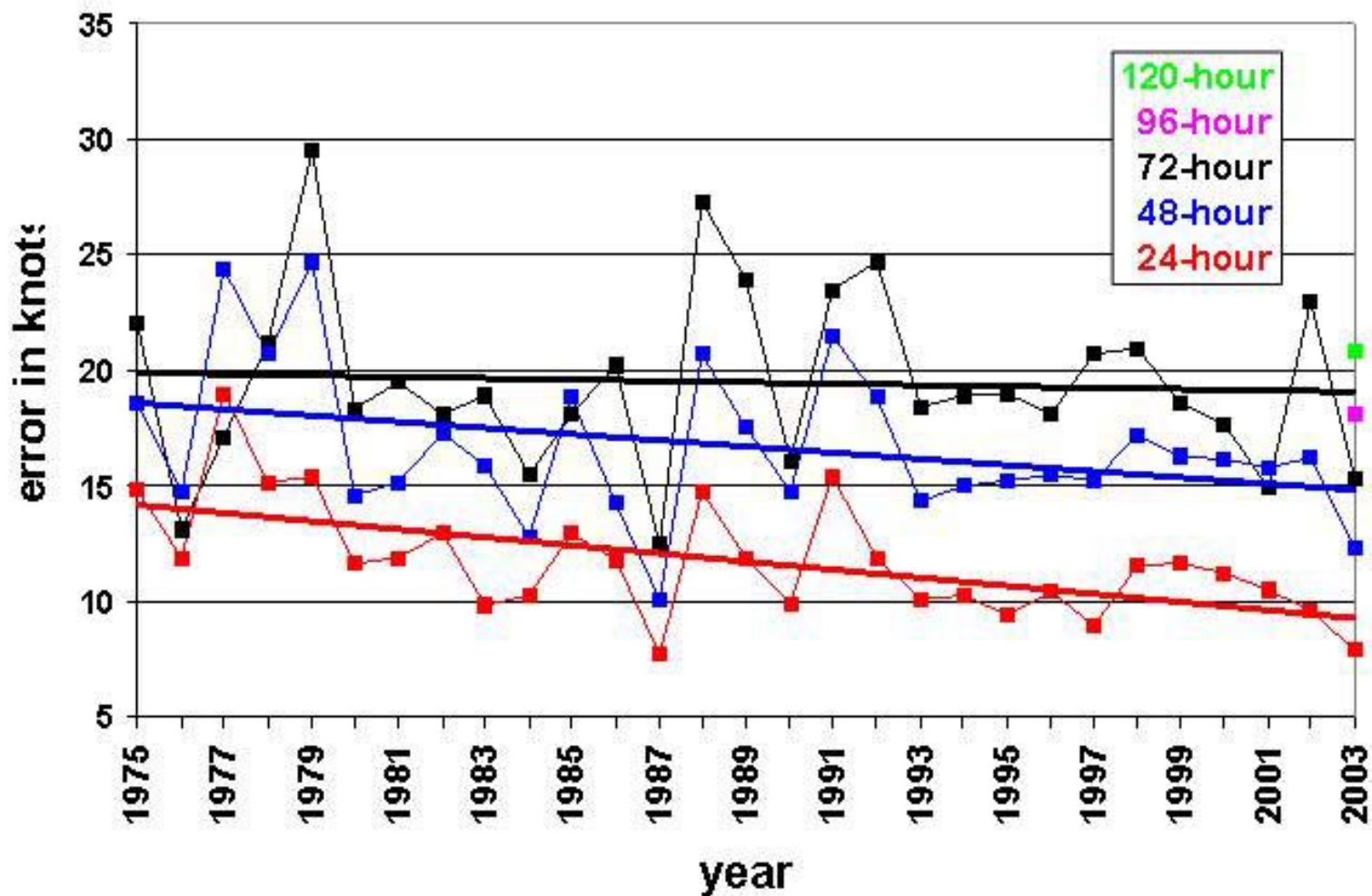


Forecasting Hurricane  
Intensity: Lessons from  
Application of the Coupled  
Hurricane Intensity Prediction  
System (CHIPS)

# Tropical Prediction Center Performance Measures

yearly-average official intensity forecast errors and trend lines, Atlantic basin



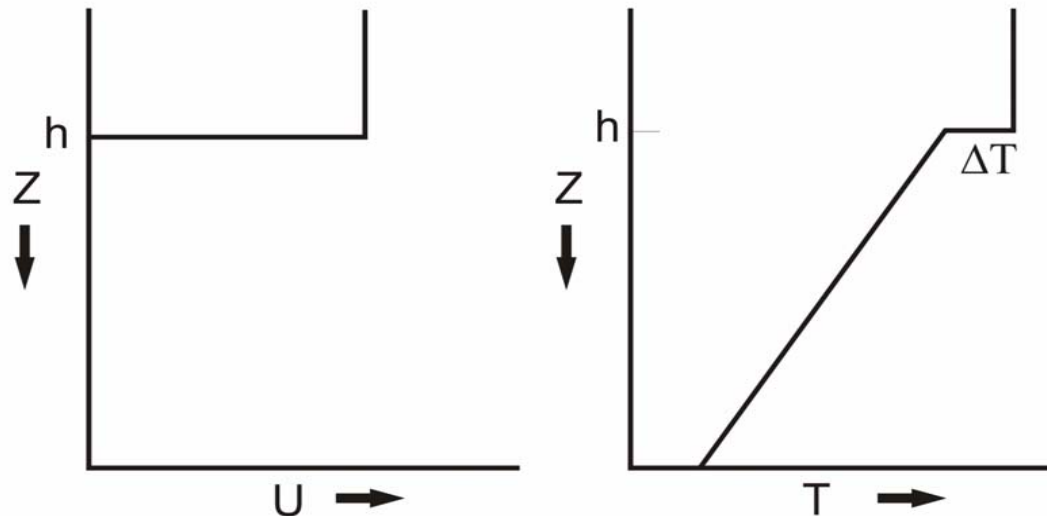
# Coupled Model Design

- **Atmospheric Component:** (from Emanuel, 1995)
  - Gradient and hydrostatic balance
  - Potential radius coordinates give very fine (~ 1 km) resolution in eyewall
  - Interior structure constrained by assumption of moist adiabatic lapse rates on angular momentum surfaces
  - Axisymmetric
  - Entropy defined in PBL and at single level in middle troposphere
  - Convection based on boundary layer quasi-equilibrium postulate
  - Surface fluxes by conventional aerodynamic formulae
  - Thermodynamic inputs: Environmental potential intensity and storm-induced SST anomalies

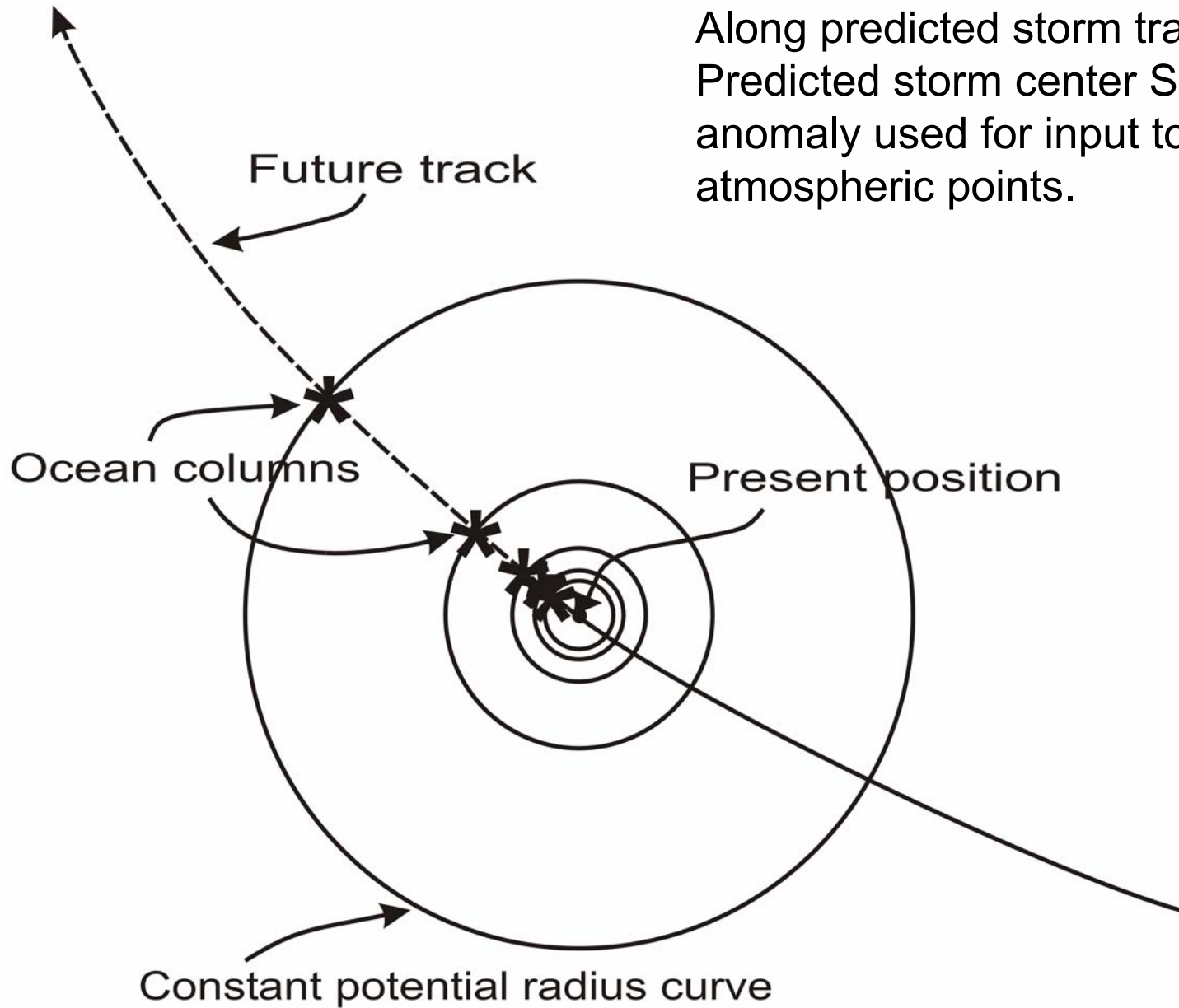
- **Ocean Component**

(Schade, L.R., 1997: A physical interpretation of SST-feedback. Preprints of the 22<sup>nd</sup> Conf. on Hurr. Trop. Meteor., Amer. Meteor. Soc., Boston, pgs. 439-440.)

- **Mixing by bulk-Richardson number closure**
- **Mixed-layer current driven by hurricane model surface wind**



Ocean columns integrated only  
Along predicted storm track.  
Predicted storm center SST  
anomaly used for input to ALL  
atmospheric points.



- **Data Inputs:**

- **Weekly updated potential intensity (1 X 1 degree)**

- **Official track forecast and storm history (NHC & JTWC)**

- **Monthly climatological ocean mixed layer depths (1 X 1 degree)**

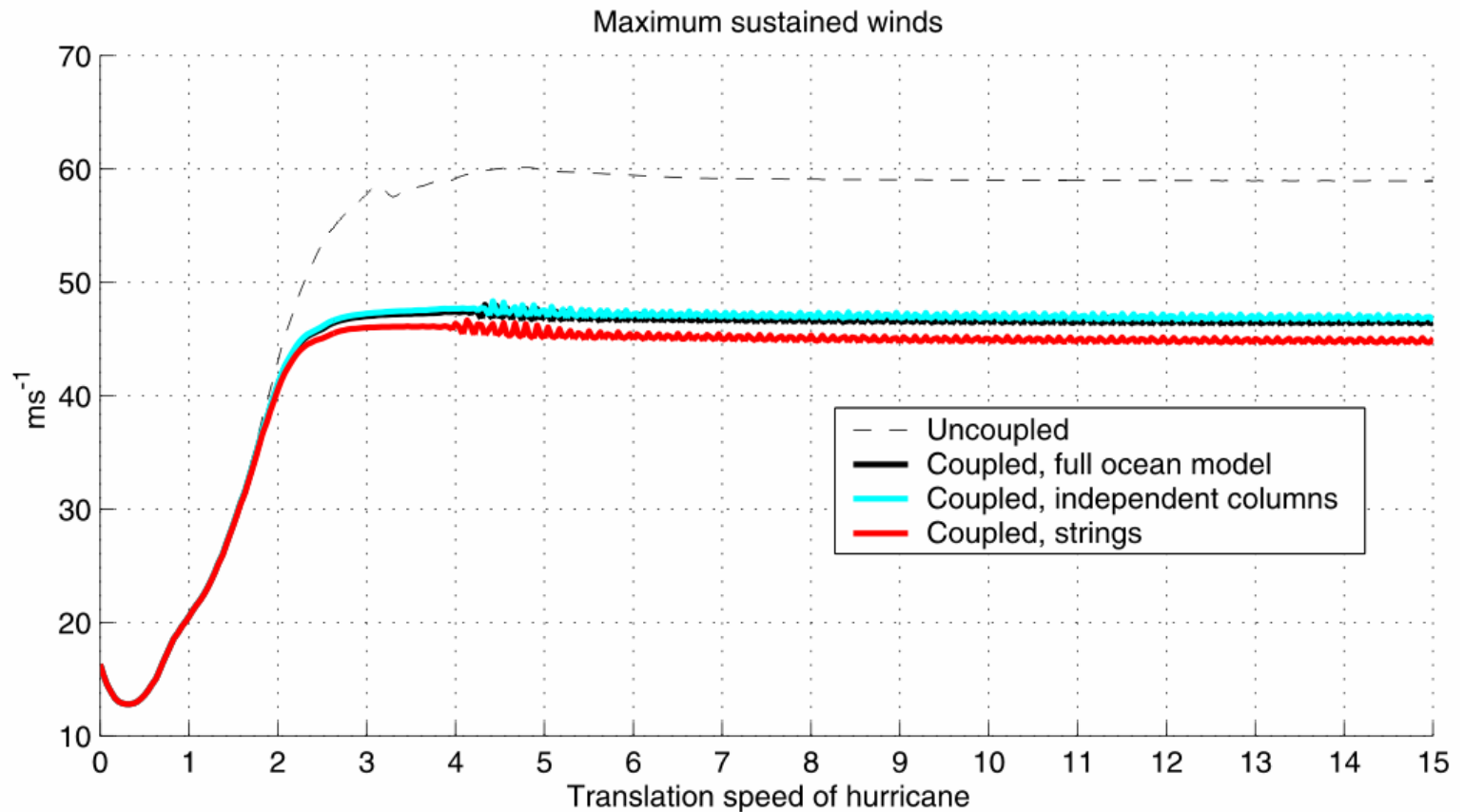
- **Monthly climatological sub-mixed layer thermal stratification (1 X 1 degree)**

- **Bathymetry (1/4 X 1/4 degree)**

# Initialization:

- **Synthetic, warm core vortex specified at beginning of track**
- **Radial eddy flux of entropy at middle levels adjusted so as to match storm intensity to date**
- **This matching procedure effectively initializes middle tropospheric humidity as well as balanced flow**

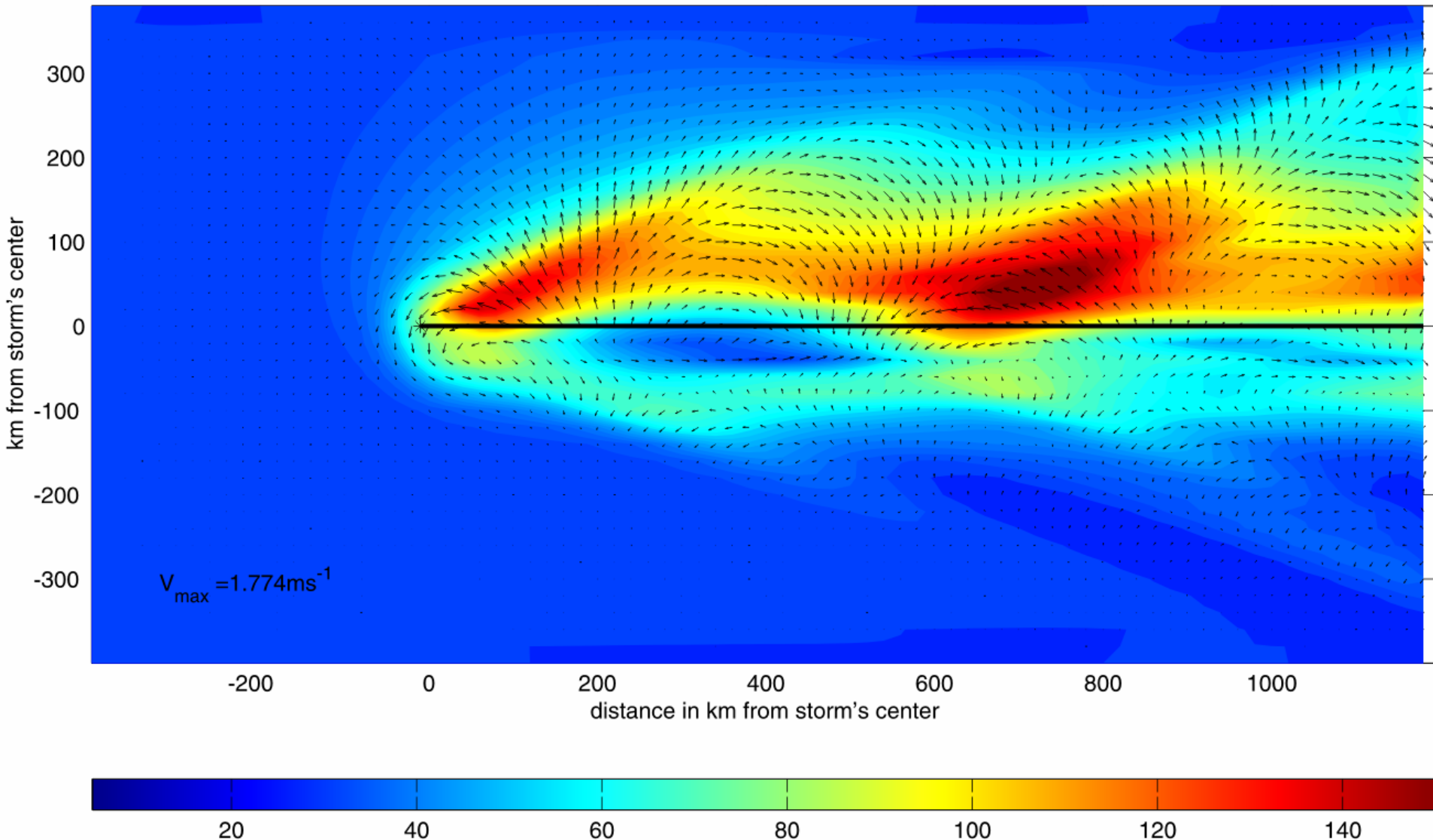
Comparison with same atmospheric model coupled to 3-D ocean model; idealized runs:  
Full model (black), string model (red)



