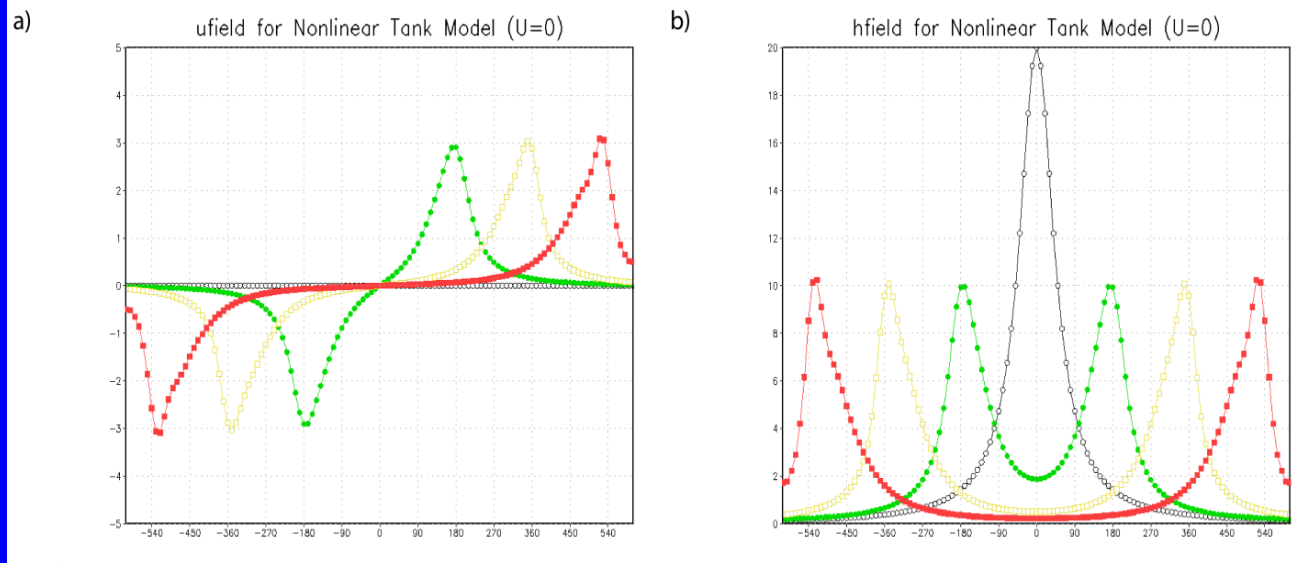
The nonlinearity term can be deactivated to become the Linear Advection Model to study nonlinear effect.



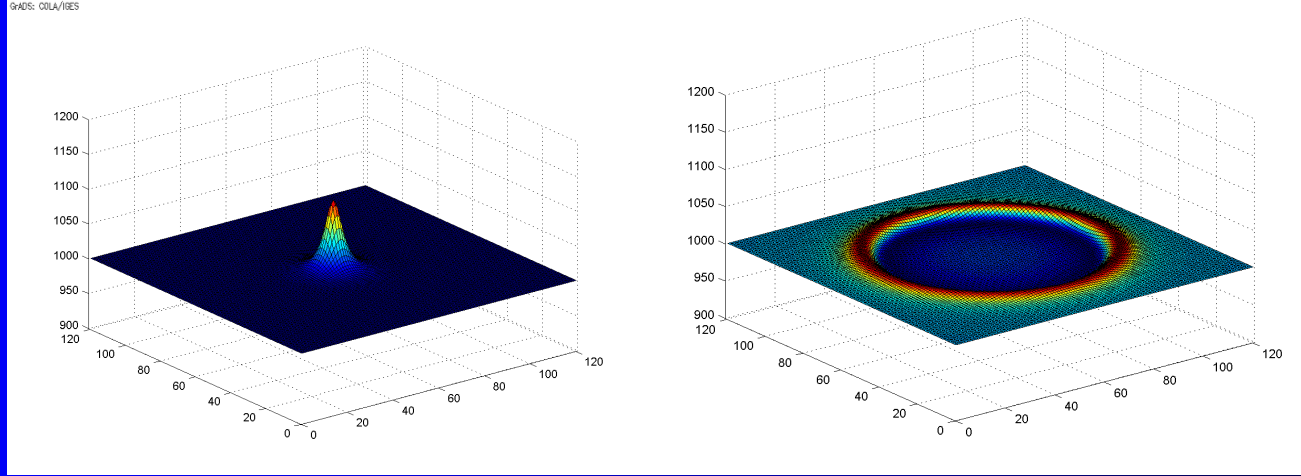
$$\frac{\partial u'}{\partial t} + U \frac{\partial u'}{\partial x} = 0$$