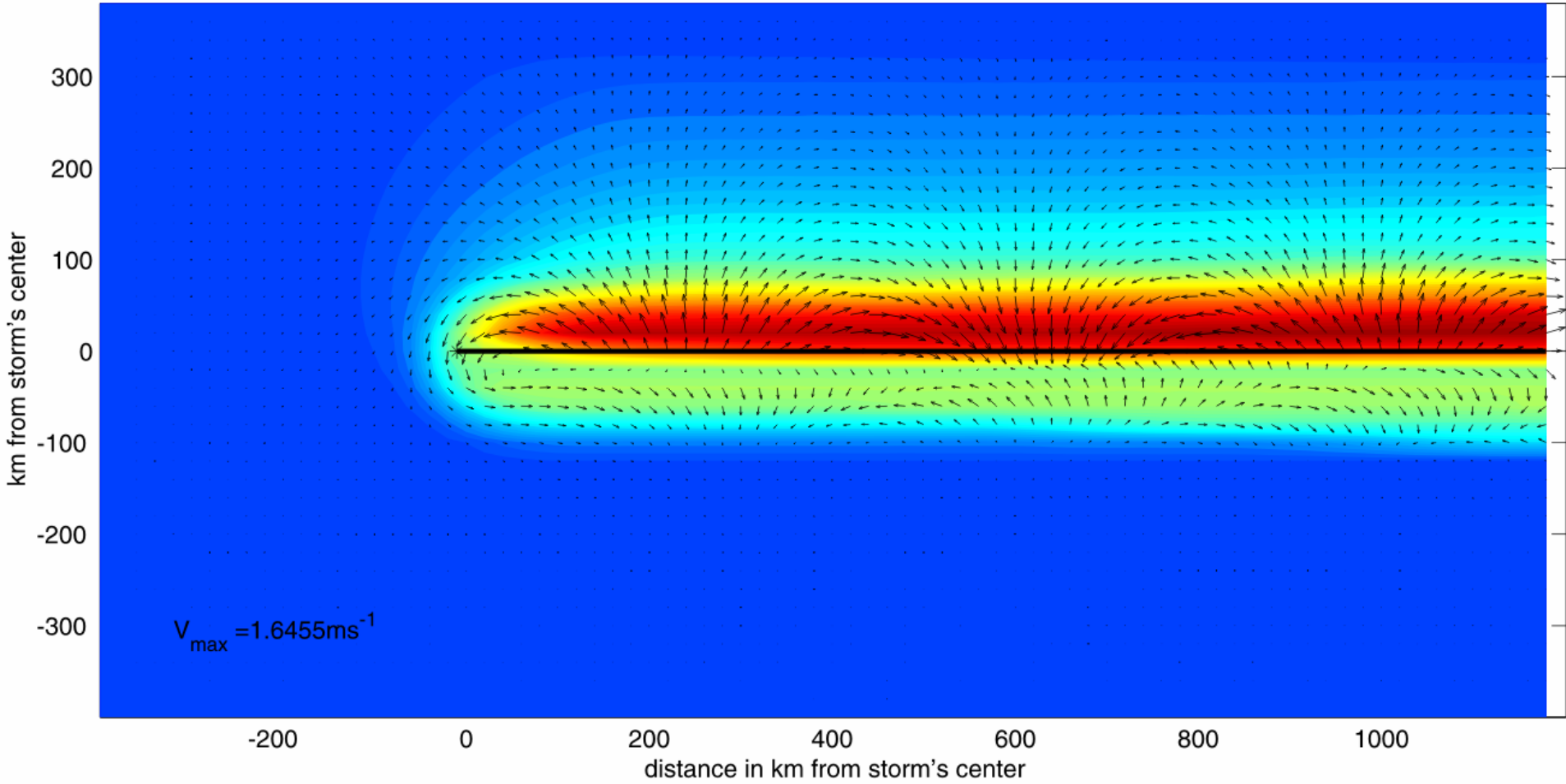


# Mixed layer depth and currents

Full physics coupled run ML depth (m) and currents at t=10 days



Independent column coupled run ML depth (m) and currents at t=10 days



$V_{\max} = 1.6455 \text{ ms}^{-1}$

20

40

60

80

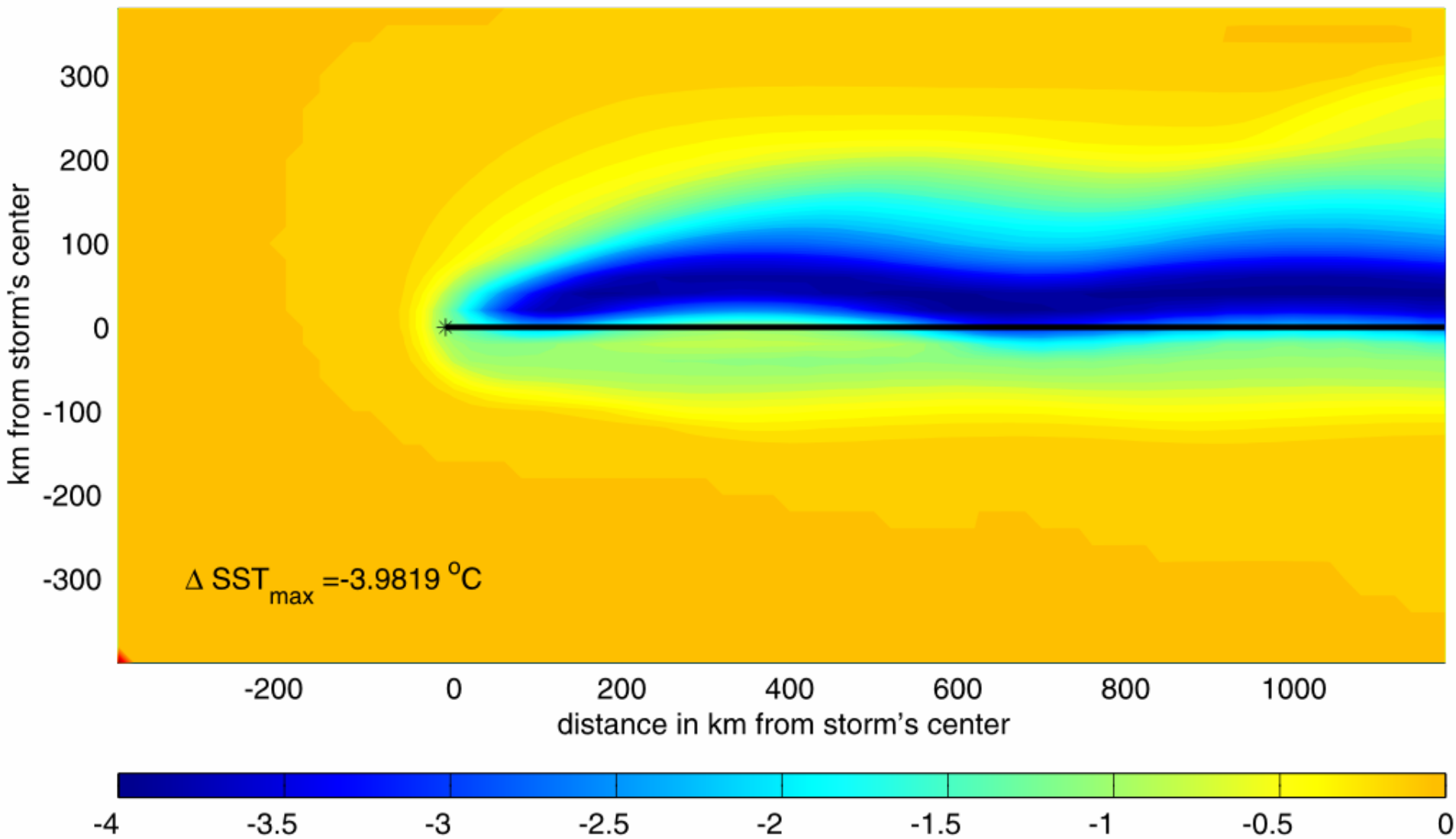
100

120

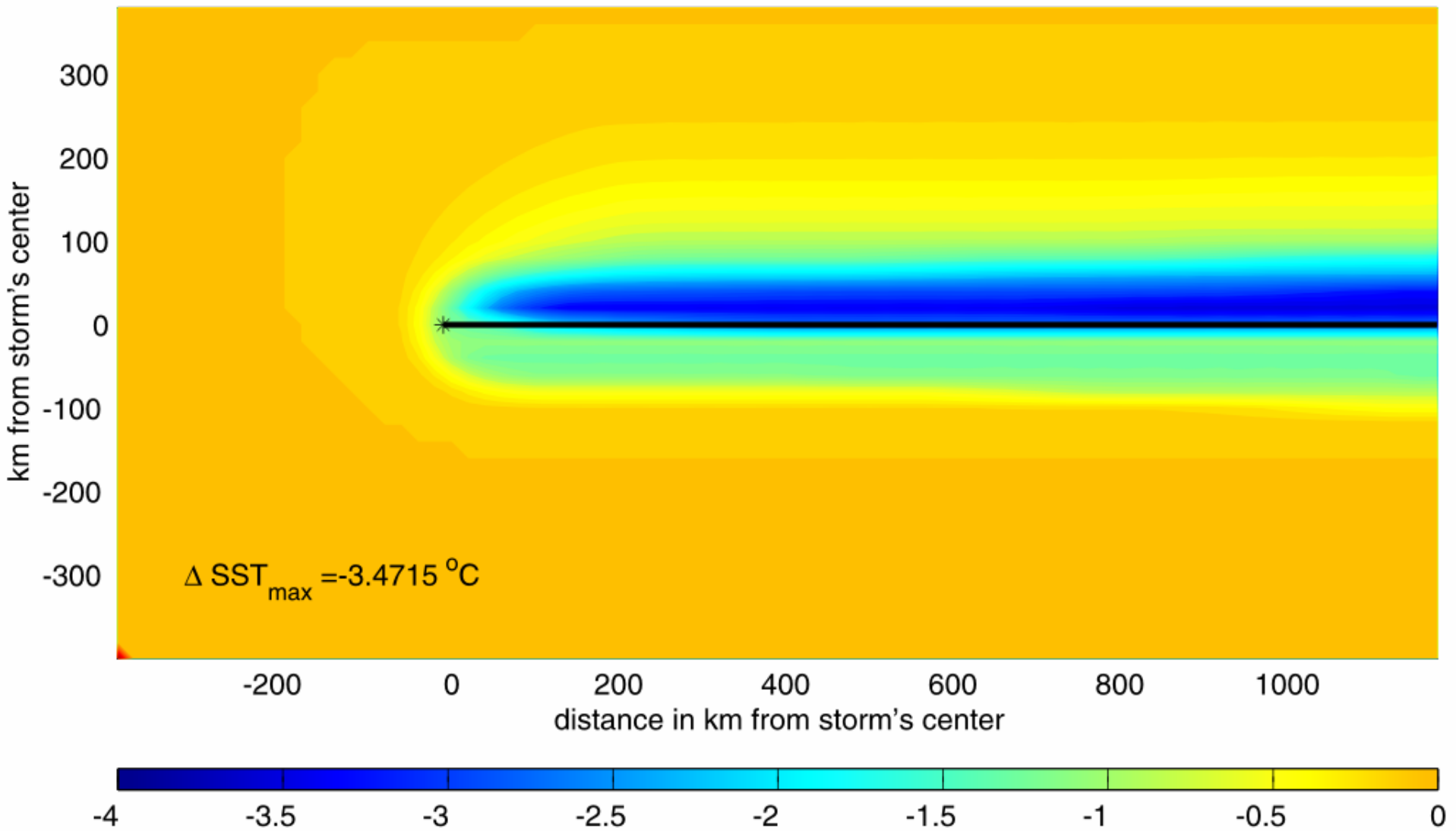
140

# SST Change

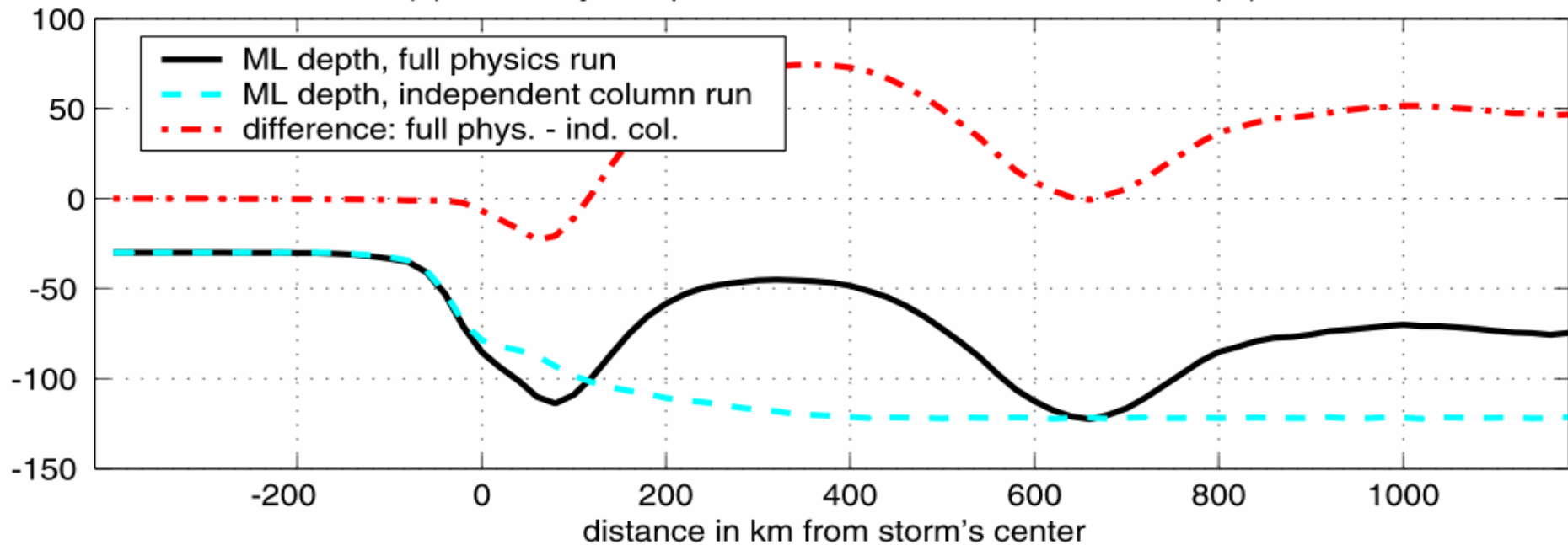
Full physics coupled run  $\Delta$  SST ( $^{\circ}$ C) at t=10 days



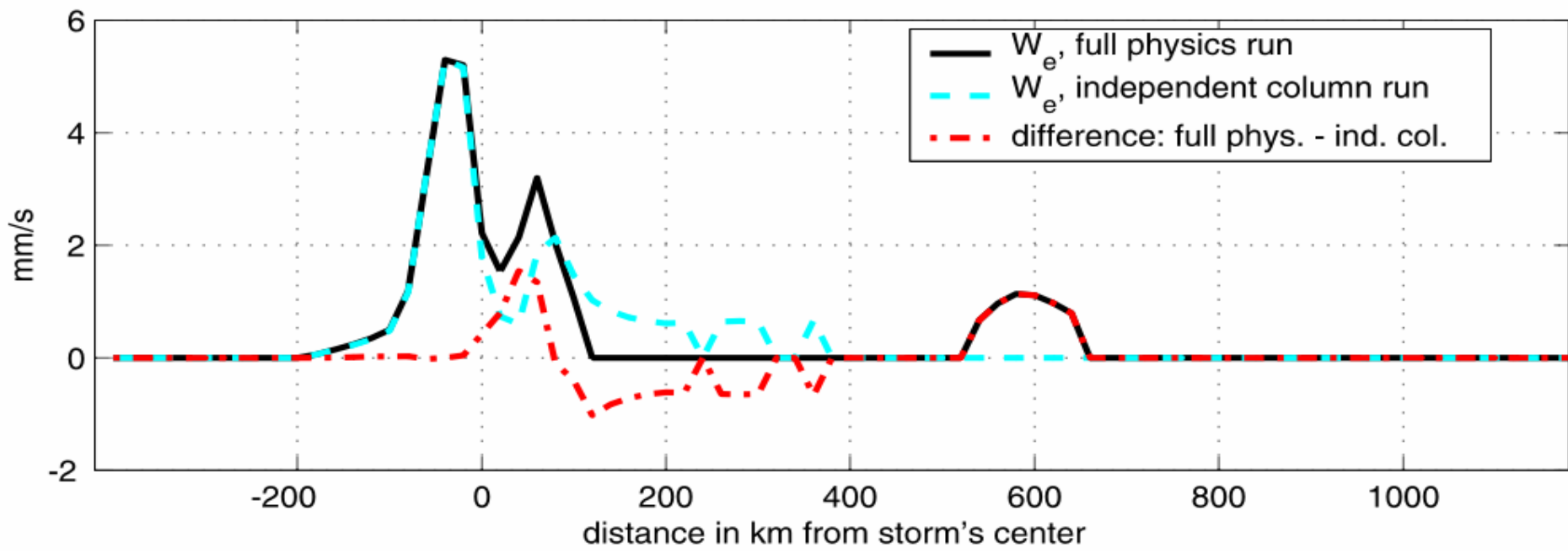
Independent columns coupled run  $\Delta$  SST ( $^{\circ}$ C) at t=10 days



(a) Mixed-layer depth on the axis of the storm's motion (m)



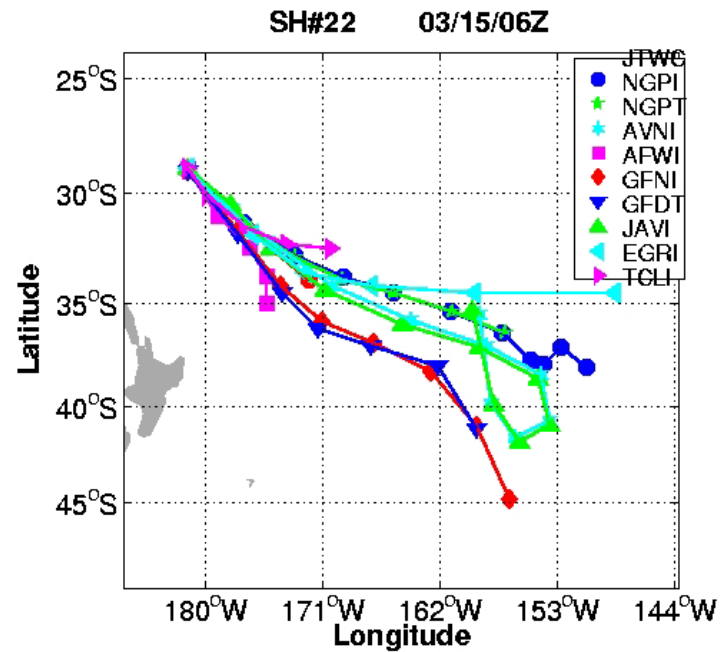
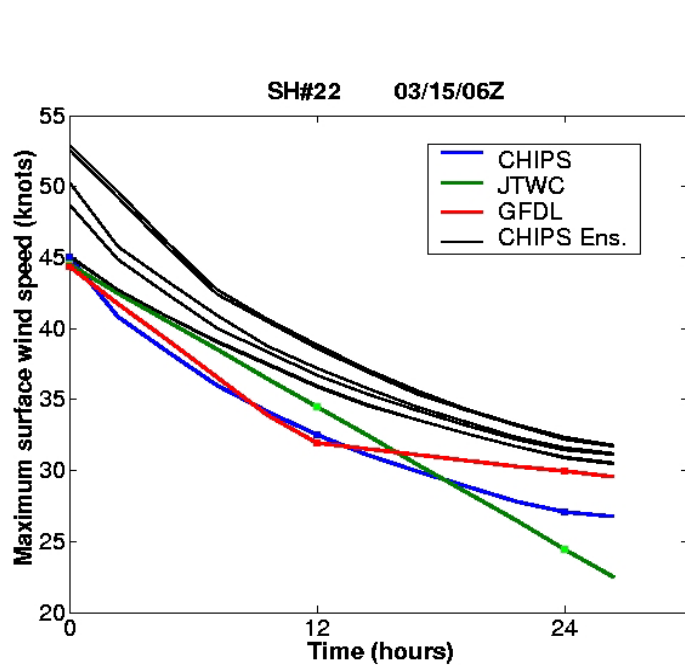
(b) The entrainment velocity,  $W_e$ , on the axis of the storm's motion (mm/s)



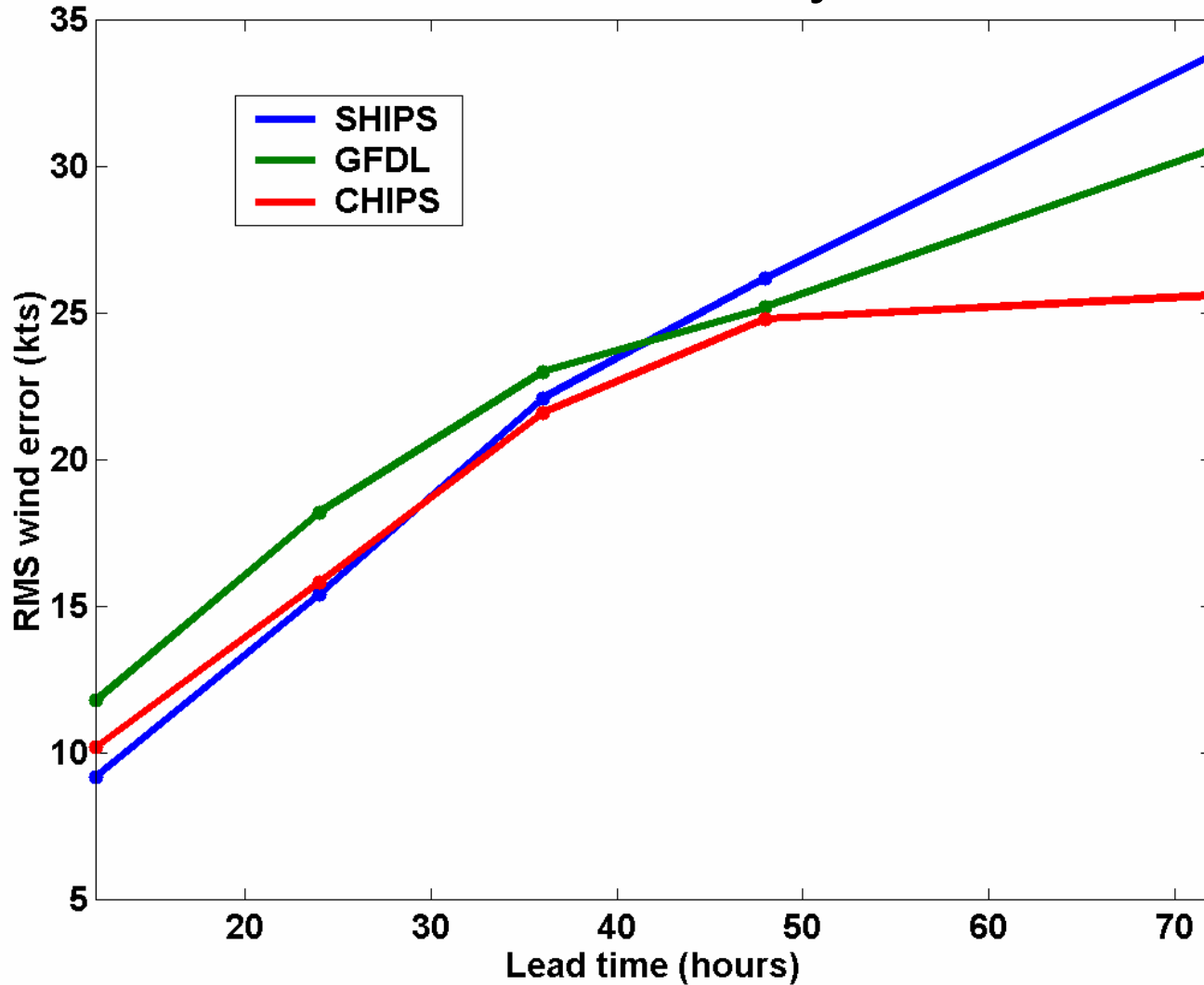
# Landfall Algorithm:

- Enthalpy exchange coefficient decreases linearly with land elevation, reaching zero when  $h = 40 \text{ m}$
- This accounts in a crude way for heat fluxes from low-lying, swampy or marshy terrain