# The **advection model** can be extended to 2D & 3D shallow-water tank models based on shallow water systems

2D Tank Model



3D Tank Model



The **3D Tank Model** can then be further extended to build a simple NWP model for solving the **primitive equations (1) – (6)**.

In **1922, Lewis Richardson**, did the very first numerical weather prediction based on a simple primitive equation model. He made a **6-h forecast with hand calculators**, which took more than 6 weeks.

The first successful NWP was performed using the ENIAC digital computer in **1950 by Charney, Fjotoft, von Neumann et al.**

Today's NWP looks like the following:[**NOAA Global Model Prediction**]

<https://www.ncei.noaa.gov/products/weather-climate-models/global-forecast>  
(NOAA NCEI)

# Mathematically, we are facing many challenges, such as:

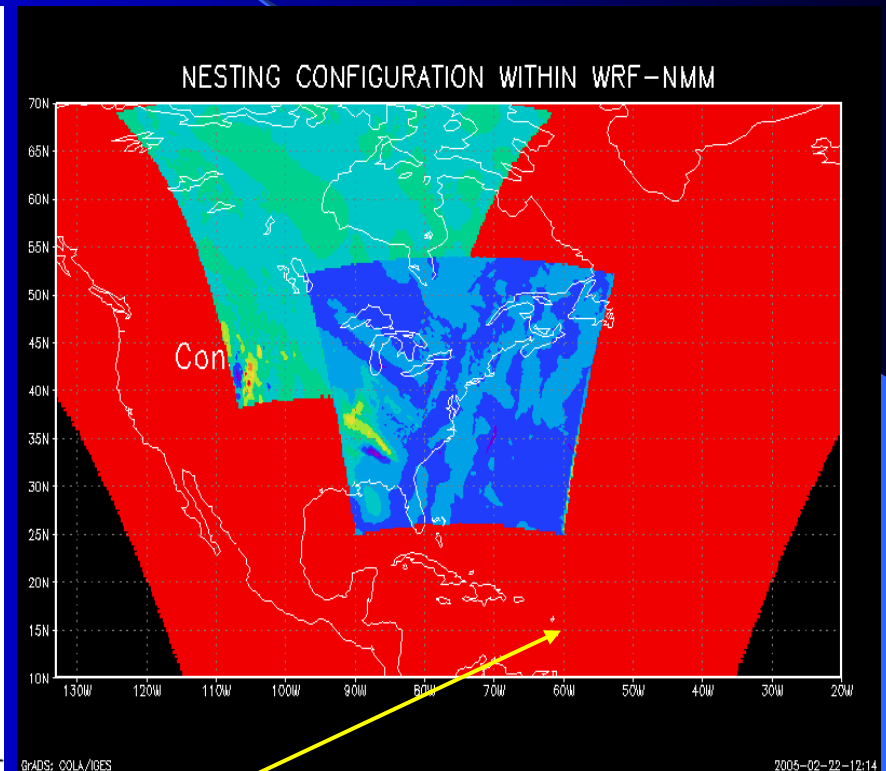
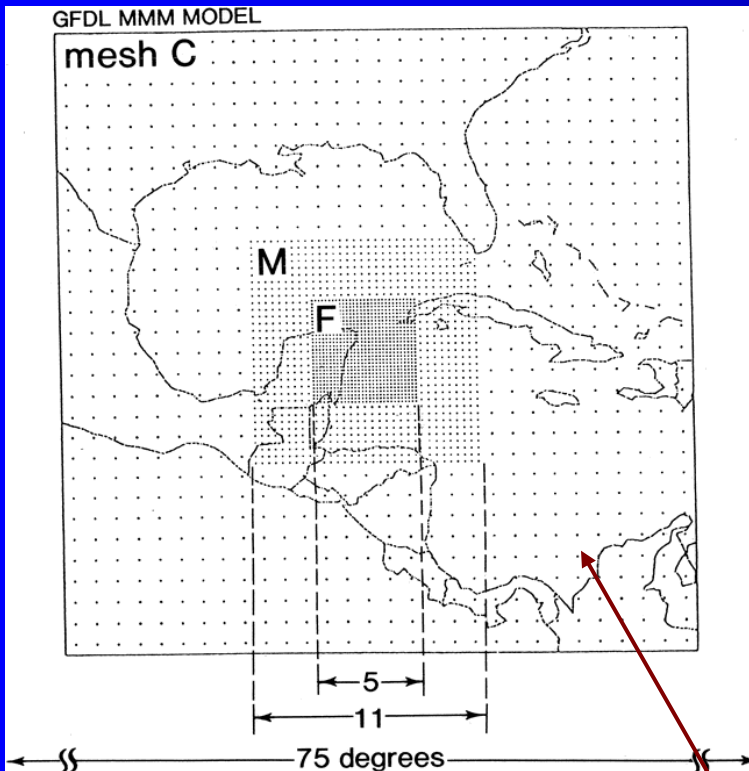
1. **Initial Value Problem:** lack of i.c., obs. data not on grid points, inconsistency with governing equations, etc. => a need of **initialization** (which is normally not studied by mathematicians)
2. **Incorporation of obs. data** into model => **data assimilation**
3. **Boundary Value Problem:** Most of the lower, upper, and lateral b.c. problems are resolved reasonably, but improvements are needed, especially for nested domain boundaries.
4. Requirement of **conservation of mass** => leads to the development of **staggered grids**.
5. **Non-unique numerical solutions** => development of **Ensemble forecasting techniques**.
6. The **number of primitive equations grows** when more physical processes are involved, such as moist convection.
7. Then, came the big question of the **predictability problem** of the atmosphere, as proposed by Lorentz.

**Physically**, there exist many challenges, too, such as:

1. In order to make real-time forecast, **sound waves** needs to be either removed or treated with specific techniques; otherwise, we cannot predict weather before it occurs.
2. Need to **parameterize** atmospheric processes occurred within grid intervals.
3. Need more accurate, frequent and evenly-distributed data for model **initialization**.
4. **Verification of forecasting results** require field experiment, which are very expensive (e.g., NOAA hurricane experiments).
5. NWP models rely on global models to provide i.c. and b.c., thus **inherit errors from global model simulations**.
6. **Need more powerful supercomputers** for real-time forecasting.

# Examples of special techniques used in NWP Models:

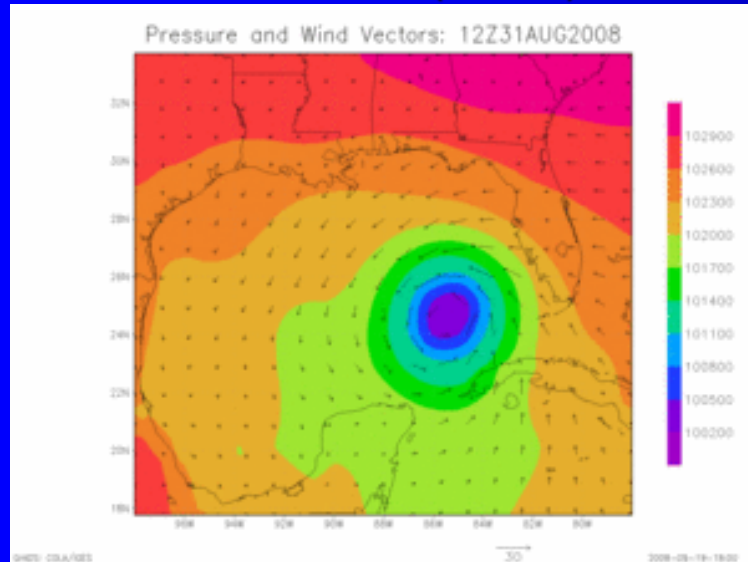
## Using a moving, nested grid domain with higher resolution to follow a hurricane:



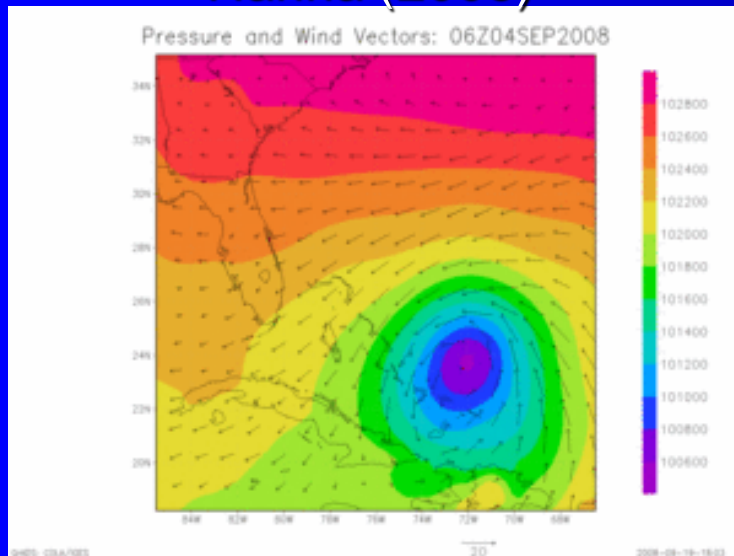
Note that there is not much data over the ocean, which is one major source of forecast errors!

# A grid mesh moving with hurricanes

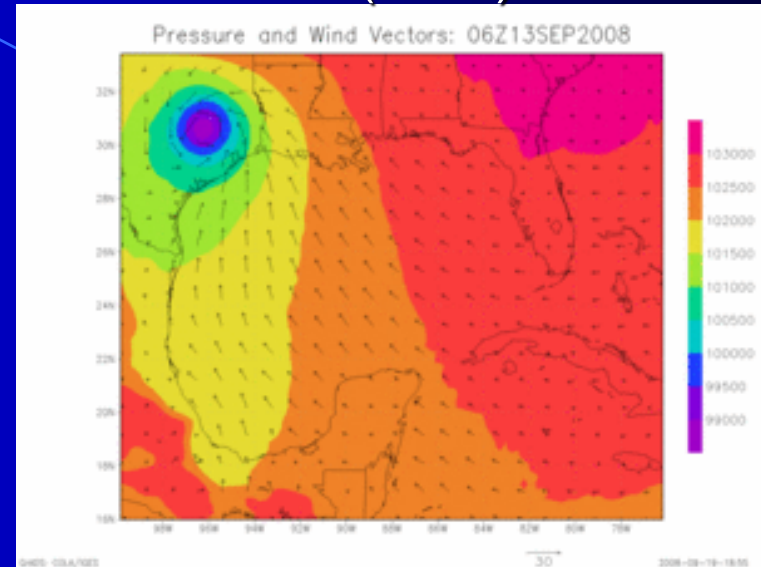
Gustav (2008)



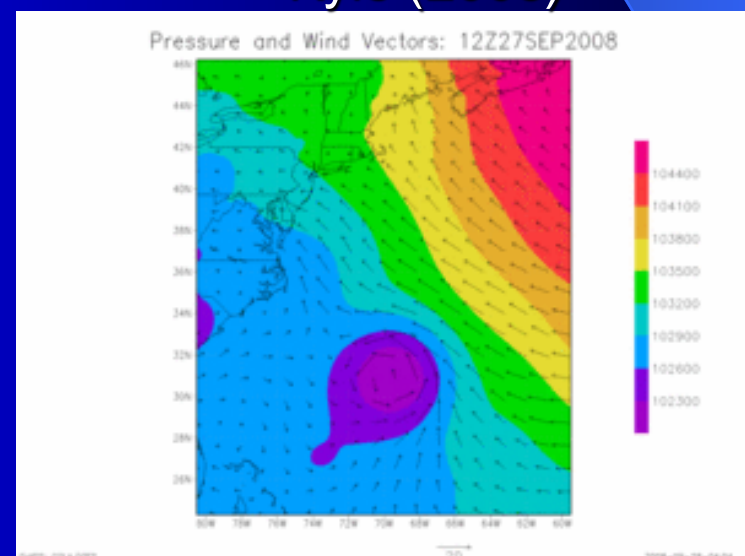
Hanna (2008)