# Real-Time Forecasts Posted at <http://wind.mit.edu/~emanuel/storm.html>

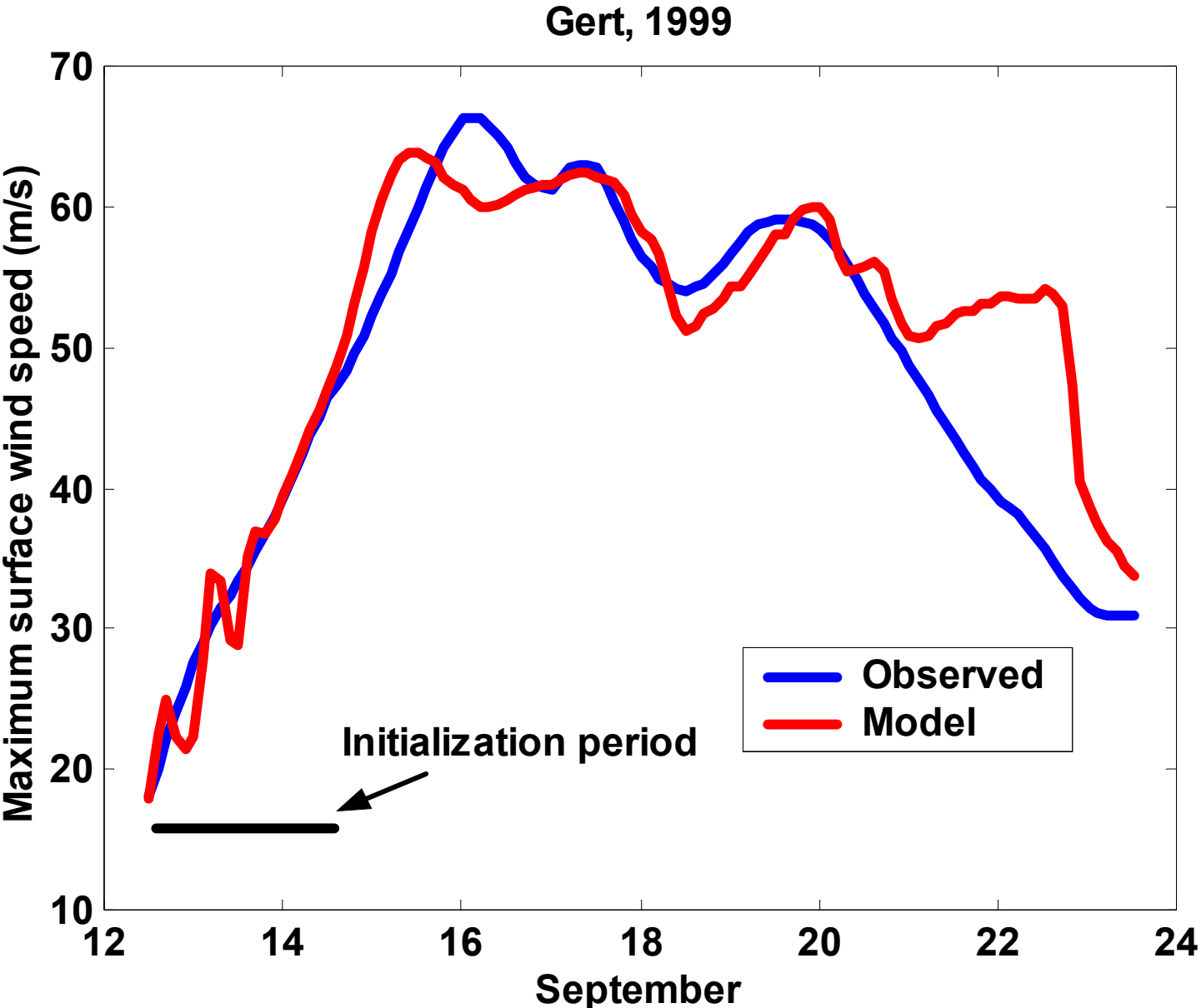


# Overall Forecast Performance: 2002 Atlantic Intensity Errors

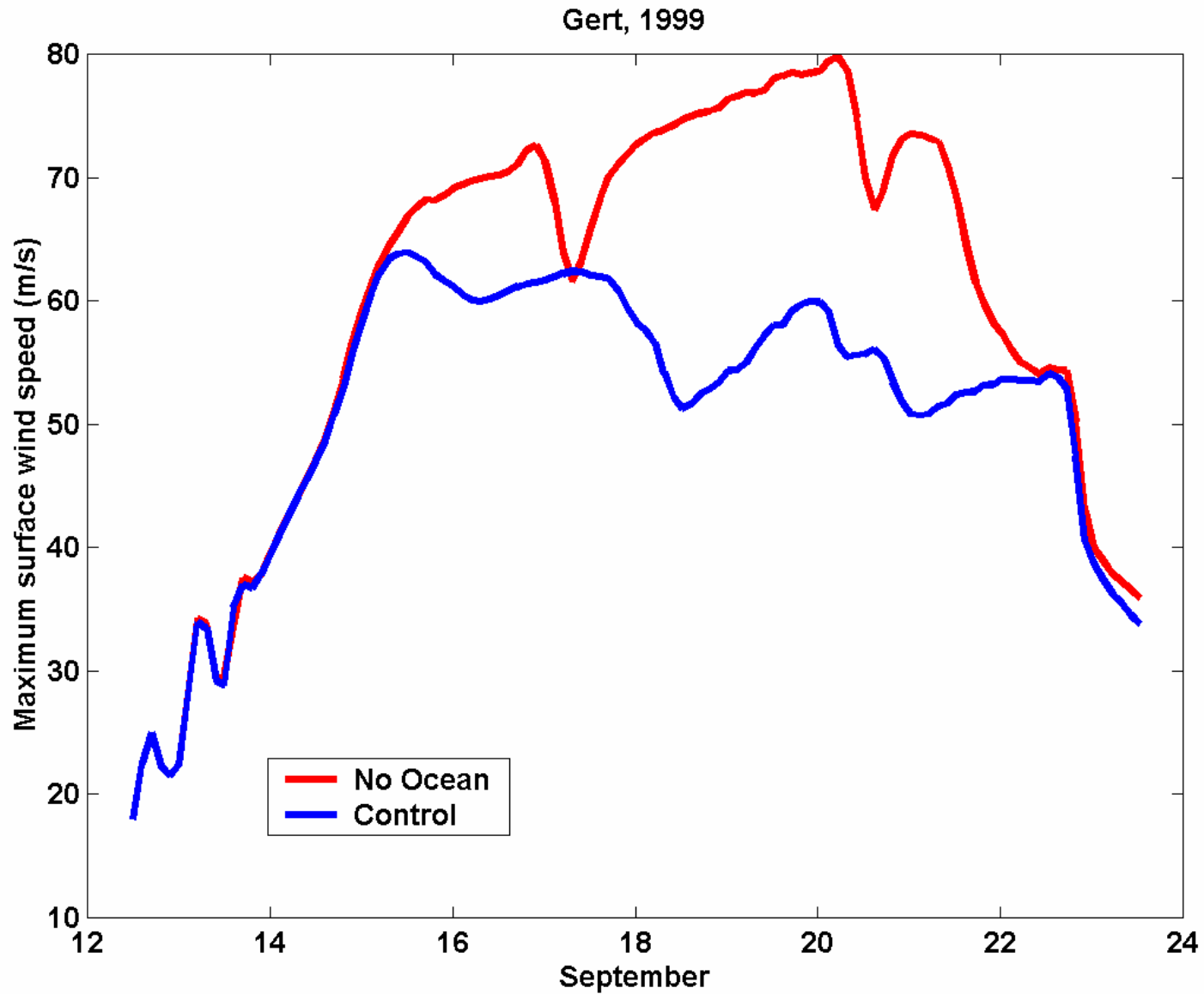




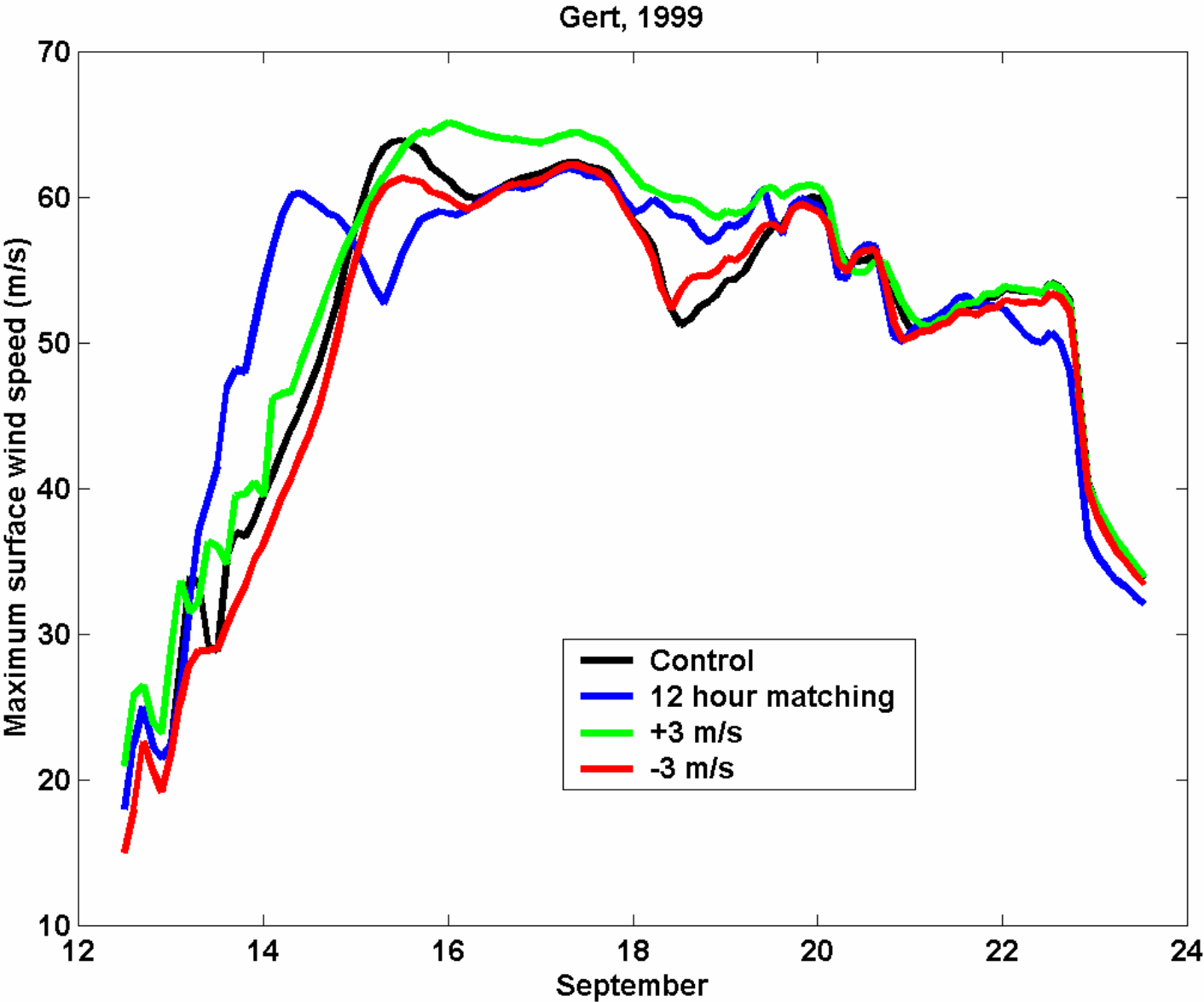
Hurricane Gert occurred in a low-shear environment and moved over an ocean close to its climatological mean state.



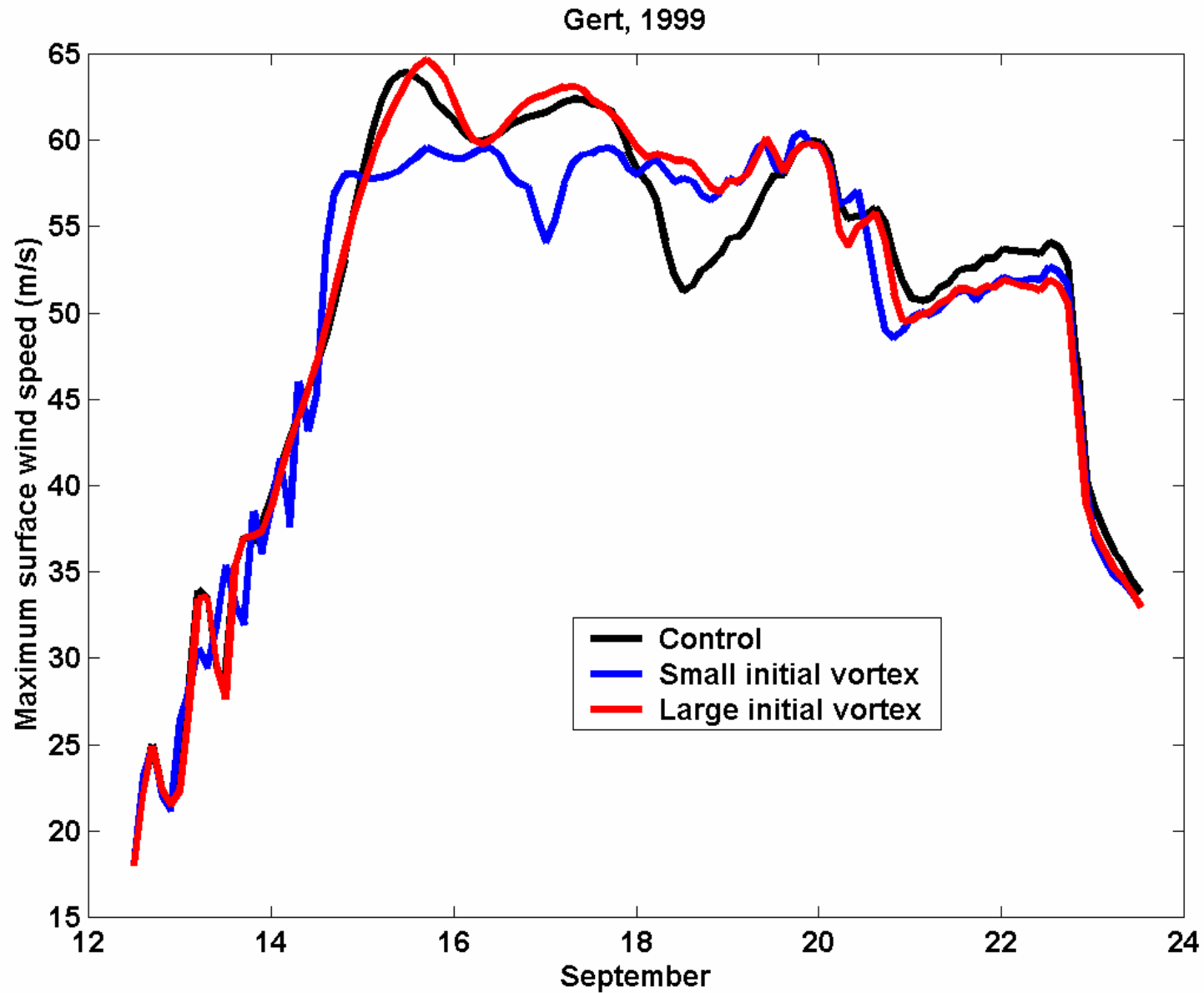
# Same simulation, but with fixed SST:



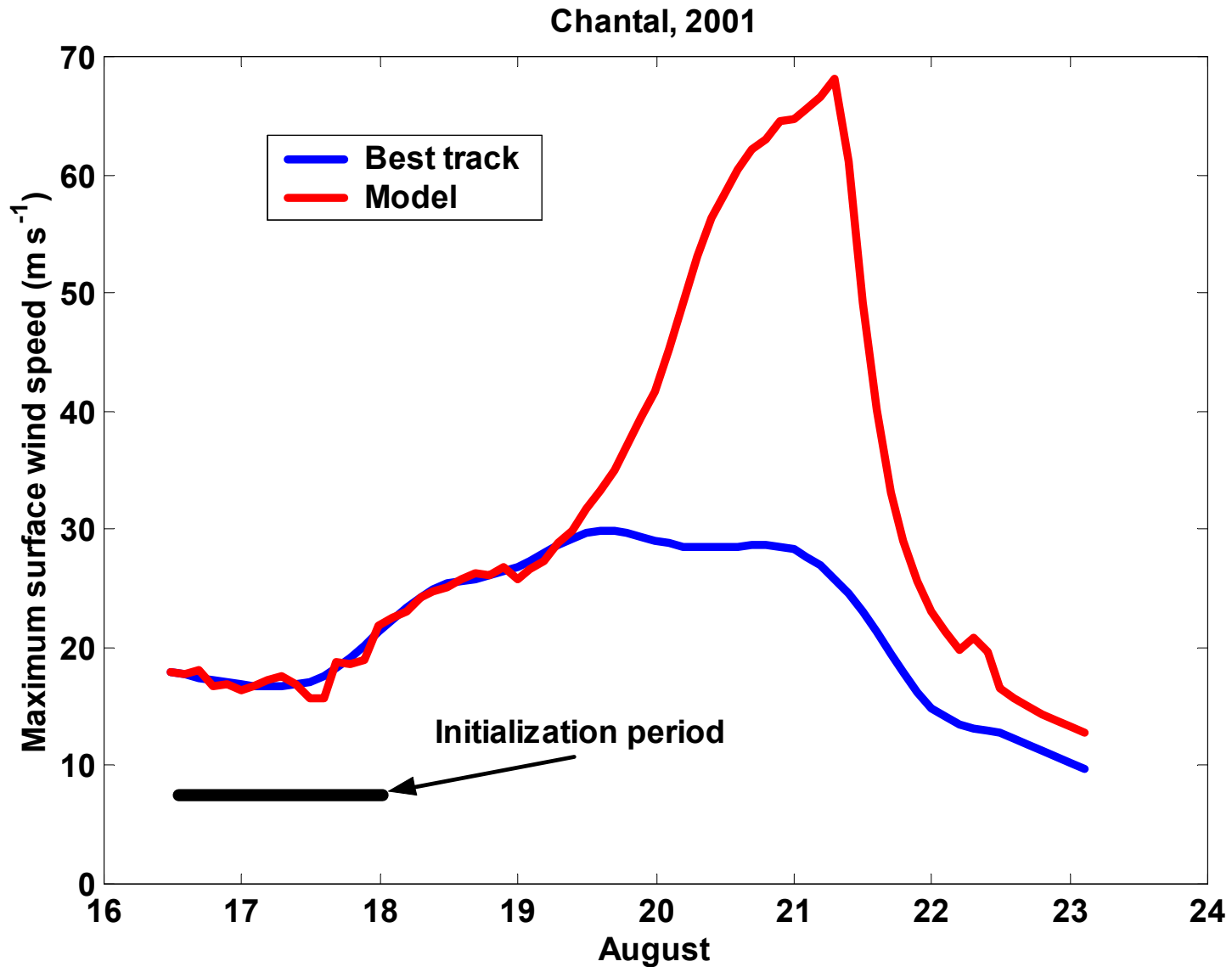
Sensitivity to initial intensity error and length of matching period:



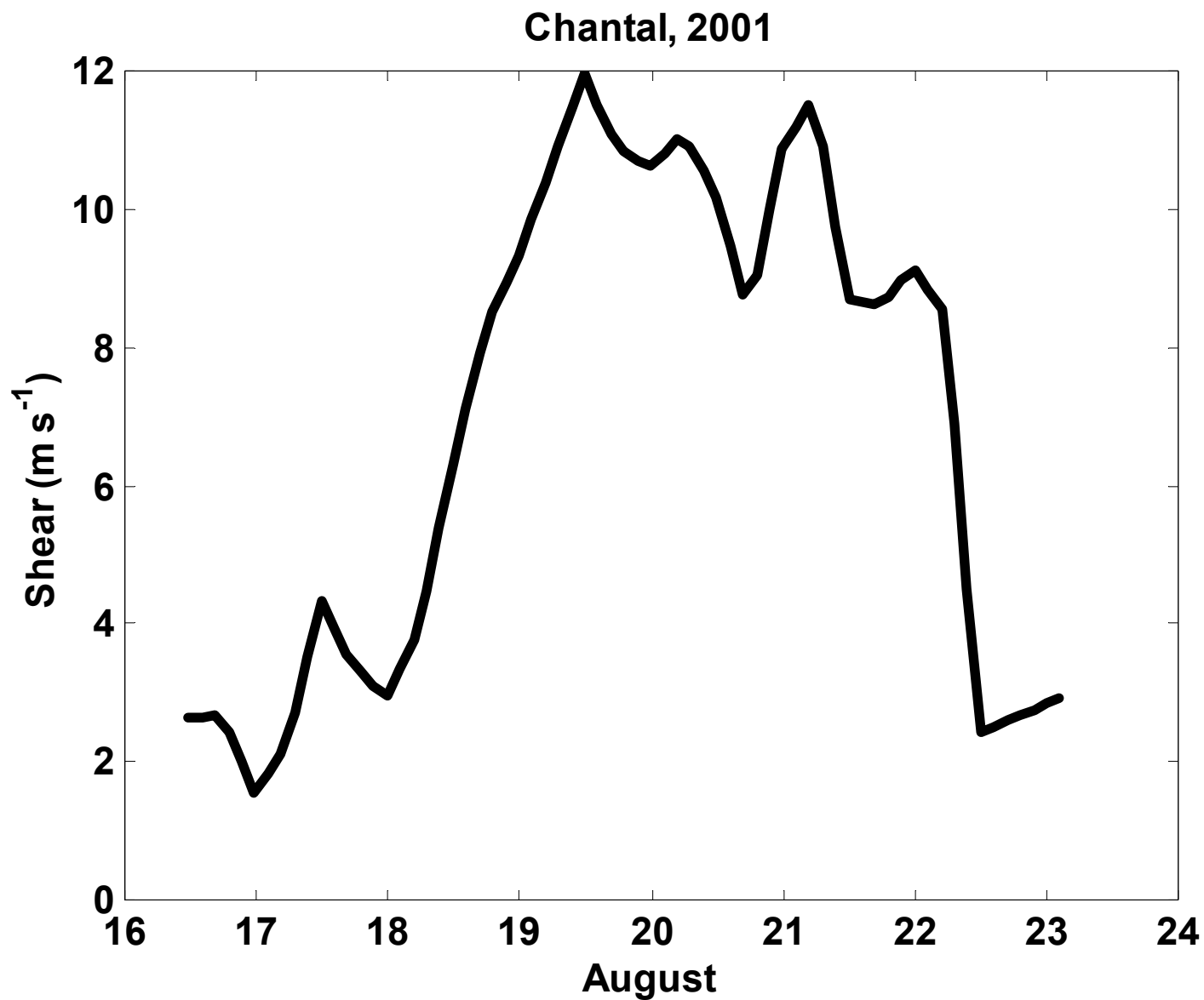
# Sensitivity to size of starting vortex