Ike (2008)

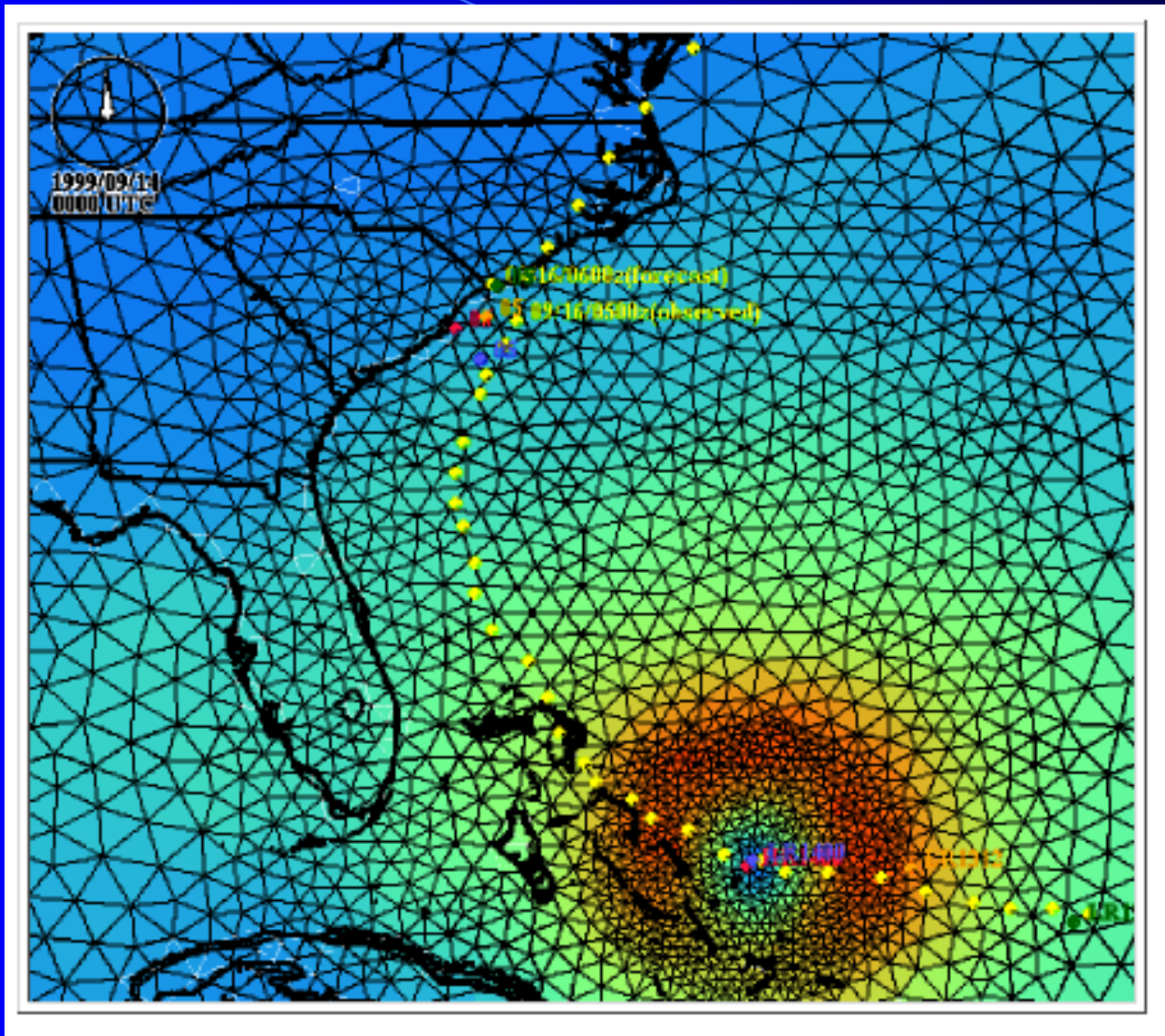


Kyle (2008)



Roop, Lin, Tang (2008)

# Unstructured Adaptive Grid



OMEGA Model (SAIC)

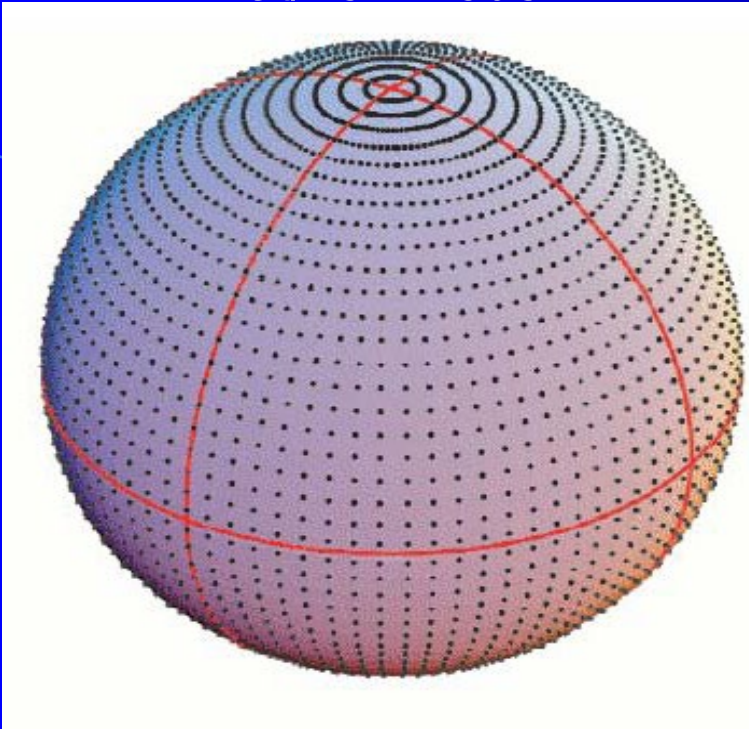
# Next Generation Global Prediction System (NGGPS) Over-Arching Objectives

(Adapted from Fred Toepfer, NGGPS Project Manager)

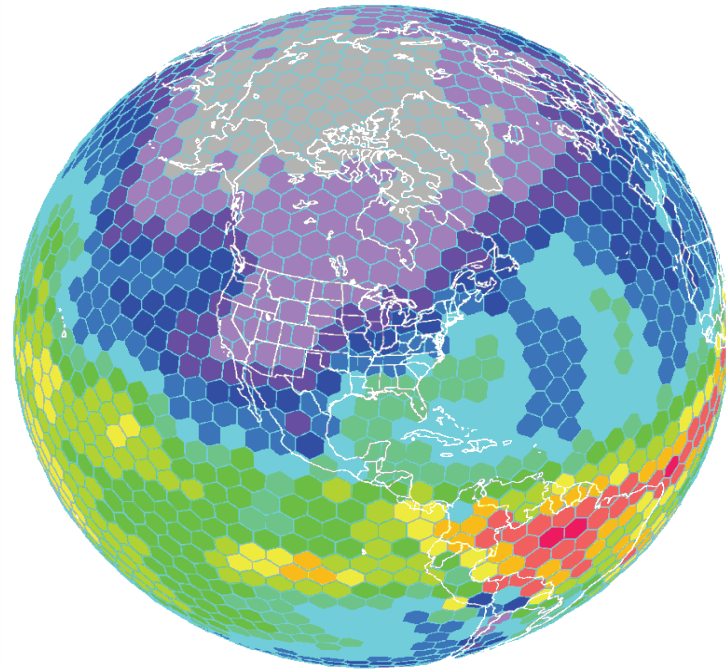
- **Re-establish US as the World leader in Global Weather Prediction**
  - Extend forecast skill beyond 8 to 10 days
  - Improve hurricane track and intensity forecast
- **Extend Weather Forecast to 30 days**
  - Implement a weather-scale, fully-coupled NWP System - including Atmosphere, Ocean, Sea Ice, Land Surface, Waves, Aerosols and Atmospheric Composition
  - Support development of products for weeks 3 and 4
- Support unification of the NWS NWP Suite
- Multi-year Community Effort
- Position NWS to take advantage of Advanced High Performance Computing Architectures