# Model performs poorly when substantial shear is present, as in Chantal, 2001:



# 850 – 200 hPa environmental shear:



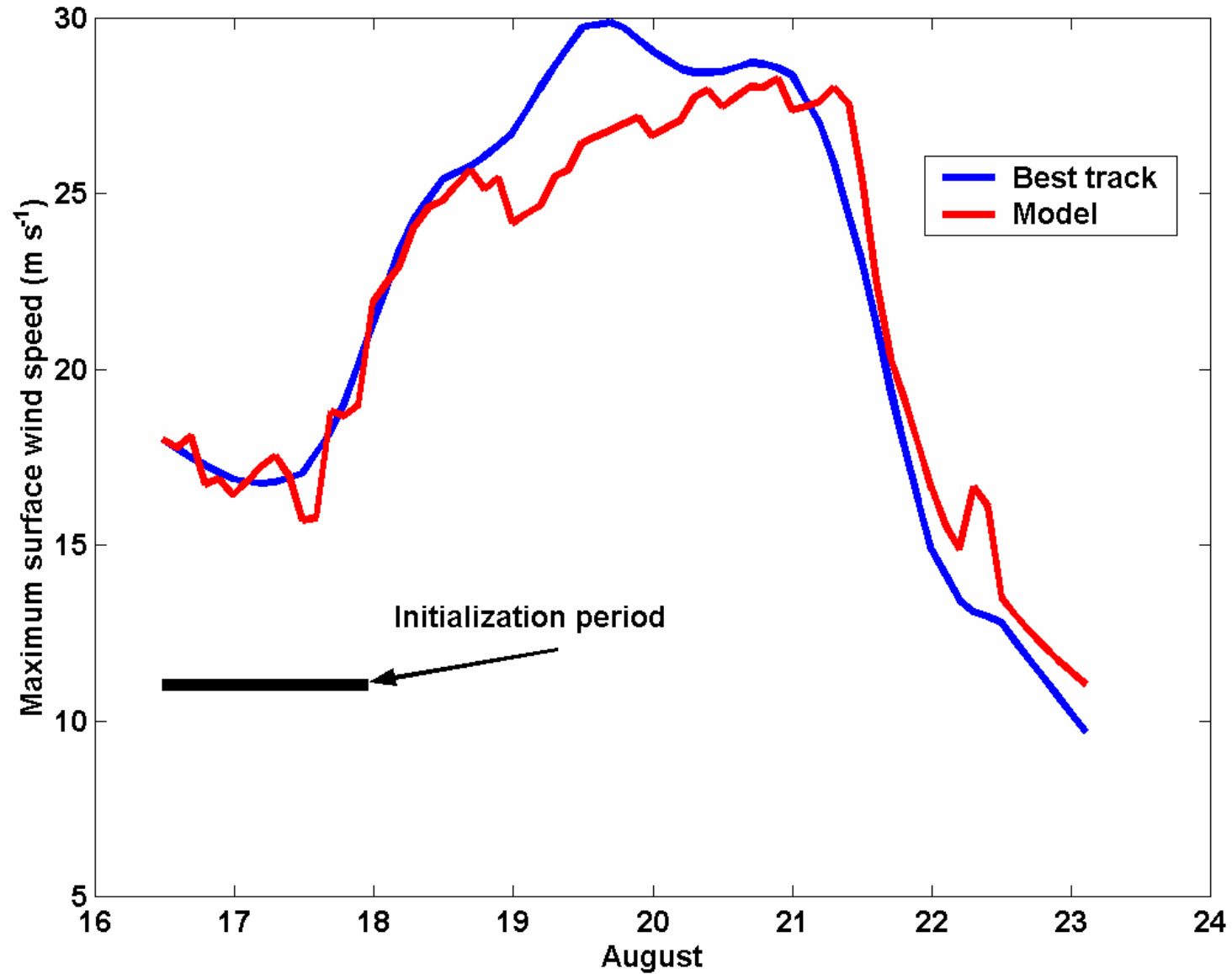
Add “ventilation” term to model equation governing middle level  $\theta_e$ . Coefficient determined by matching model to long record of observations:

$$\frac{\partial \theta_e}{\partial t} = \dots - \mathbf{v} \left( \theta_e - \theta_{e0} \right)$$

$$\mathbf{v} = V_{max}^2 V_{shear}^2$$

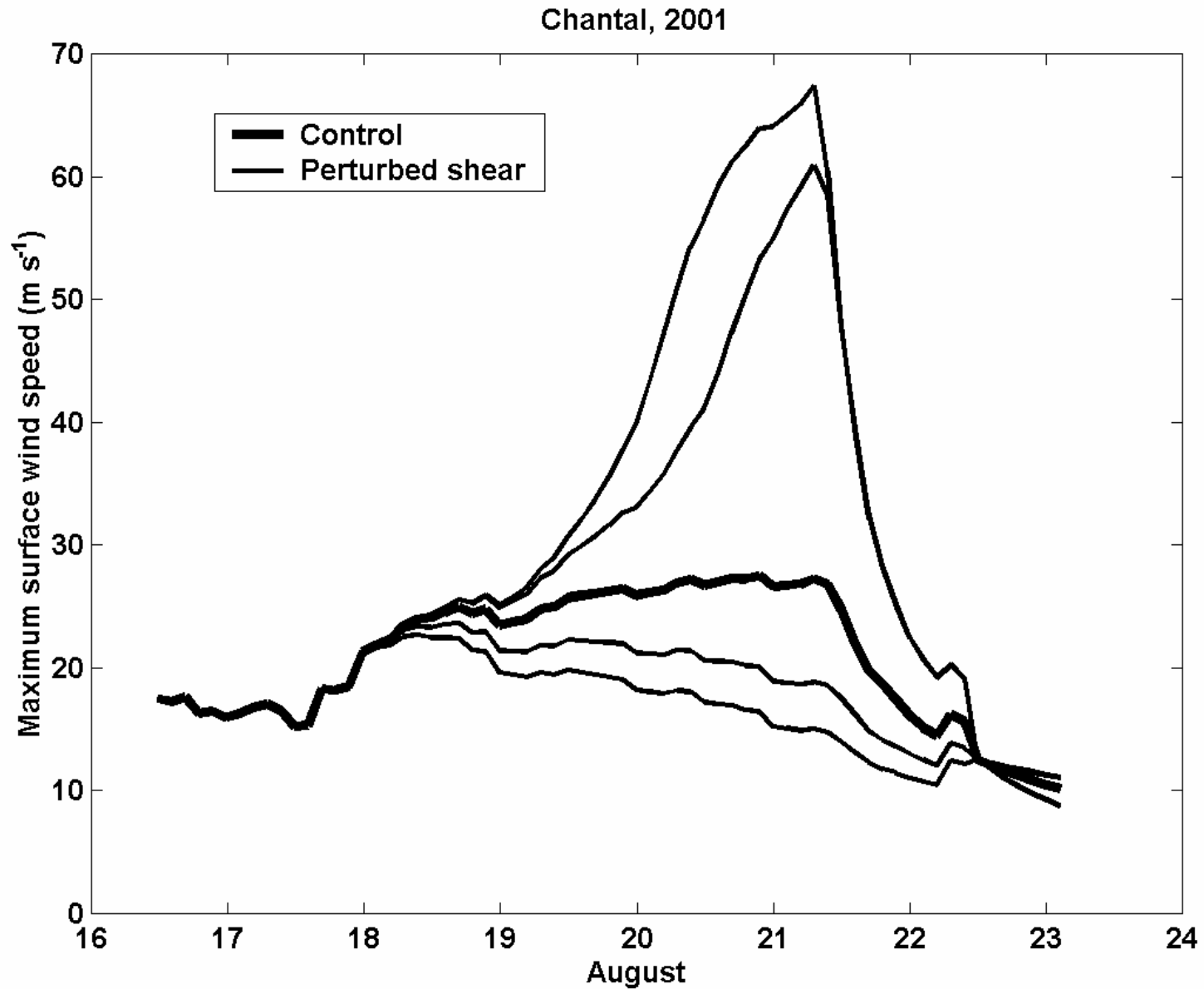
# Result:

Chantal, 2001

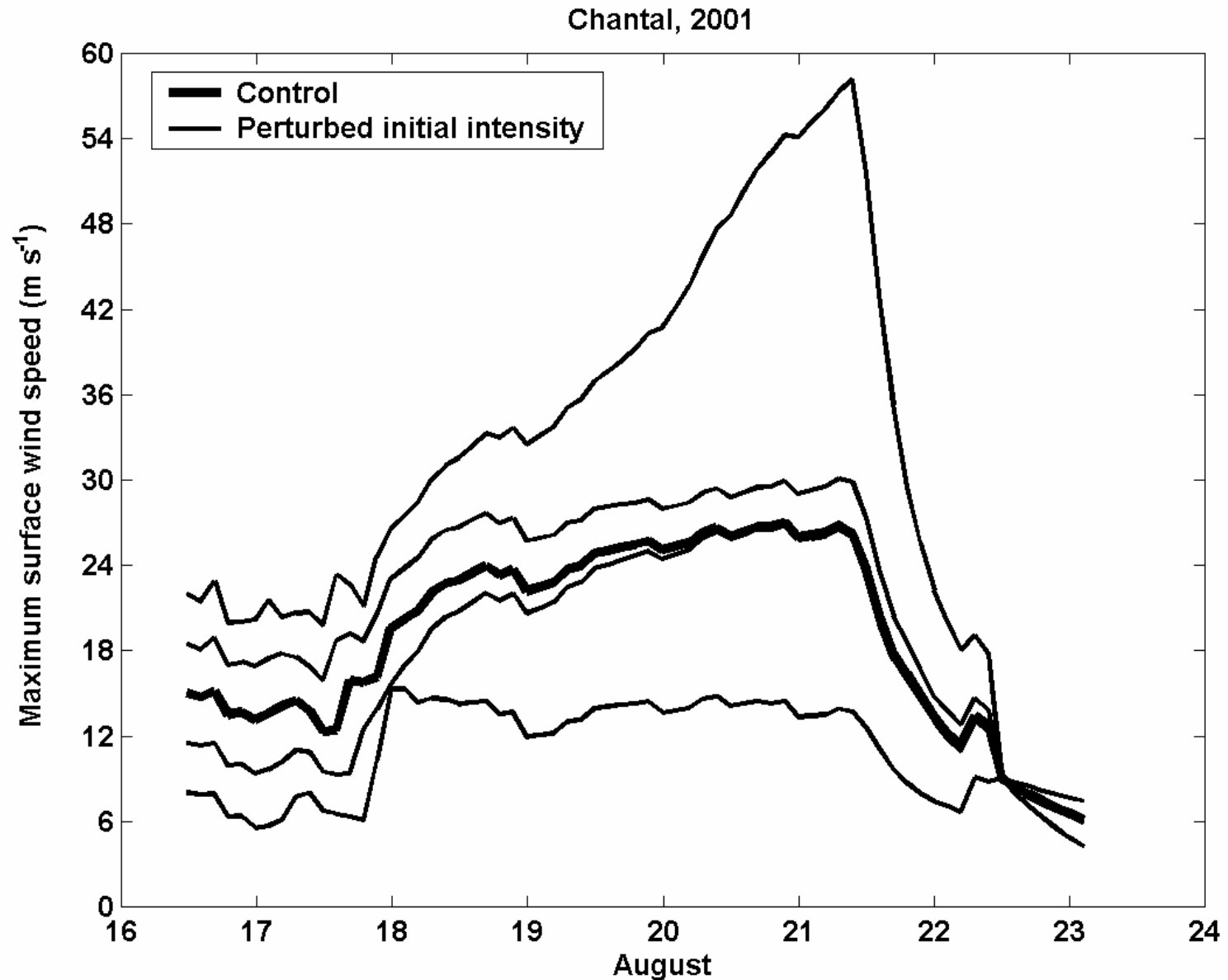




But model sensitive to shear: This shows the results of varying Shear magnitude by +/- 5 kts and +/- 10 kts:

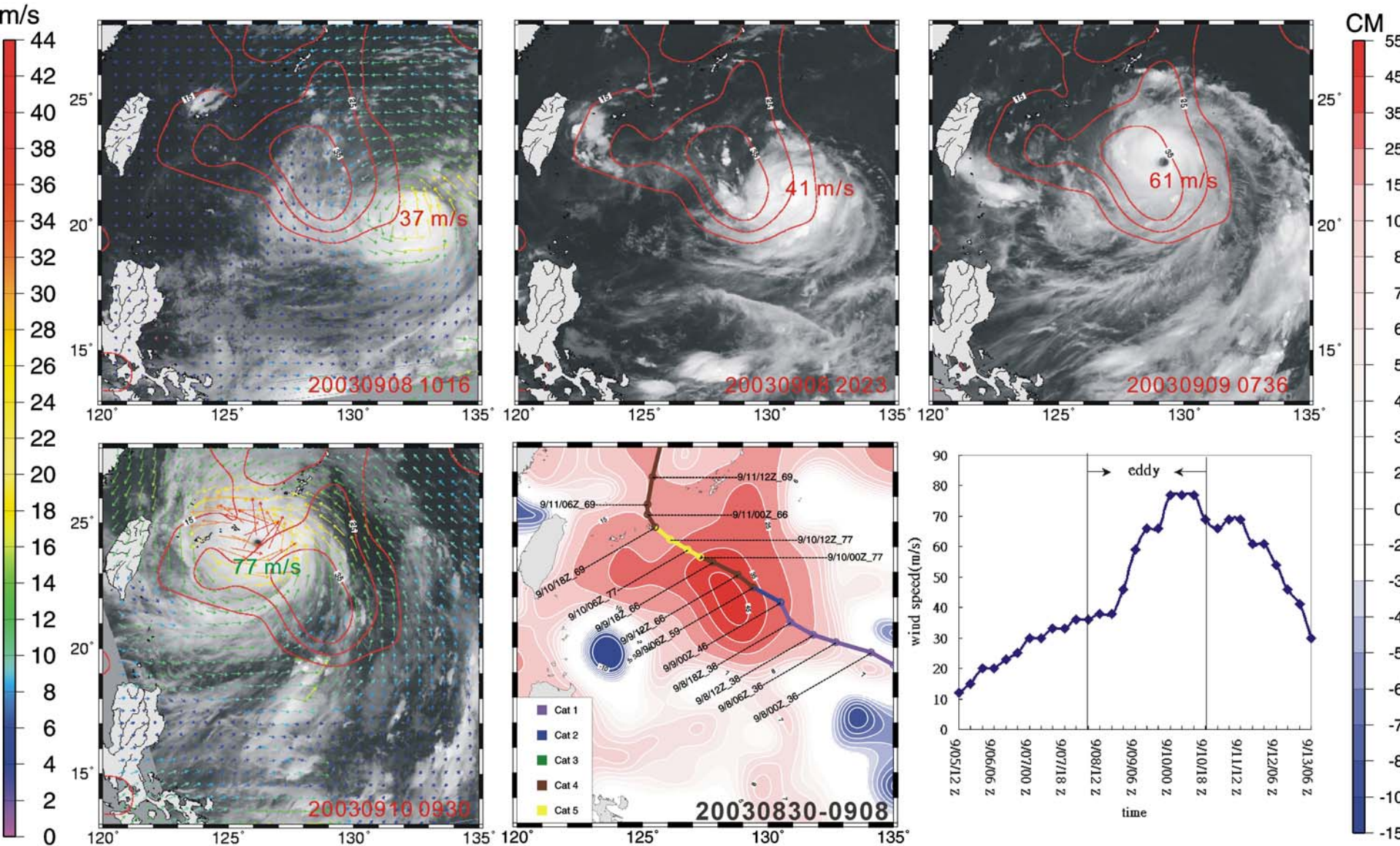


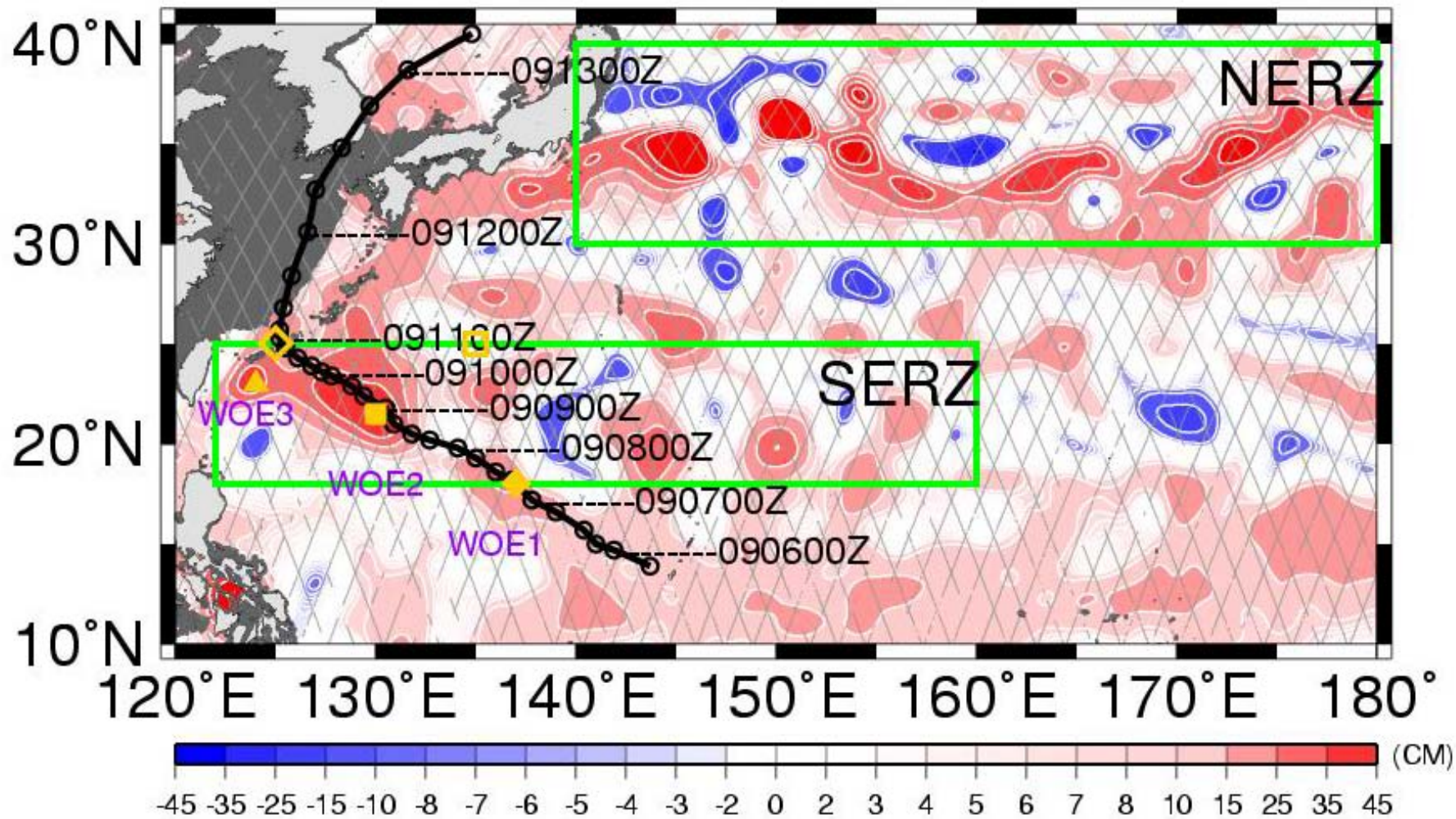
Presence of shear also makes model sensitive to initial conditions. Here the initial intensity is varied by +/- 3 m/s and +/- 6 m/s:



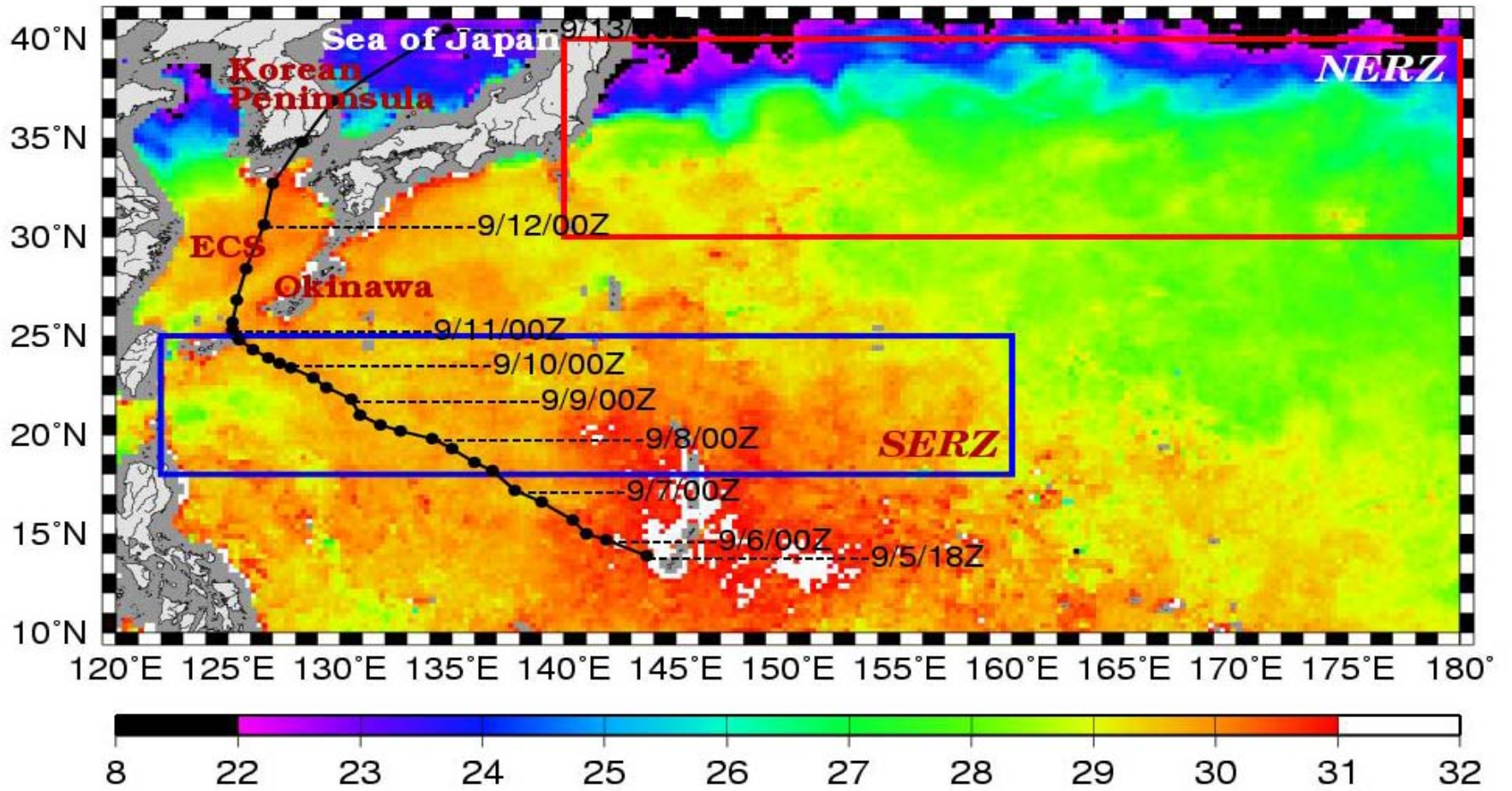
Some storms are influenced by upper ocean anomalies from monthly climatology. An example is that of Typhoon Maemi of 2003, which passed over a warm eddy in the western North Pacific:

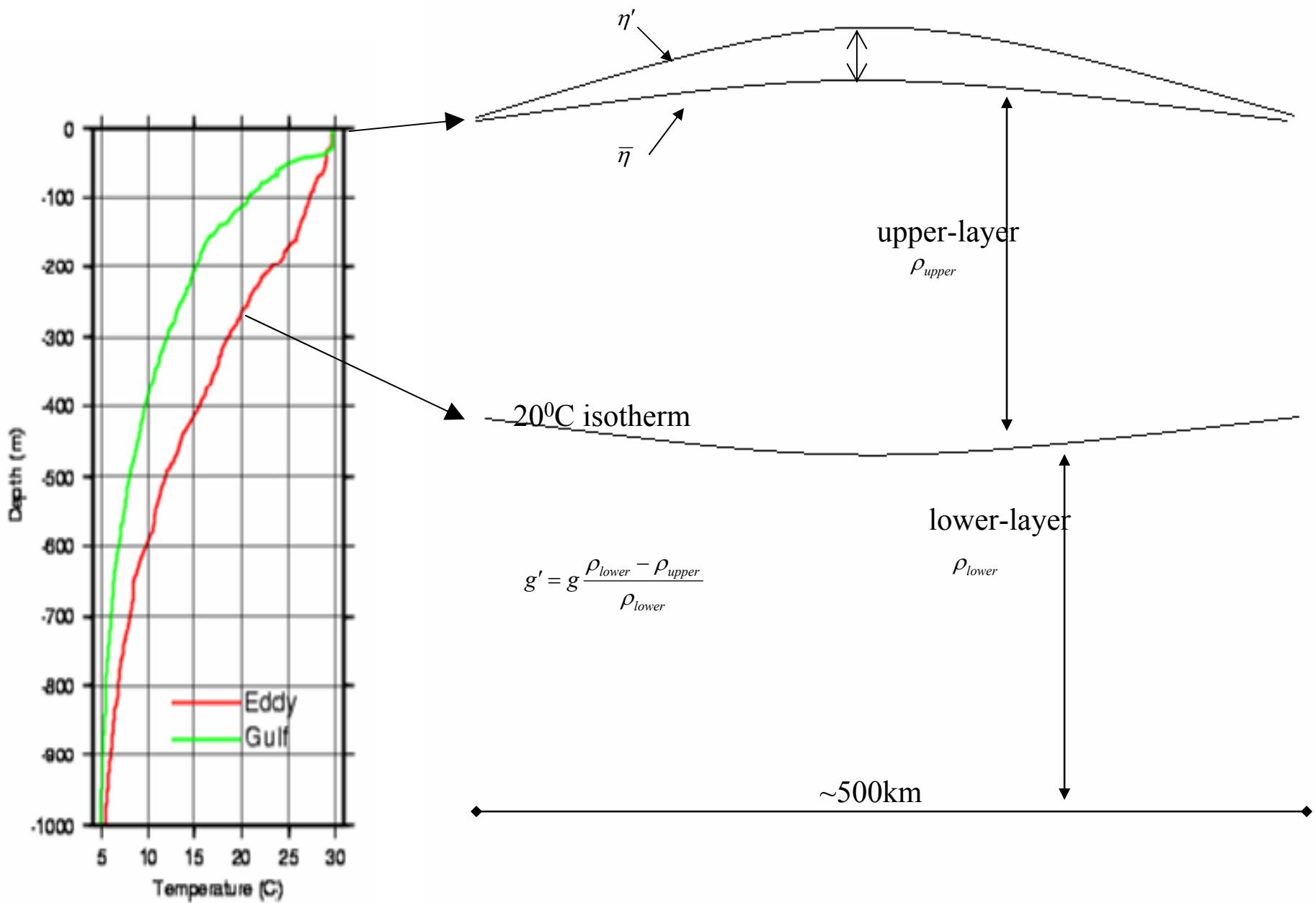
# Typhoon Maemi, 2003



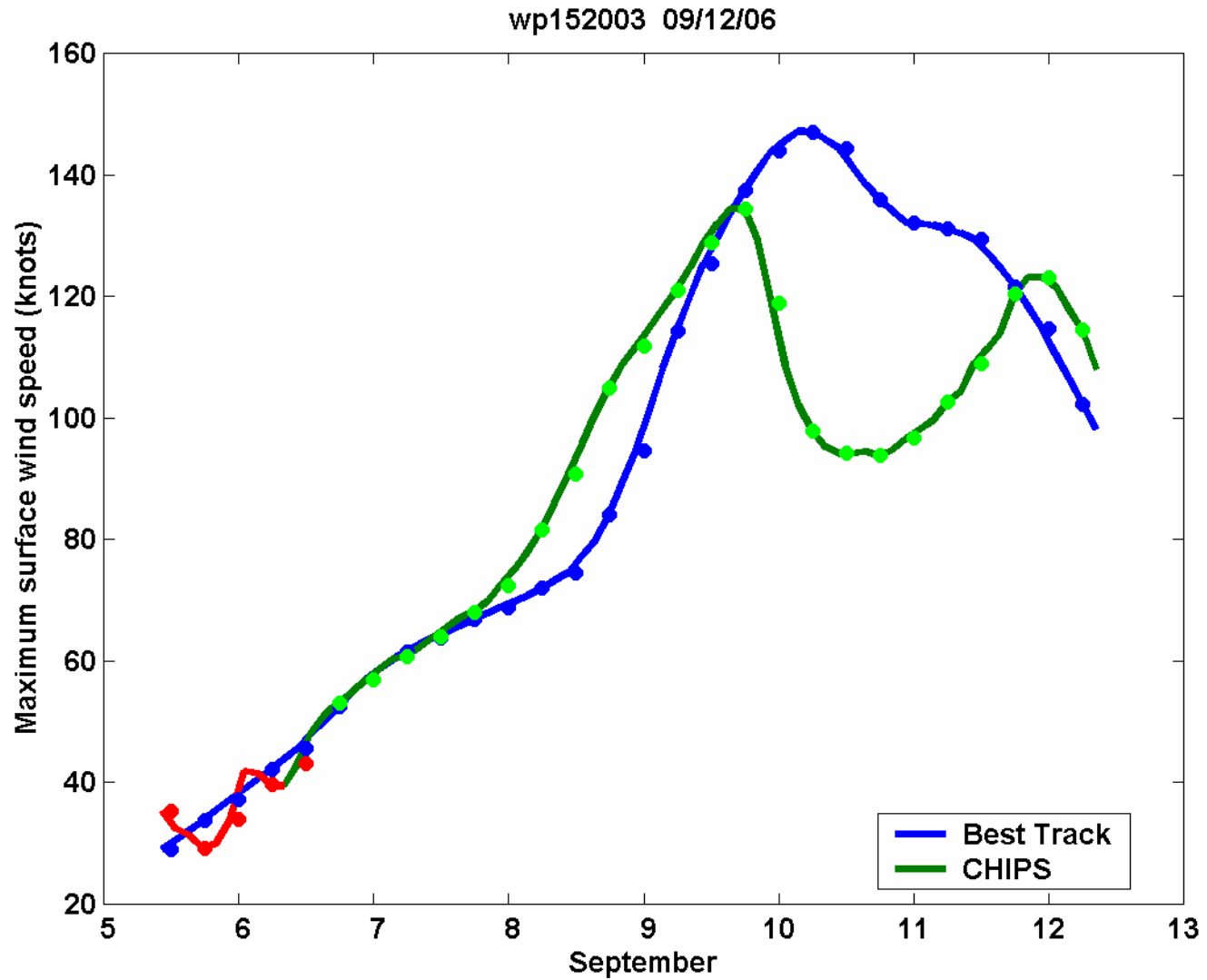


tj\_20030827-0905



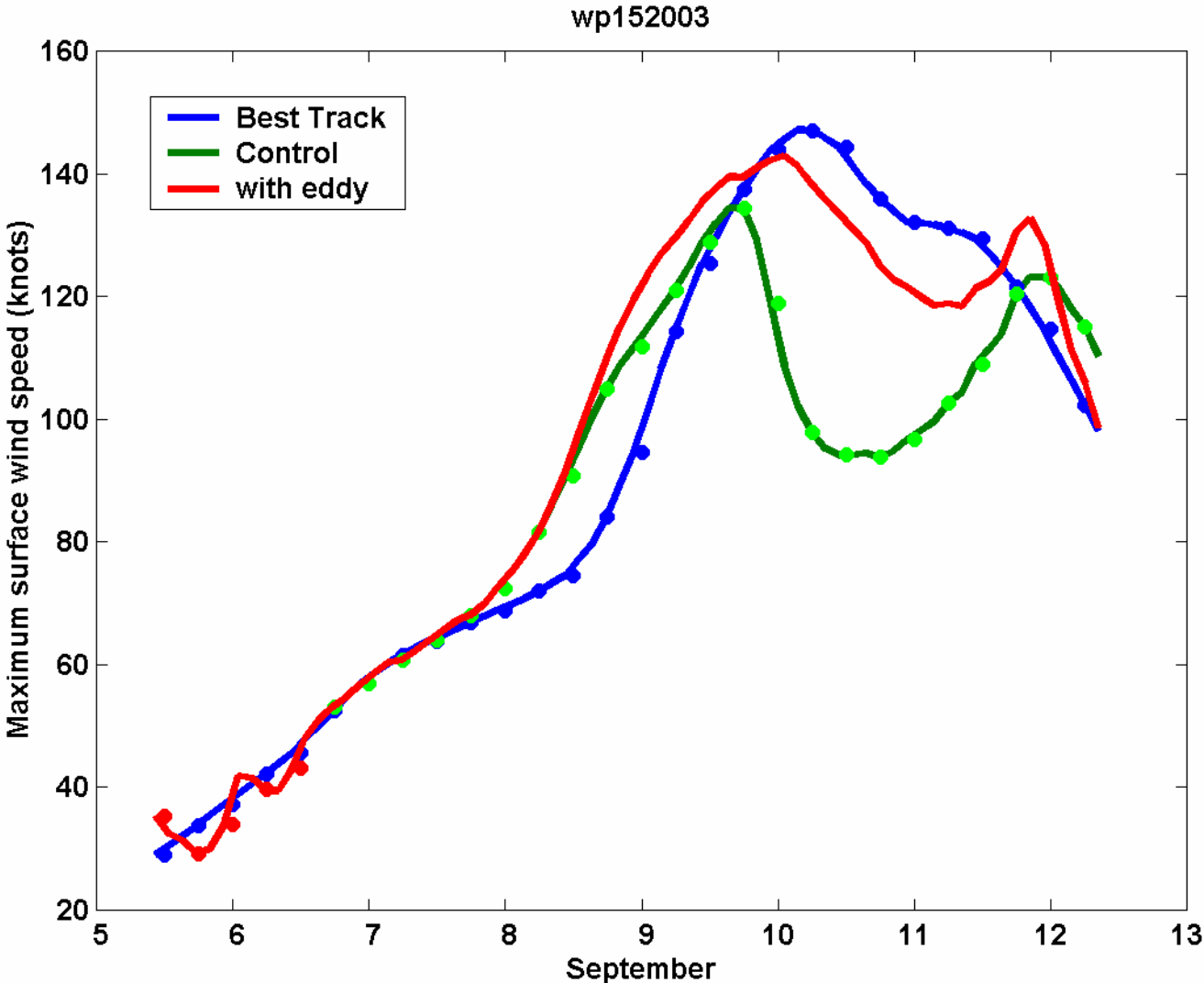


# Standard Simulation:



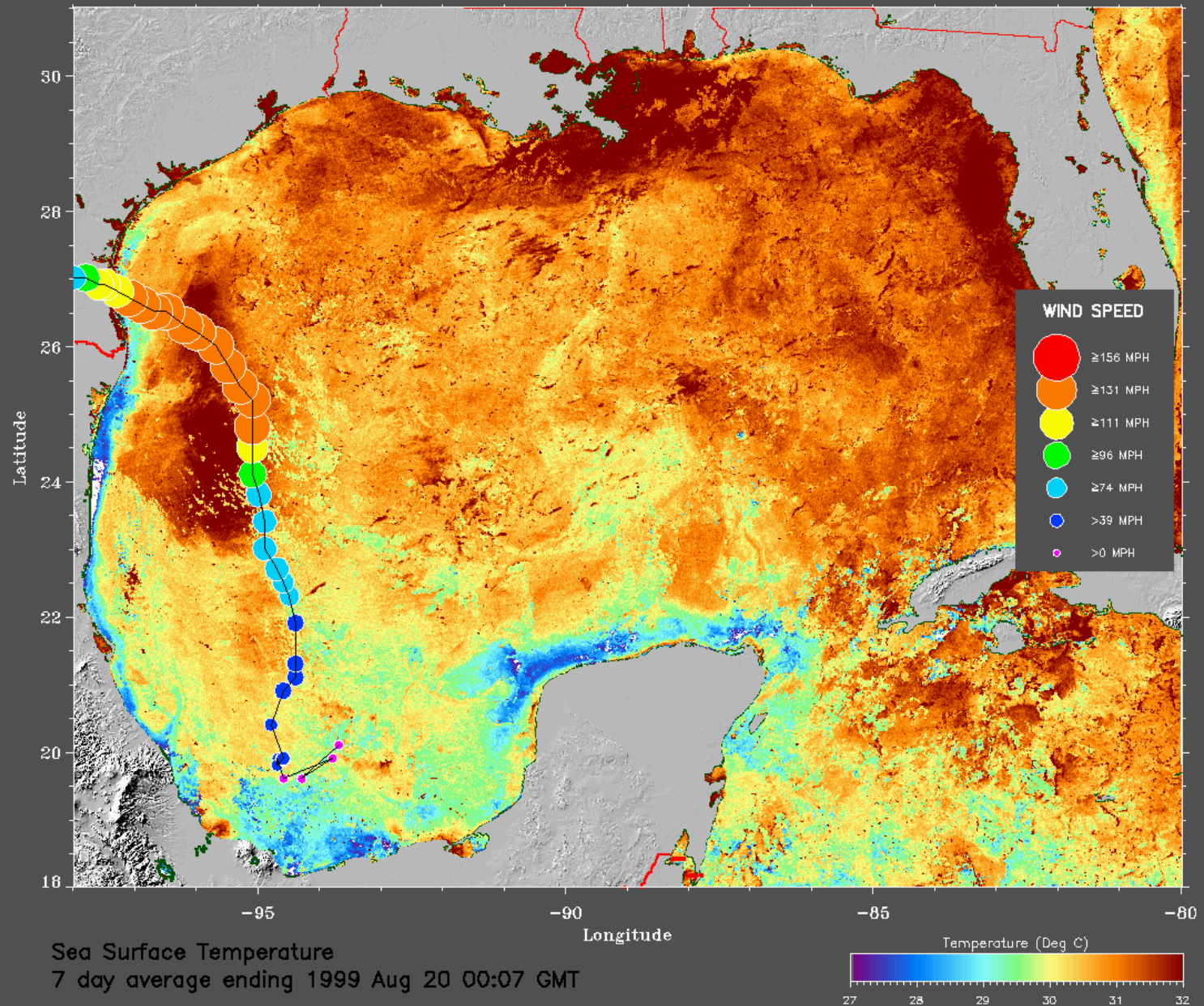


# Using Sea Surface Altimetry to Estimate Upper Ocean Thermal Structure:

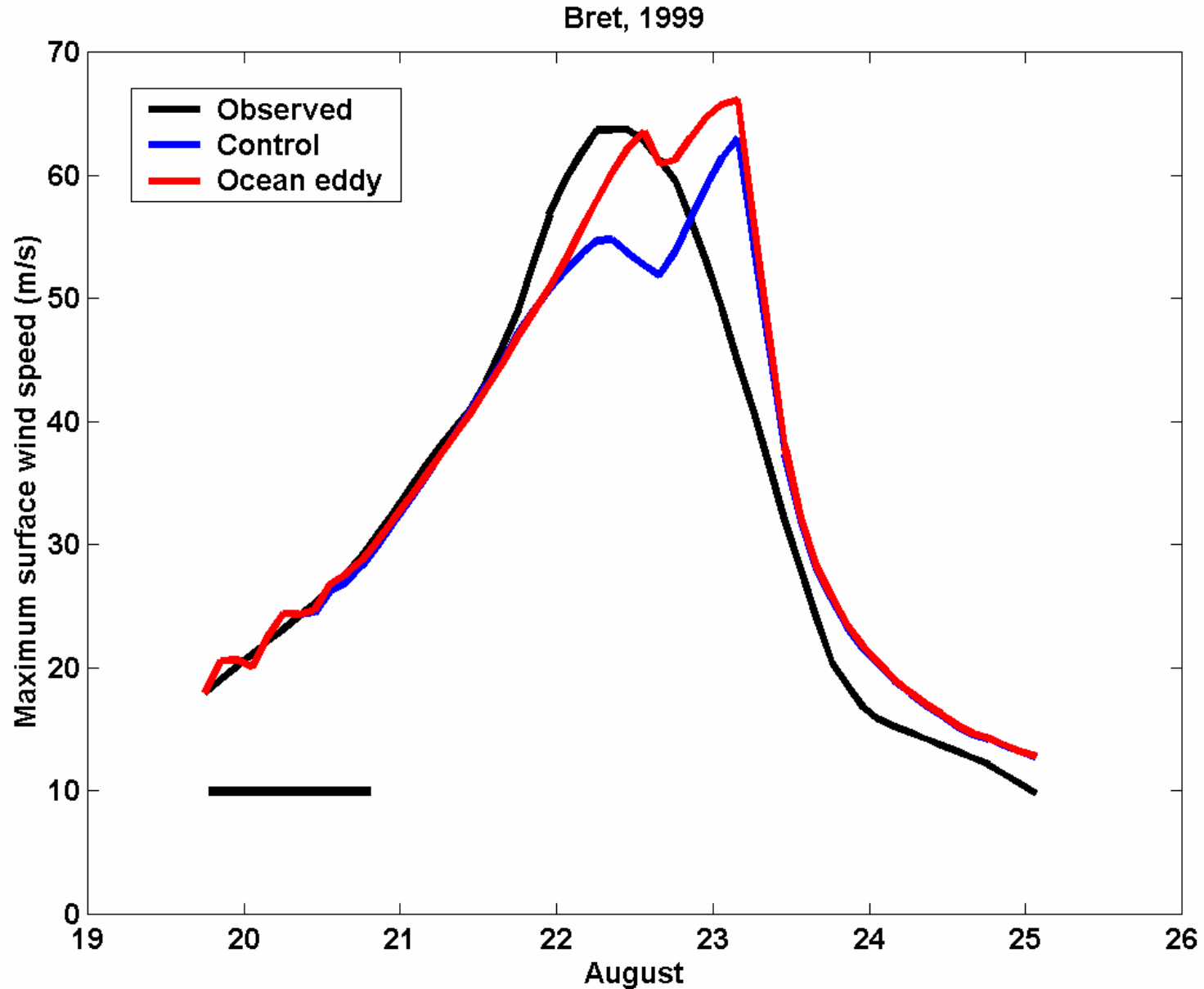


# Hurricane Bret

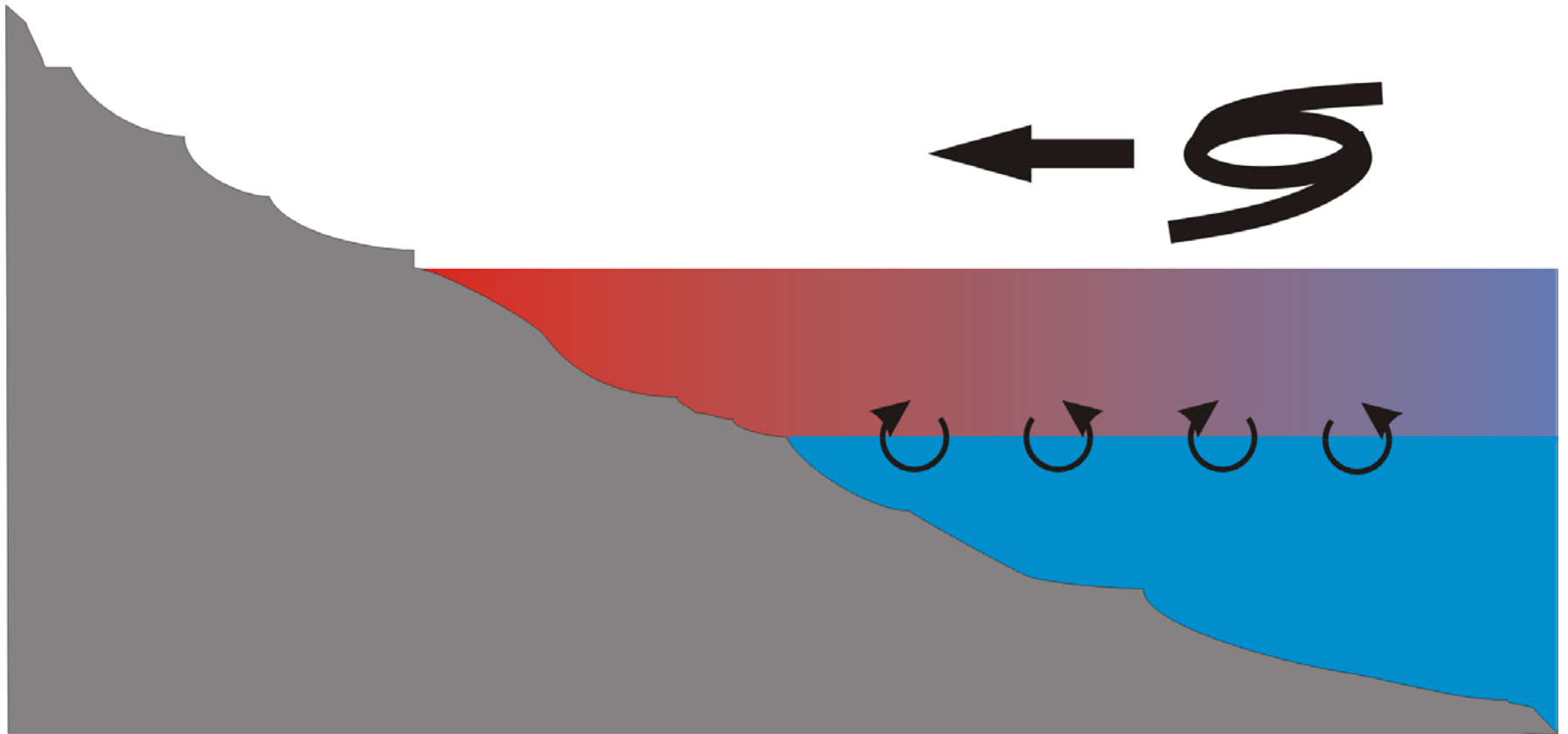
21:00 Wed August 18, 1999 to 21:00 Mon August 23, 1999 UTC