# Using Global Models for NWP

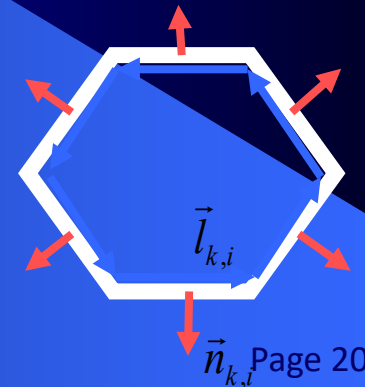
Lat/Lon Model



Icosahedral Model



- No singularity at poles
- Near constant resolution over the globe
- Efficient high resolution simulations
- NOAA [FV3](#) model (see next page)
- NCAR [MPAS](#) model



# FV3: Thunderstorm resolving resolution!

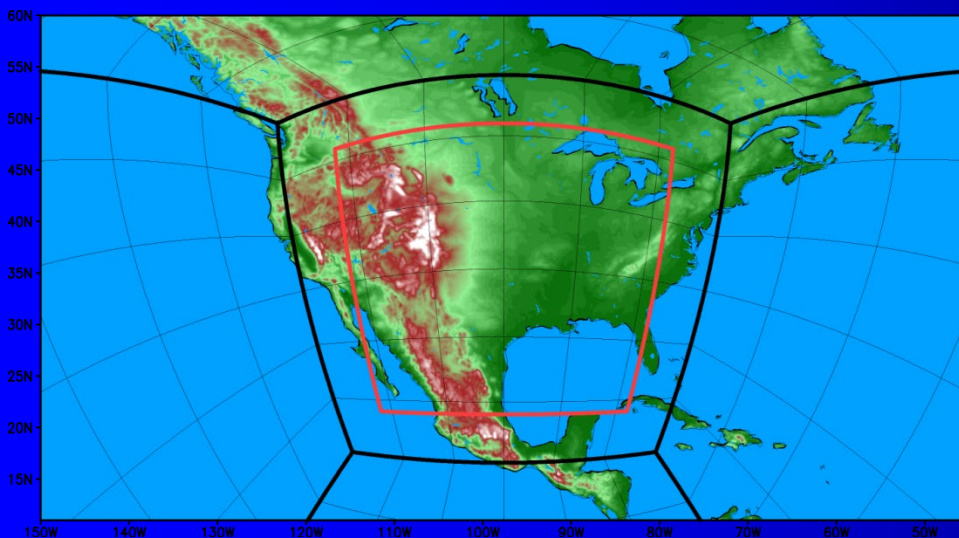
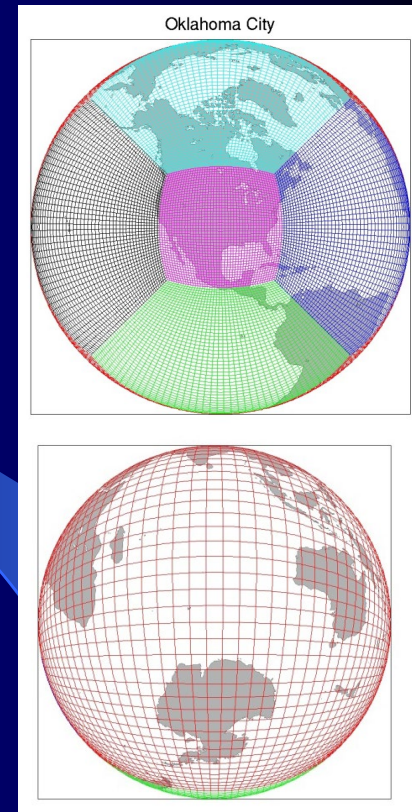
(Chosen by NGGPS; Developed by NOAA GFDL)

## 1) Grid stretching

- Moderate stretching (2.5 x) maintains excellent global circulation – for regional climate simulations
- Aggressive stretching (20 x) – for short term severe weather predictions (tornadoes and hurricanes)

## 2) 2-way nesting (Harris and H.-C. Lin 2014)

## 3) Combination of the “stretching” and “nesting” (most efficient approach)



Grid-stretching and a two-way nest running parallel in time; capable of meeting NCEP's operational requirement  
~ 3 km without the nest (red)  
~ 1 km with a 2-way nest