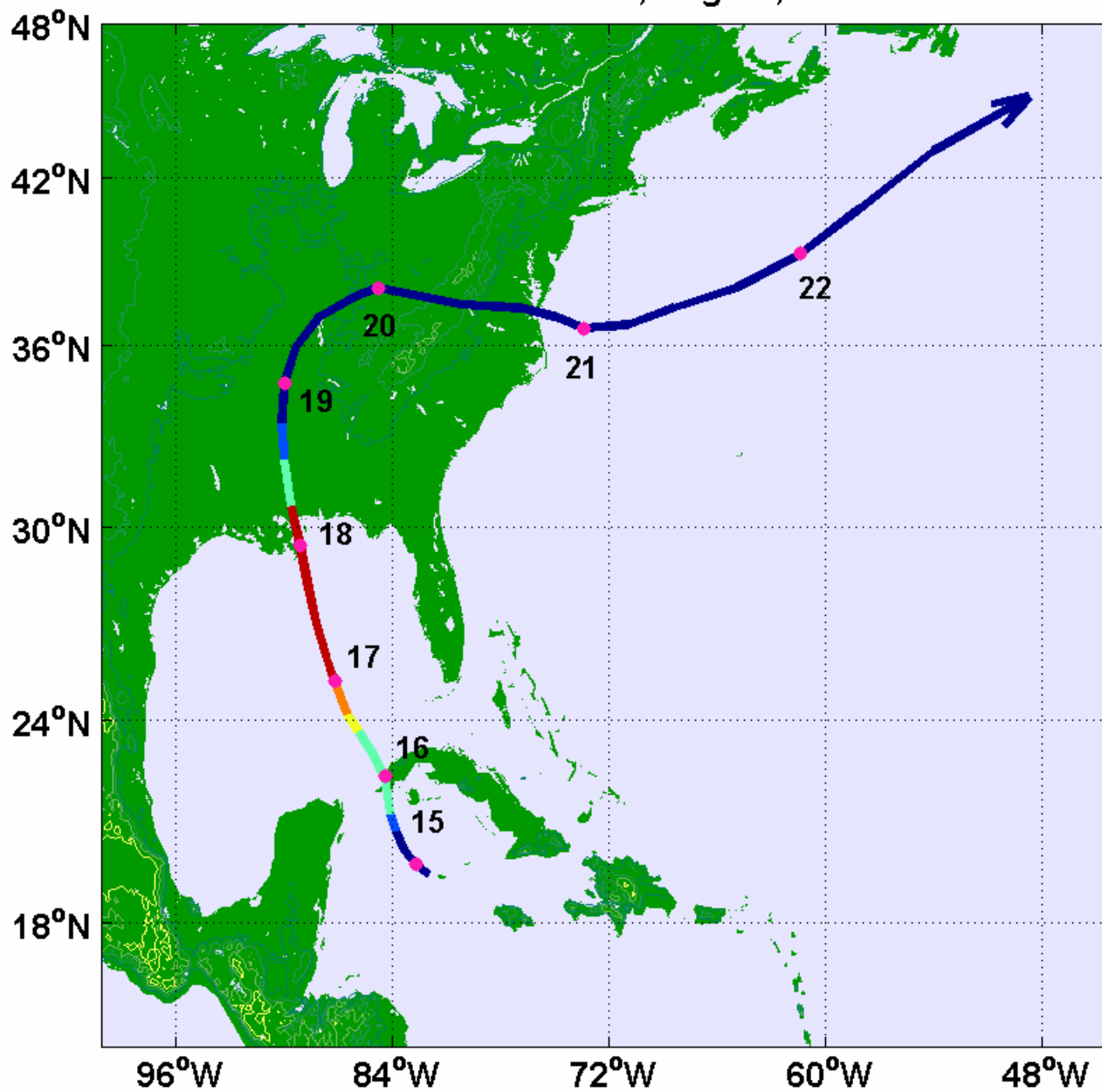
This shows model hindcasts with and without the ocean eddy, as estimated from sea surface altimetry data:



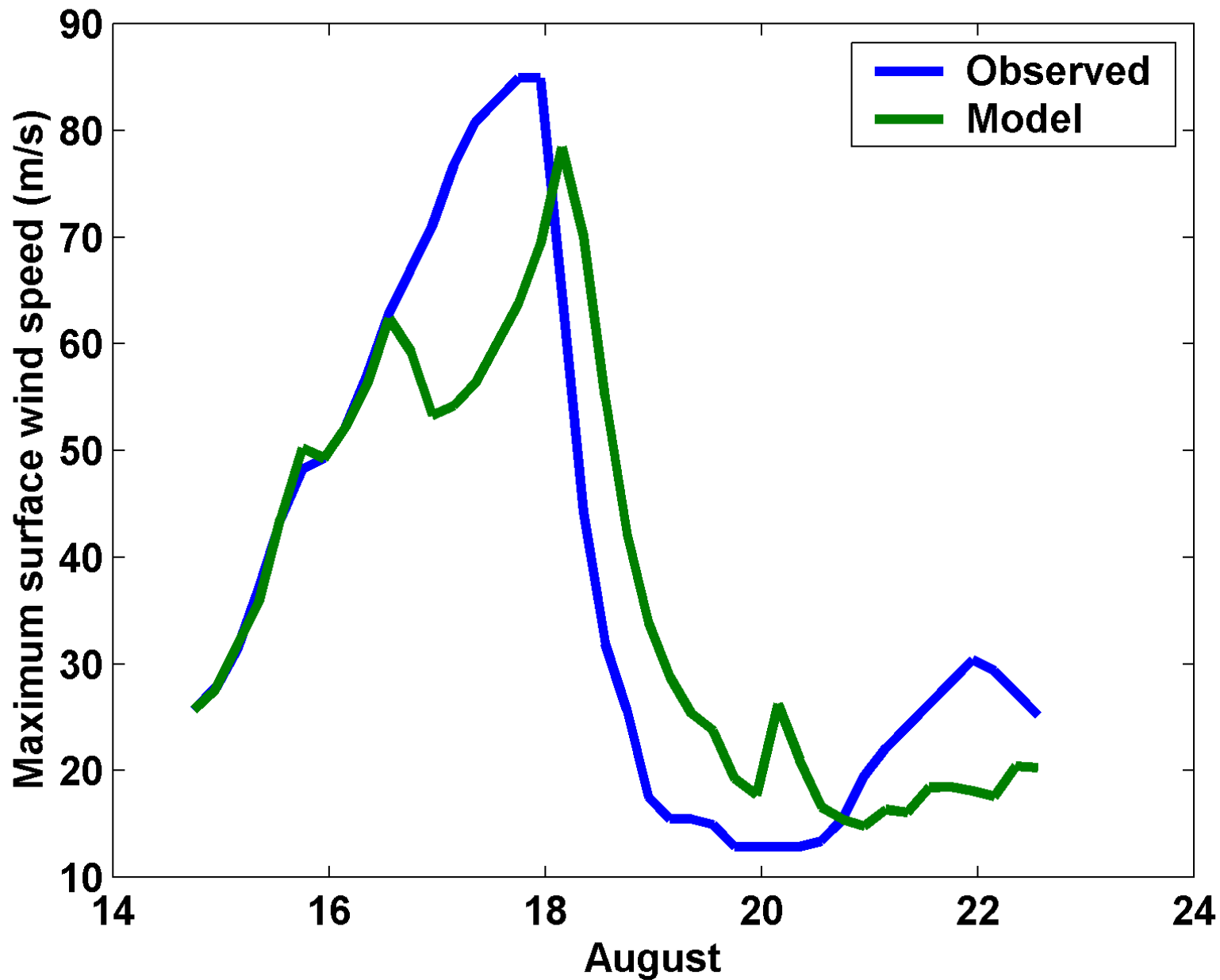
As TCs approach shore, shoaling water isolates surface mixed layer... surface cooling ceases.

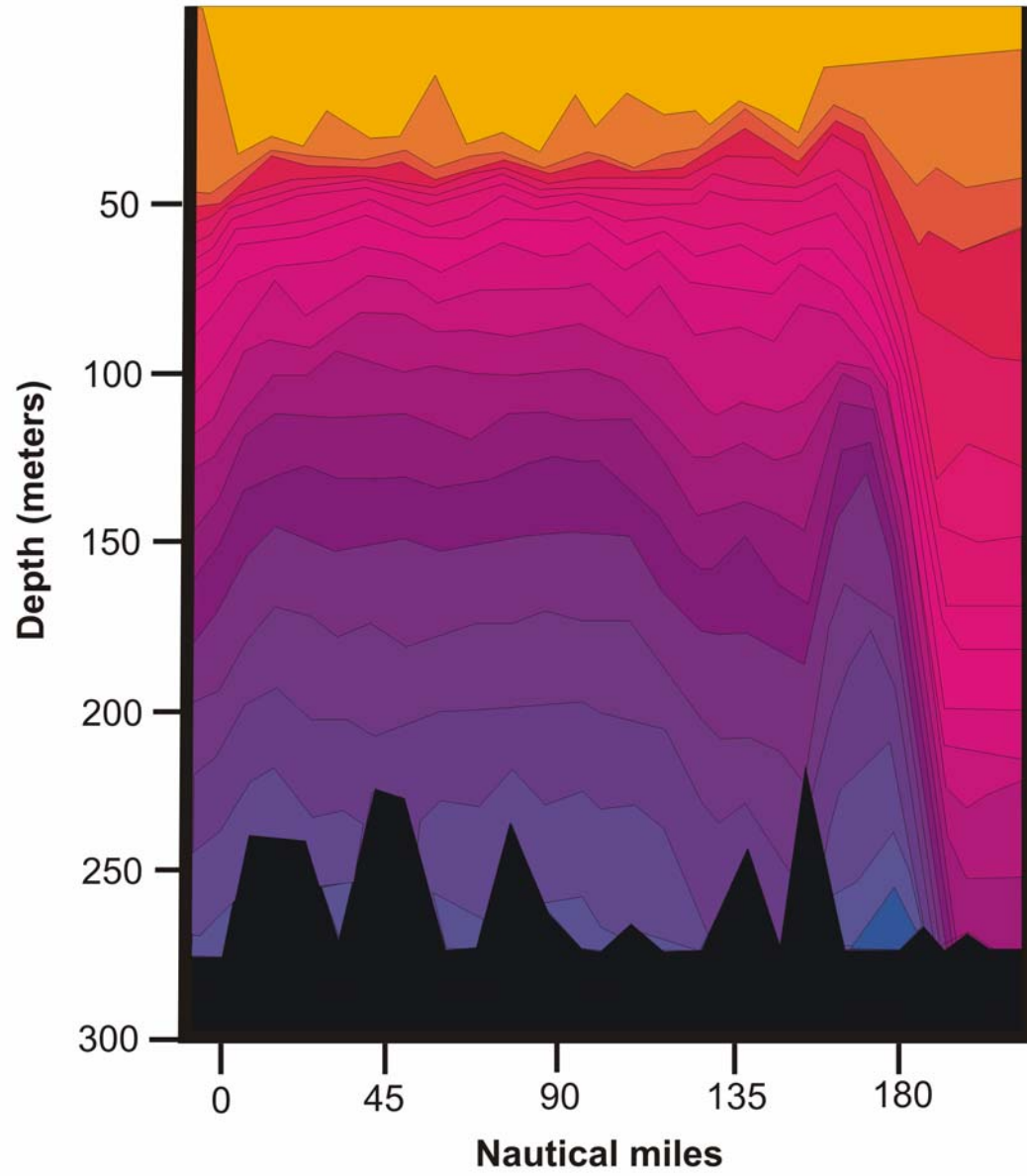


# Hurricane Camille, August, 1969

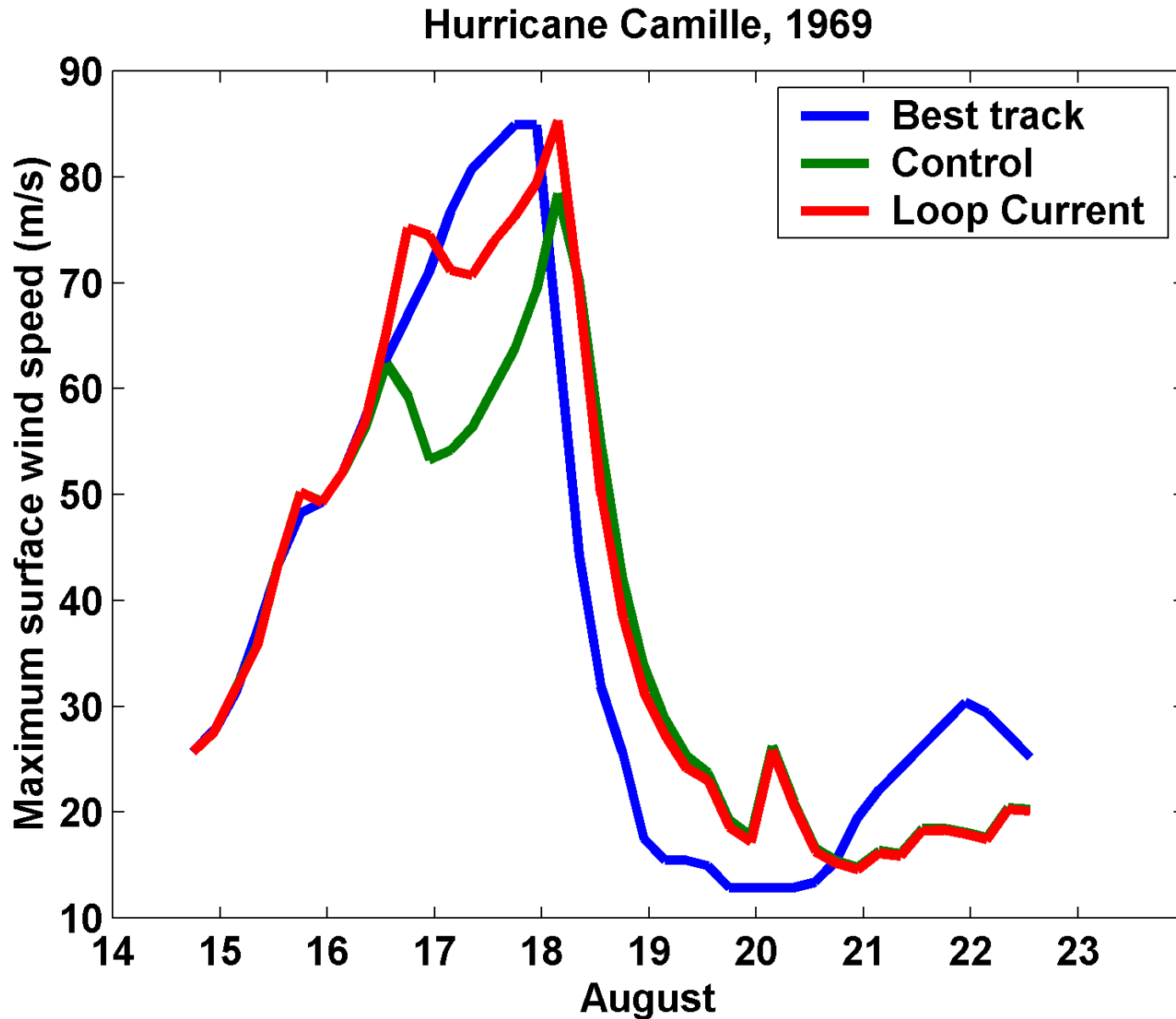


# Hurricane Camille, 1969



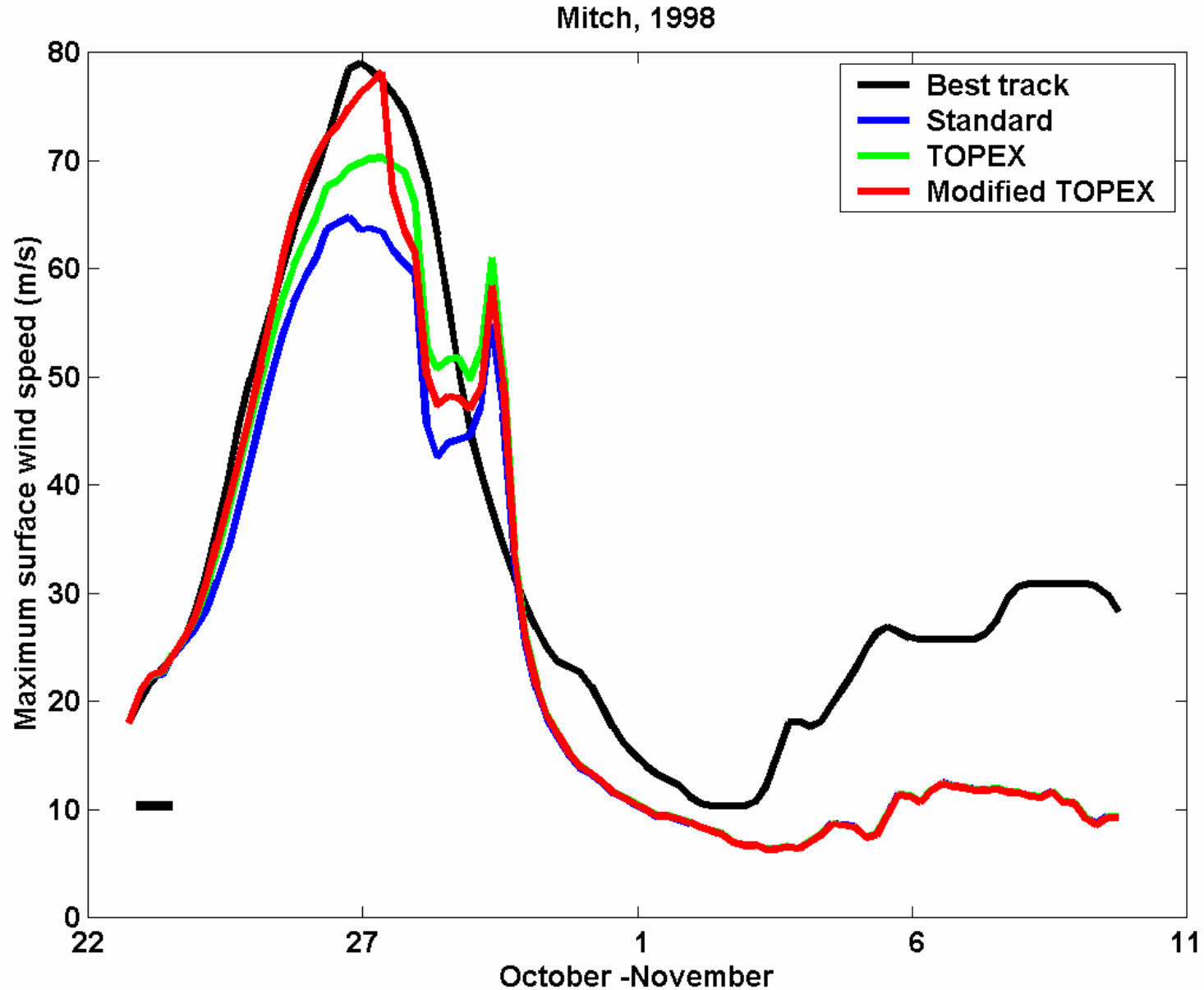


A good simulation of Camille can only be obtained by assuming that it traveled right up the axis of the Loop Current:

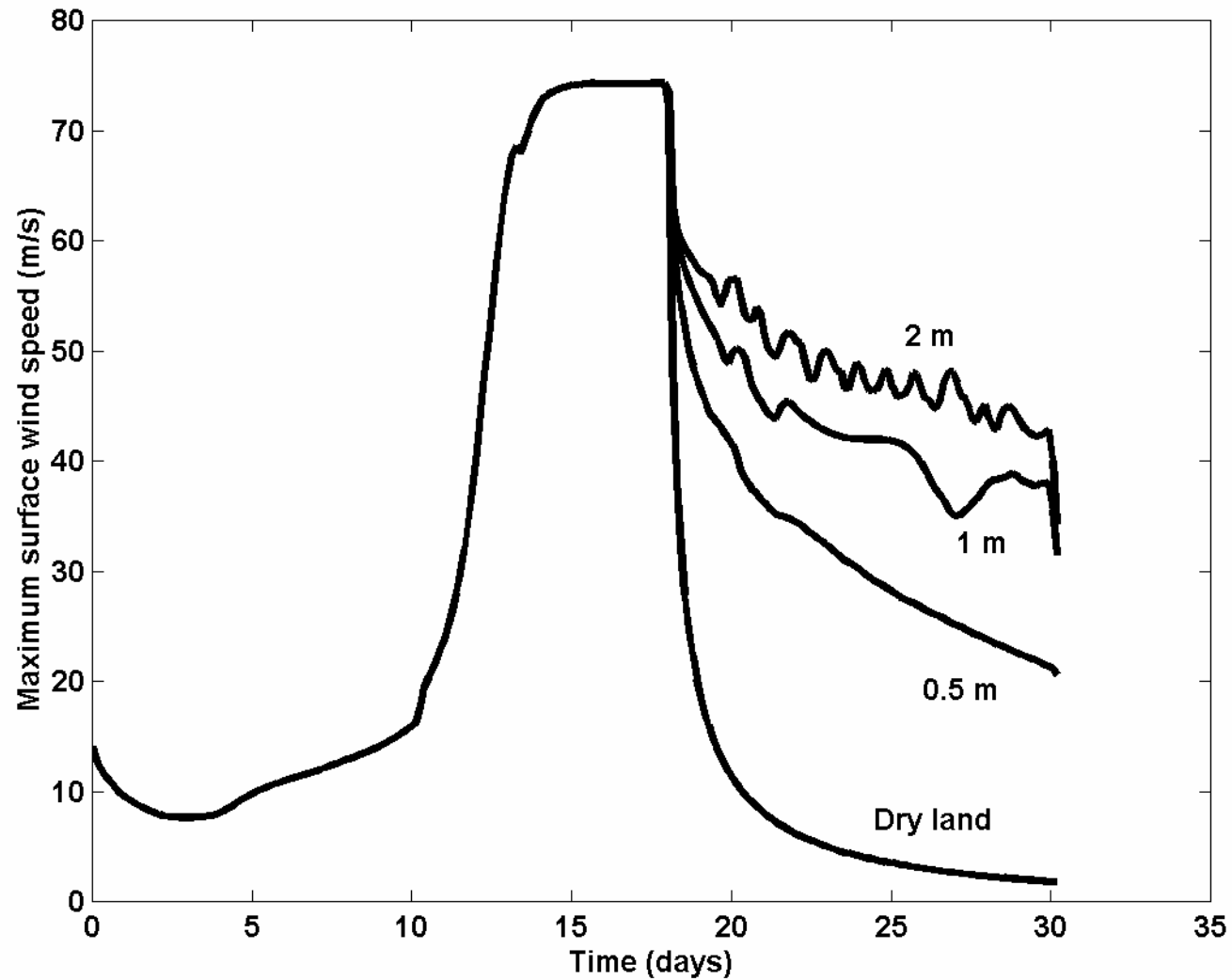




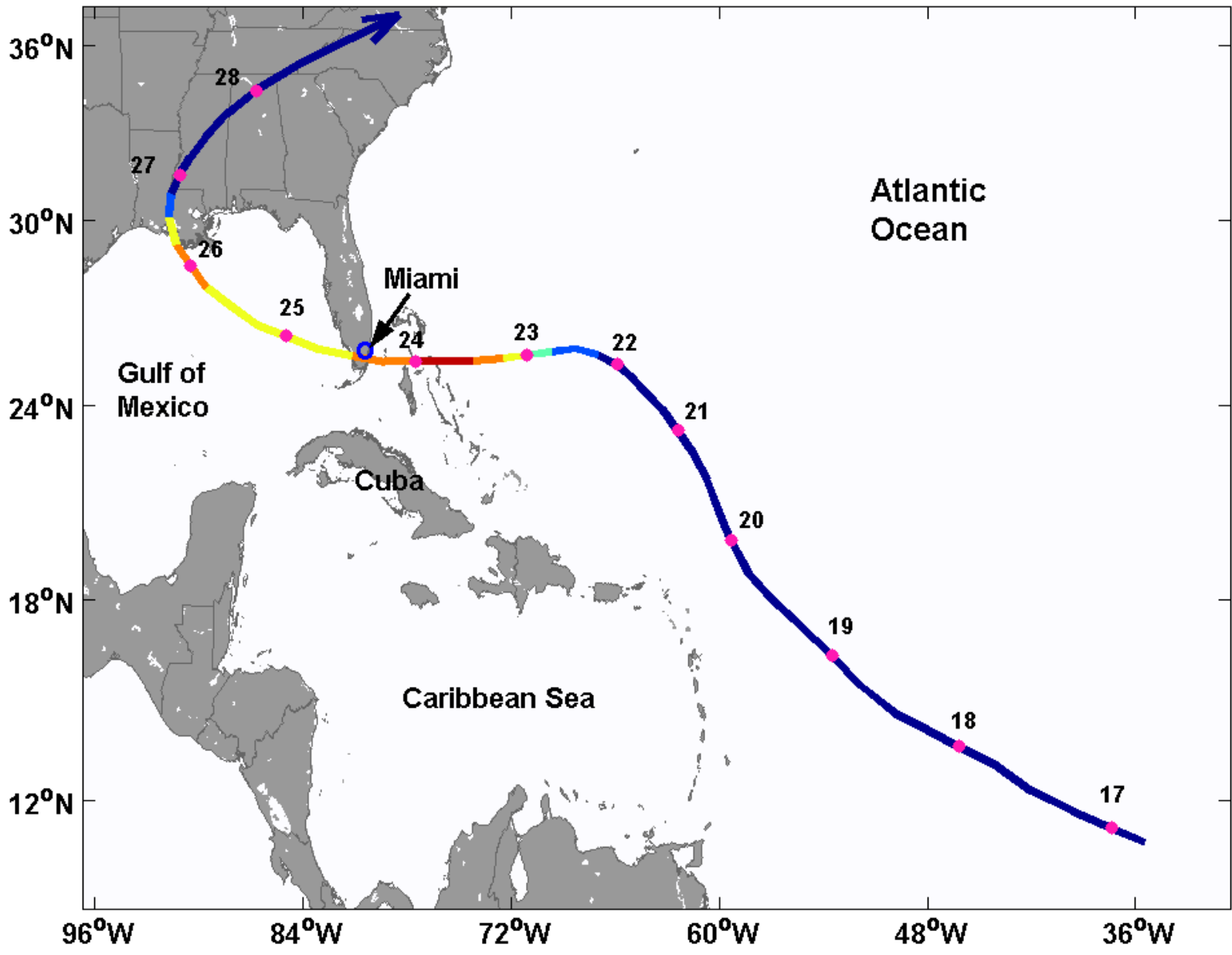
Mitch was also influenced by an ocean eddy. The red curve used TOPEX altimetry modified by de-aliasing the estimated peak amplitude:



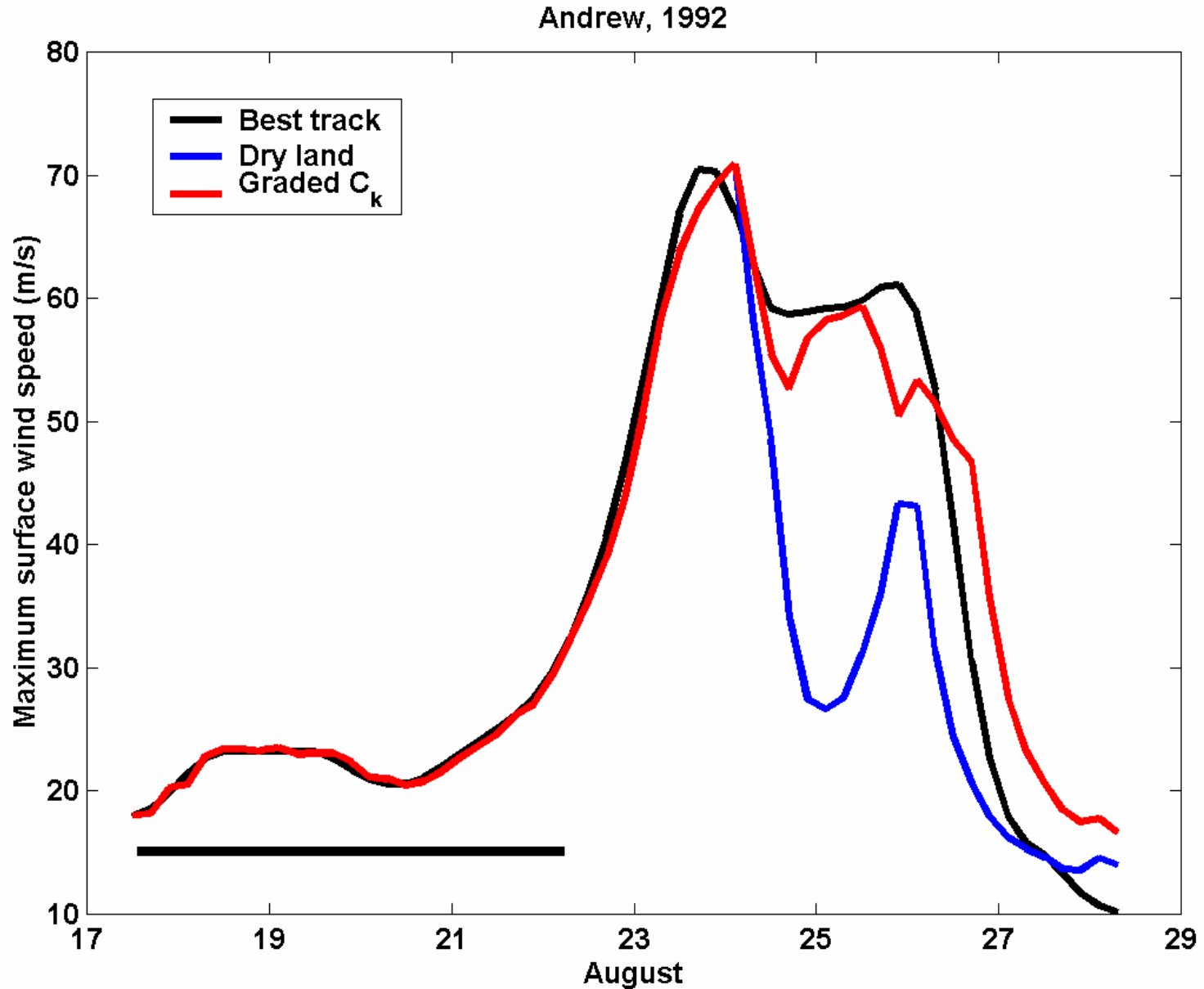
Effect of standing water can be seen in these idealized simulations of storm landfall over dry land and over swamps with indicated depths of standing water:



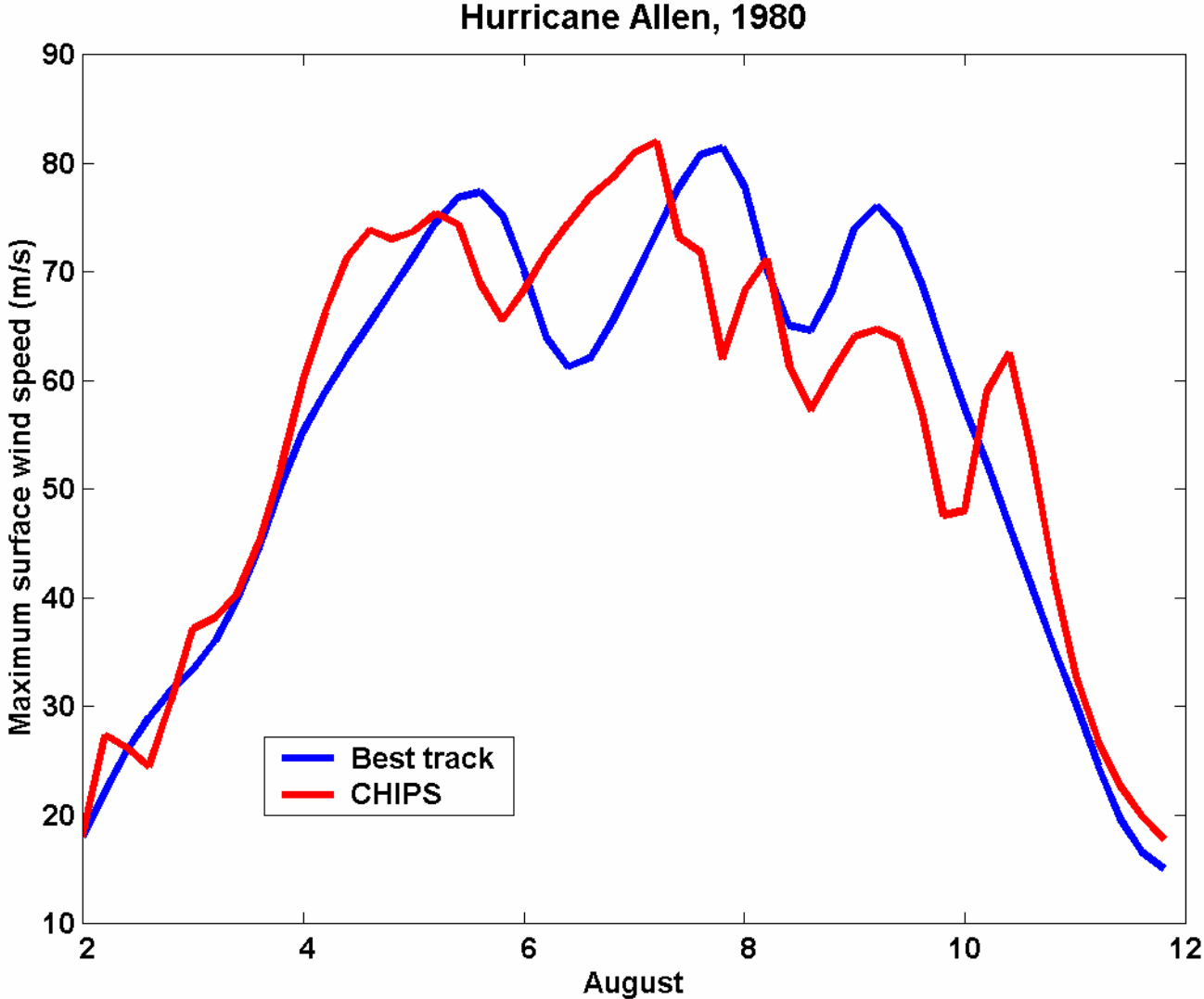
August 1992



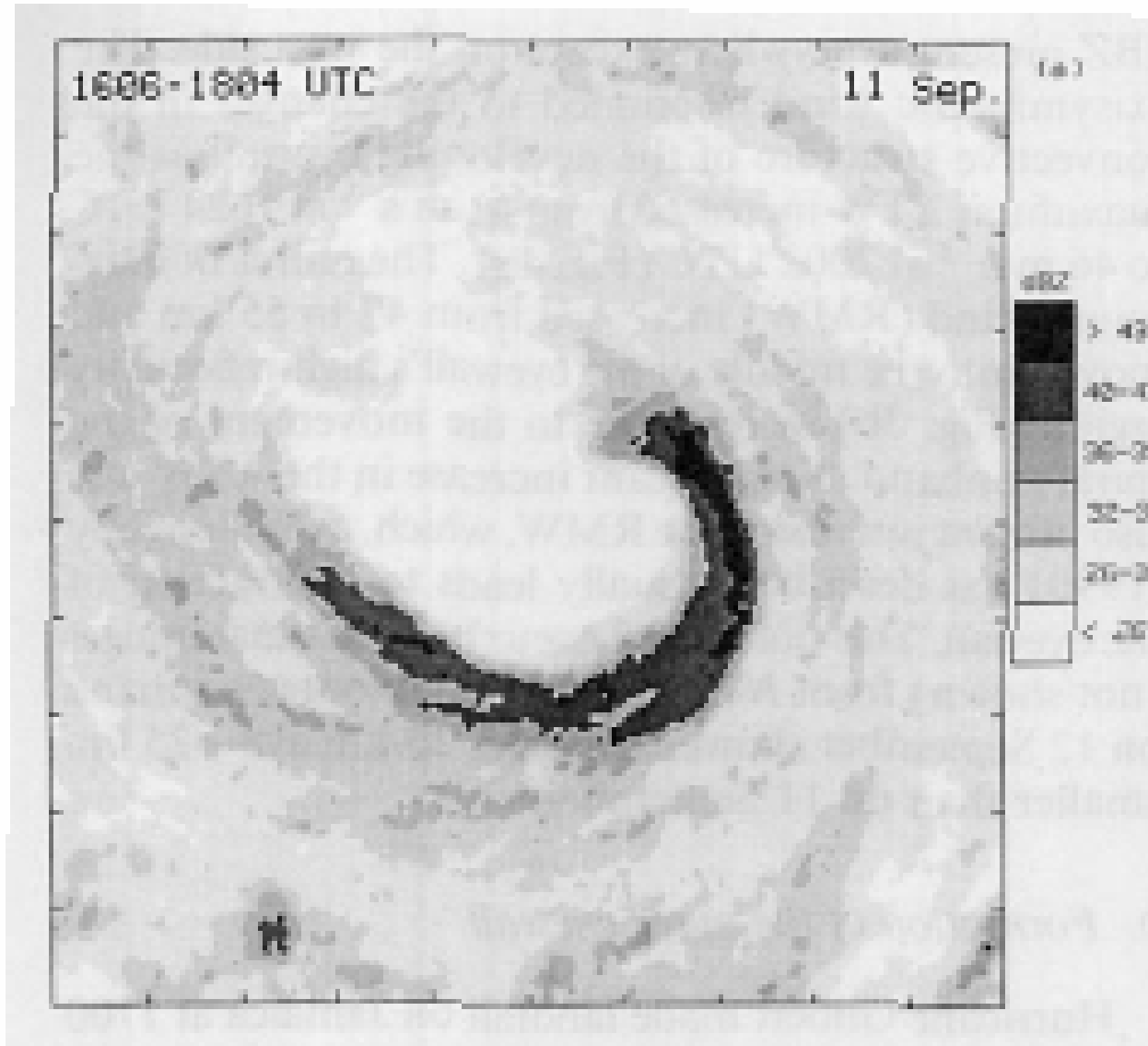
Hurricane Andrew, with and without the effect of the Everglades, as represented by a elevation-dependent heat exchange coefficient:

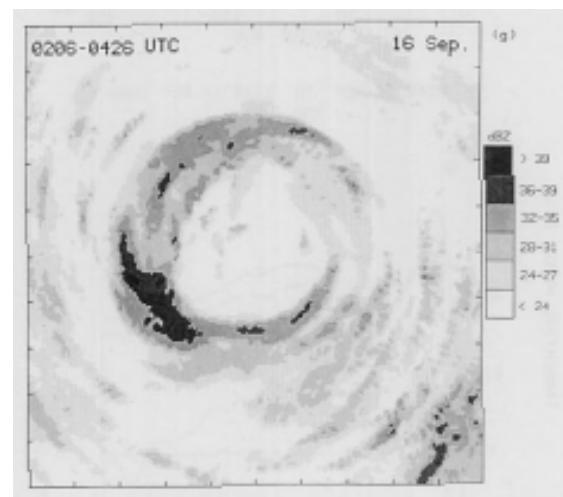
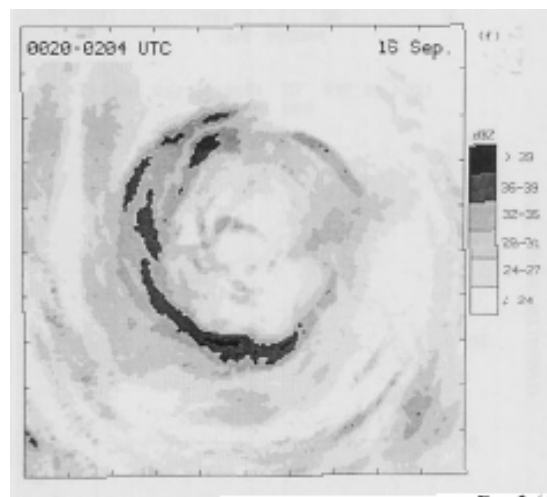
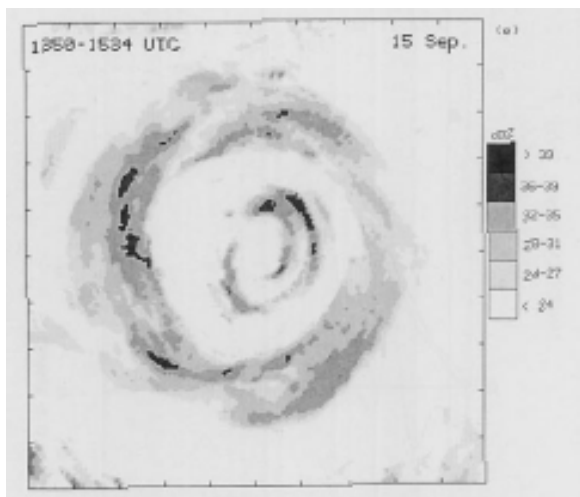
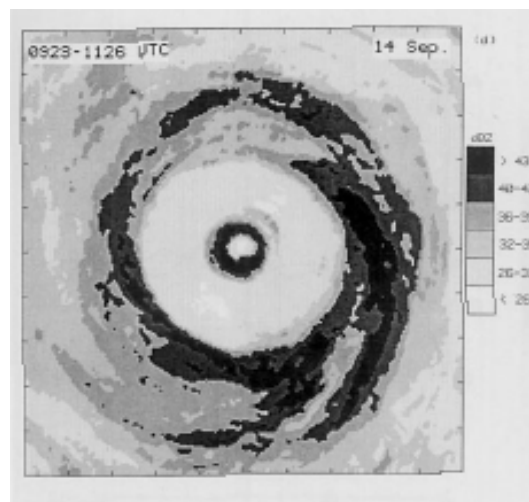
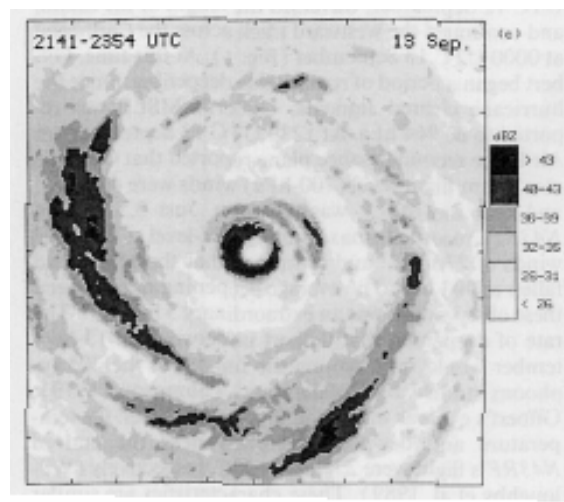
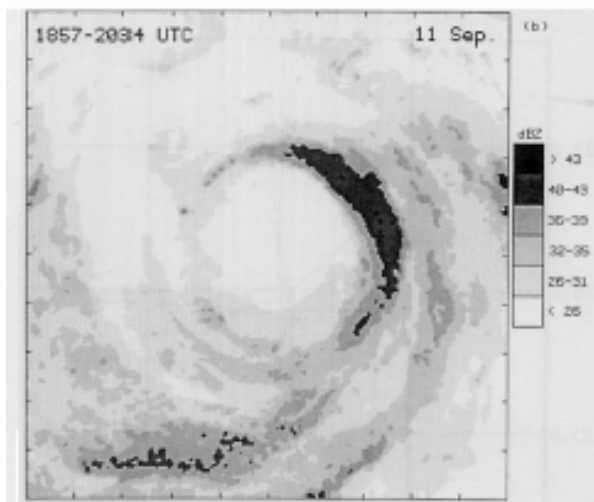


Some storms may have large internal fluctuations (e.g. Allen). CHIPS may predict the existence of these, but not their phase:

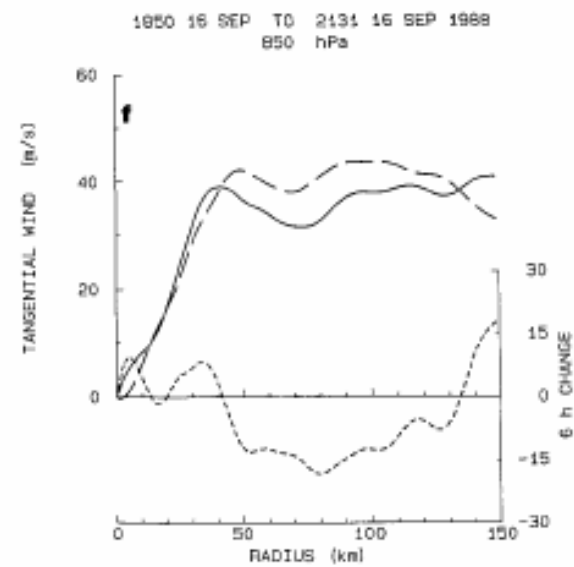
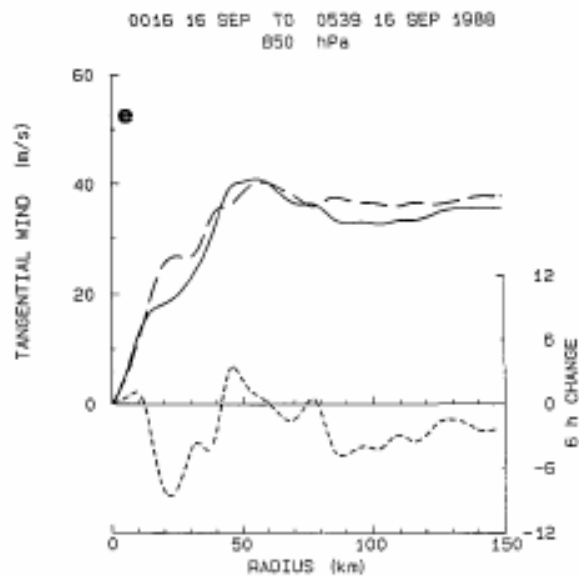
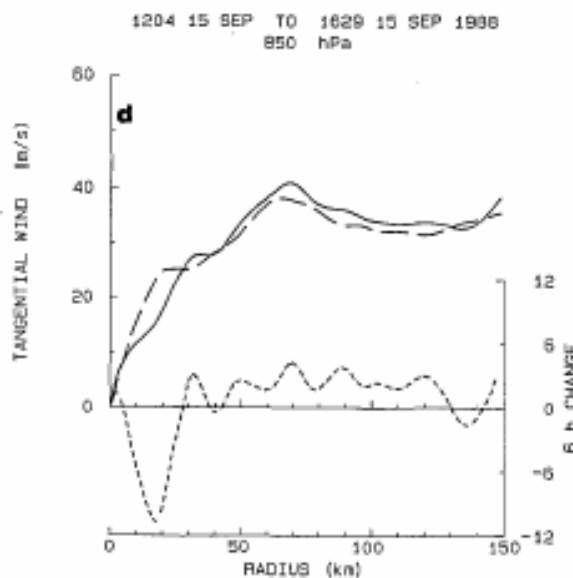
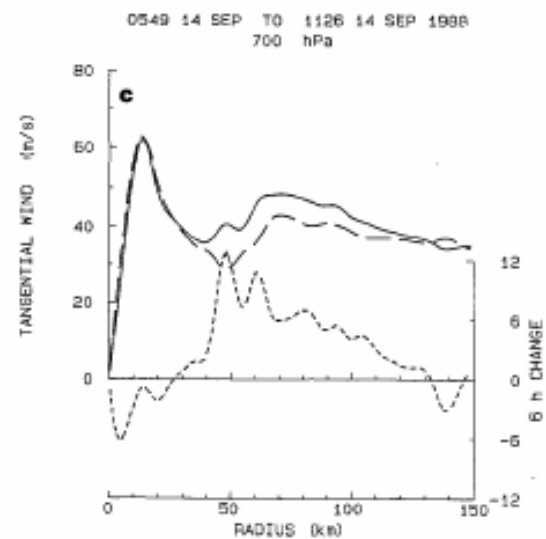
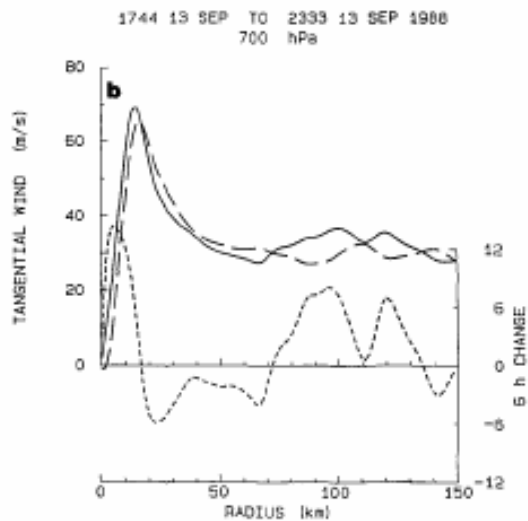
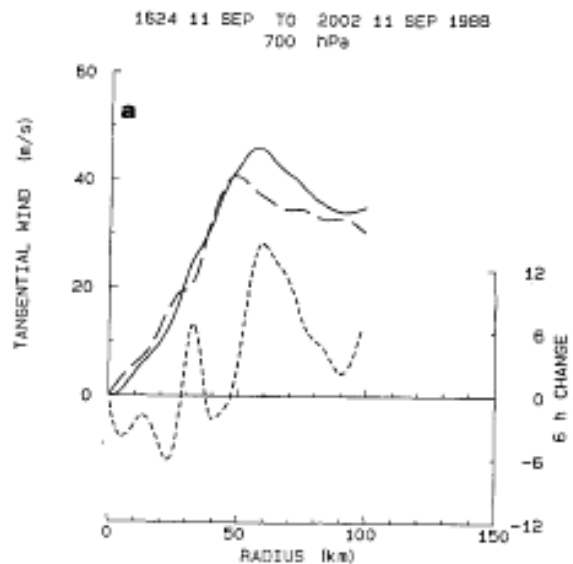


Concentric eyewalls in Hurricane Gilbert, 1988 (from Black and Willoughby, *Mon. Wea. Rev.*, 1992)





Solid: Beginning of flight; Dashed: End of flight; Dotted: Change/6hr





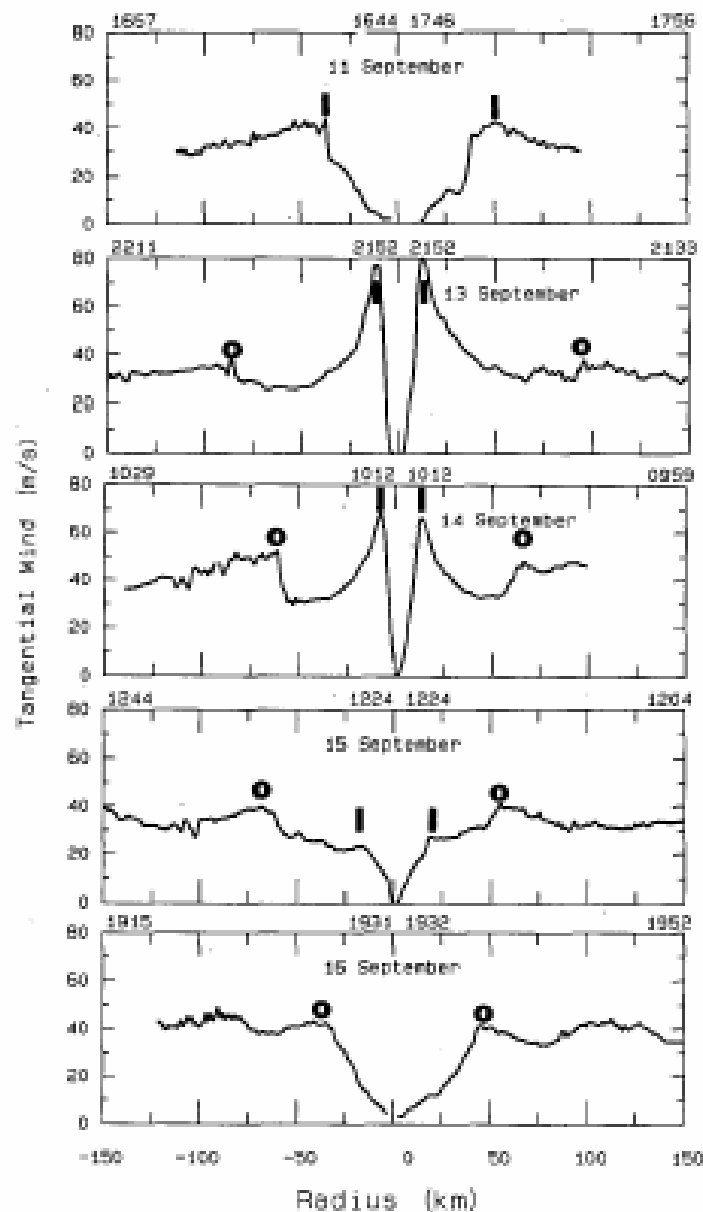


FIG. 7. Flight-level tangential wind speed from south-north traverses through the center of Hurricane Gilbert for five of the six reconnaissance flights listed in Table 1. Bold *I*'s and *O*'s denote the location of the inner- and outer-eyewall wind maxima, respectively. Times at the beginning and end of each radial pass are plotted at the top of the panels.

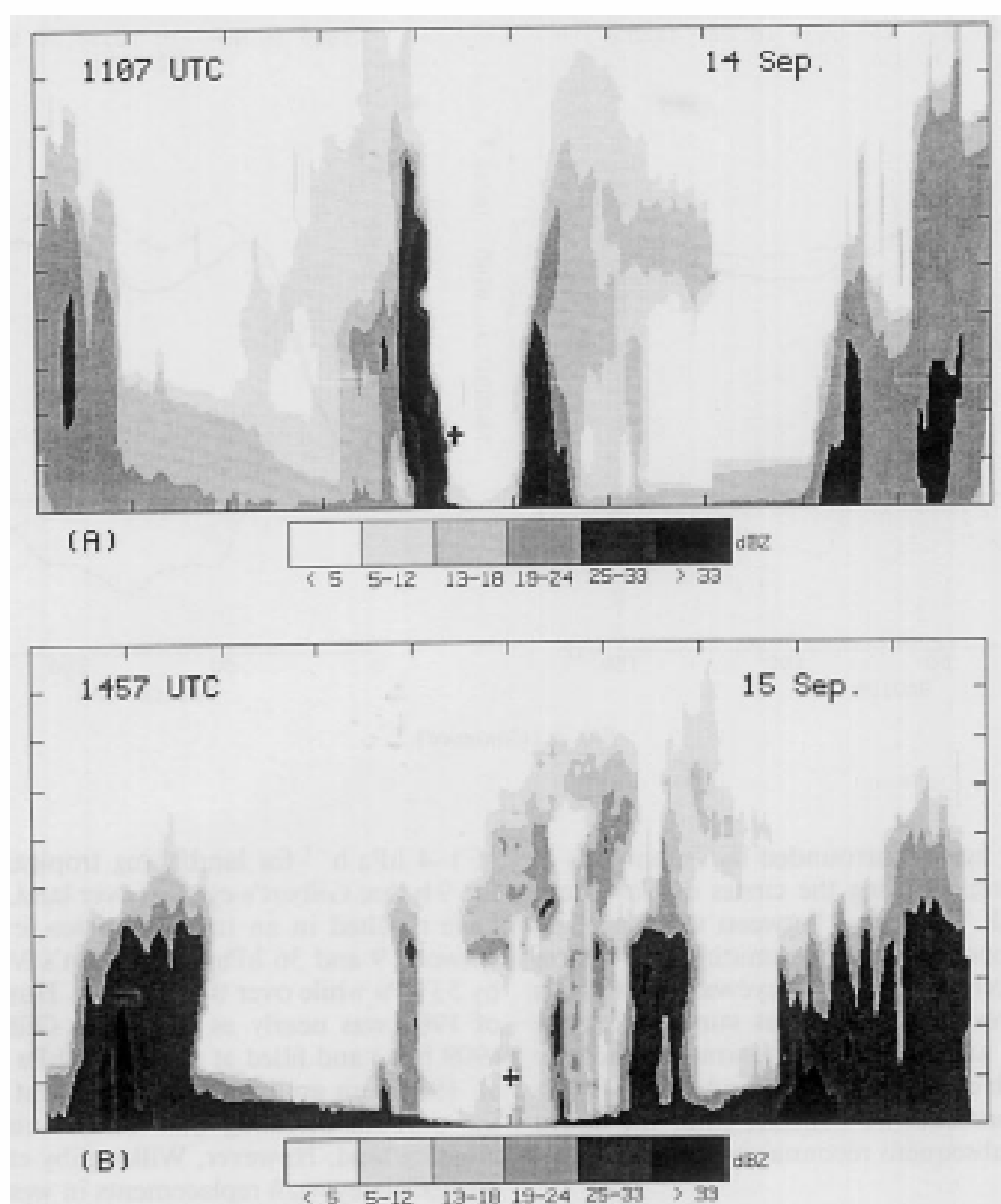


FIG. 5. Vertical cross sections of radar reflectivity from single sweeps of the tail radar while the aircraft was near the center of Hurricane Gilbert: (a) 1107 UTC 14 September and (b) 1457 UTC 15 September. West is on the left and east on the right in both (a) and (b). The domain is  $160 \times 15 \text{ km}^2$ , with tie marks at 16 and 1.5 km in the horizontal and vertical, respectively. The plus sign in the lower center of the images indicates the aircraft's location, and the reflectivity scale is at the bottom.

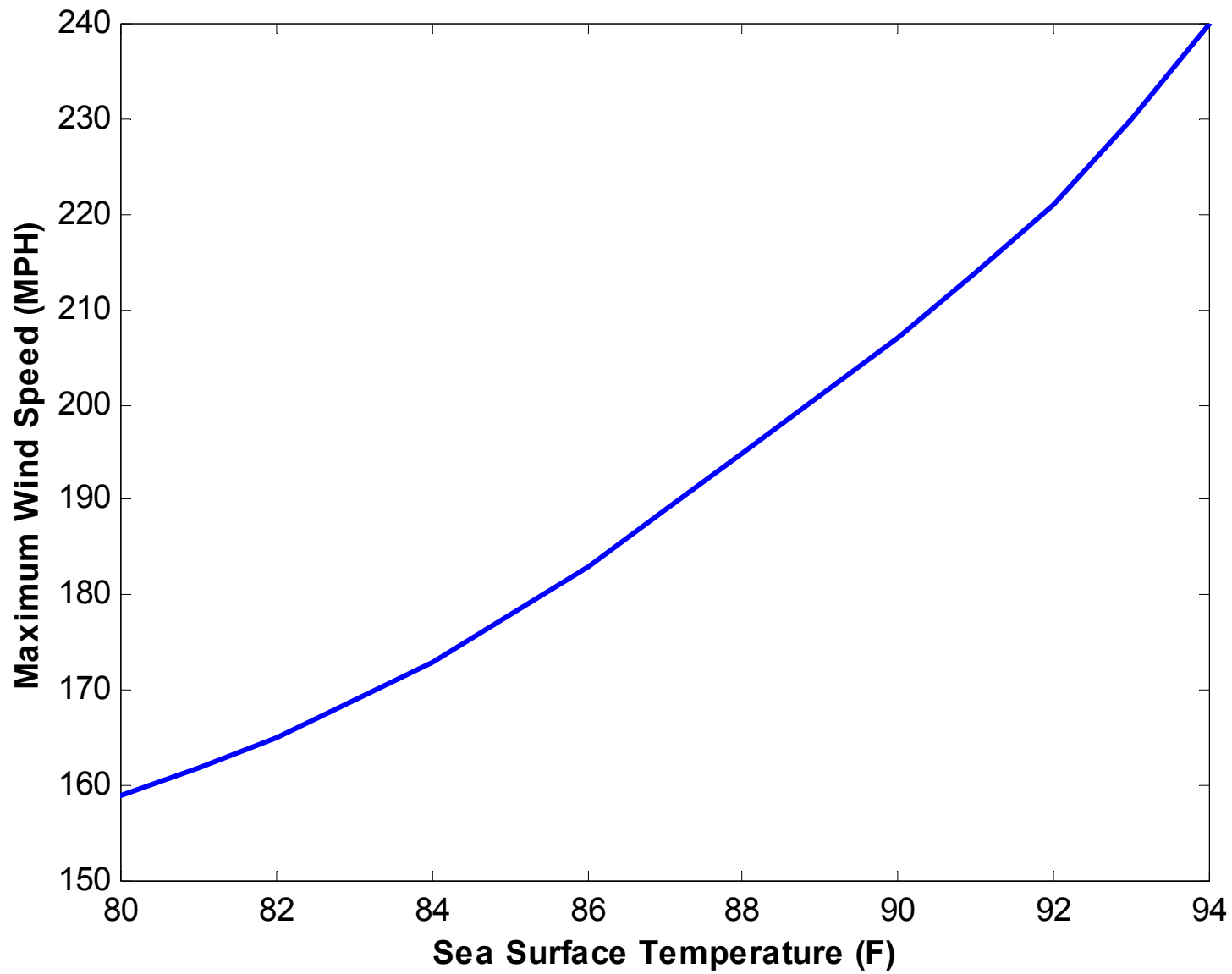
# Environmental factors critical to intensity prediction:

- Potential intensity along track
- Upper ocean thermal structure
- Environmental wind shear
- Bathymetry
- Land surface characteristics

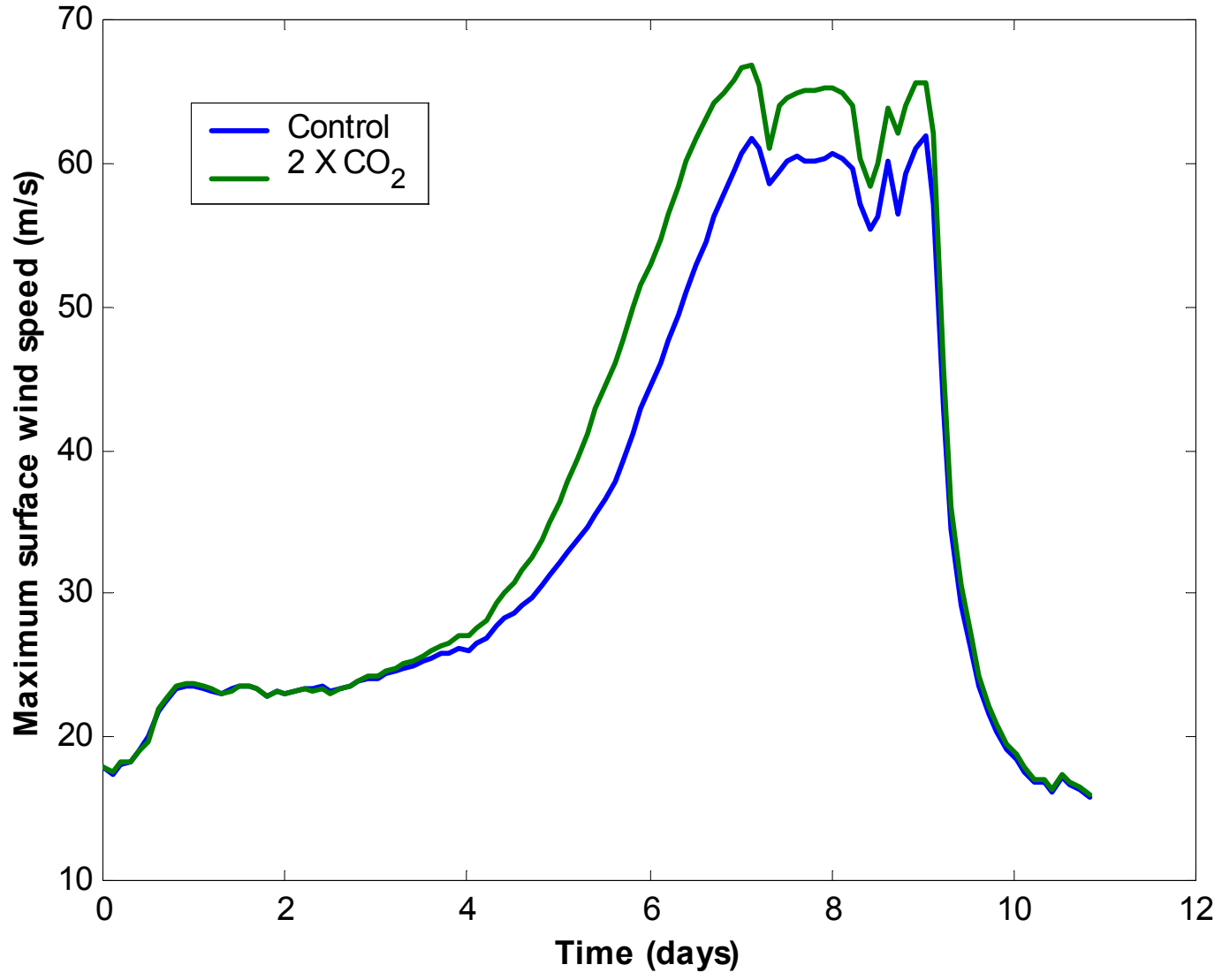
# Major sources of uncertainty:

- Uncertain forecasts of vertical shear
- Shear reduces predictability
- Little real-time knowledge of upper ocean thermal structure
- Low predictability of internal variability

# Hurricanes and Climate



# ANDREW, 1992



# Empirical Index:

$$I = \left| 10^5 \eta \right|^{3/2} \left( \frac{\mathcal{H}}{50} \right)^3 \left( \frac{V_{pot}}{70} \right)^3 \left( 1 + 0.1 V_{shear} \right)^{-2},$$

$\eta \equiv 850 \text{ hPa absolute vorticity } (s^{-1}),$

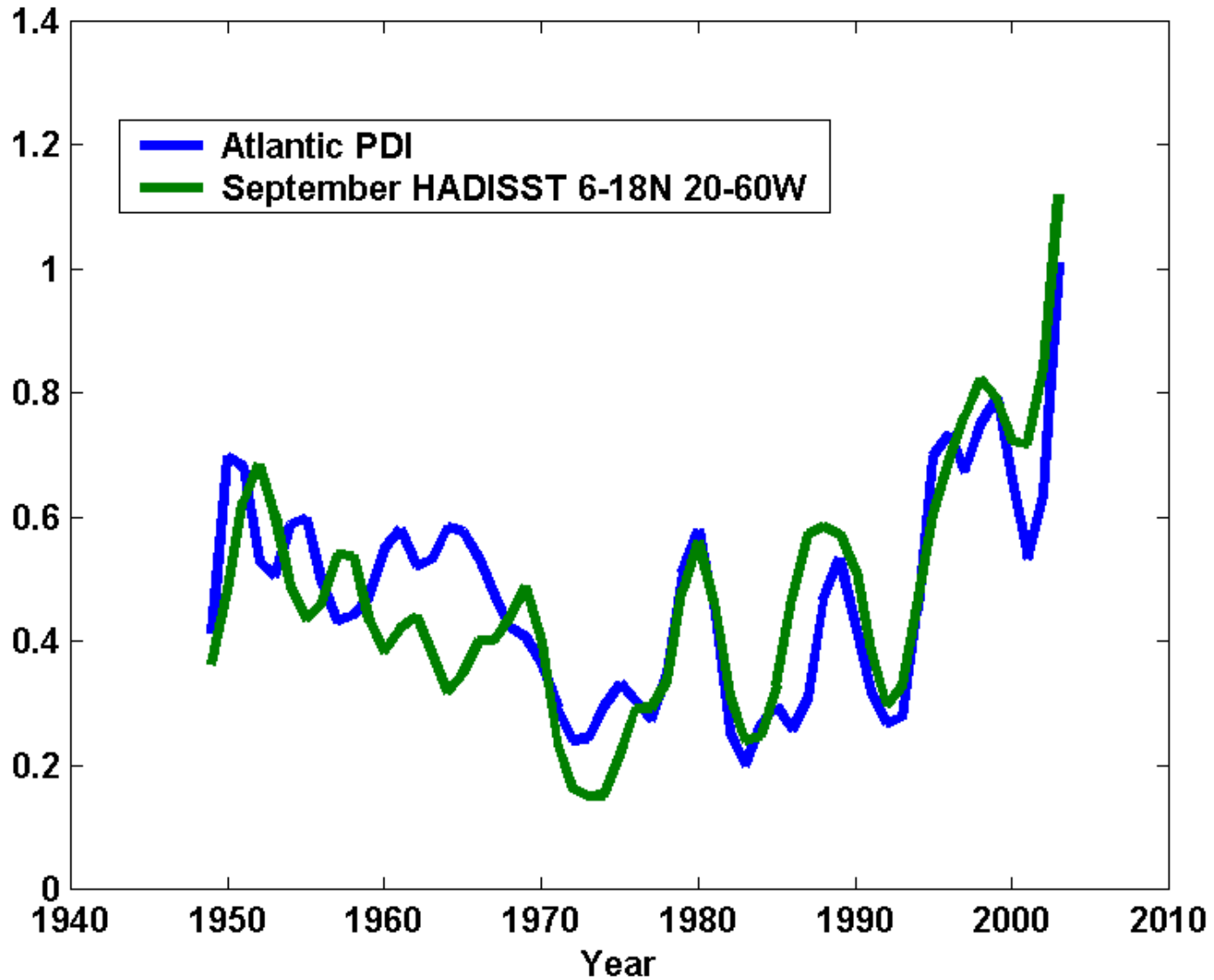
$V_{pot} \equiv \text{Potential wind speed } (ms^{-1}),$

$\mathcal{H} \equiv 600 \text{ mb relative humidity } (\%),$

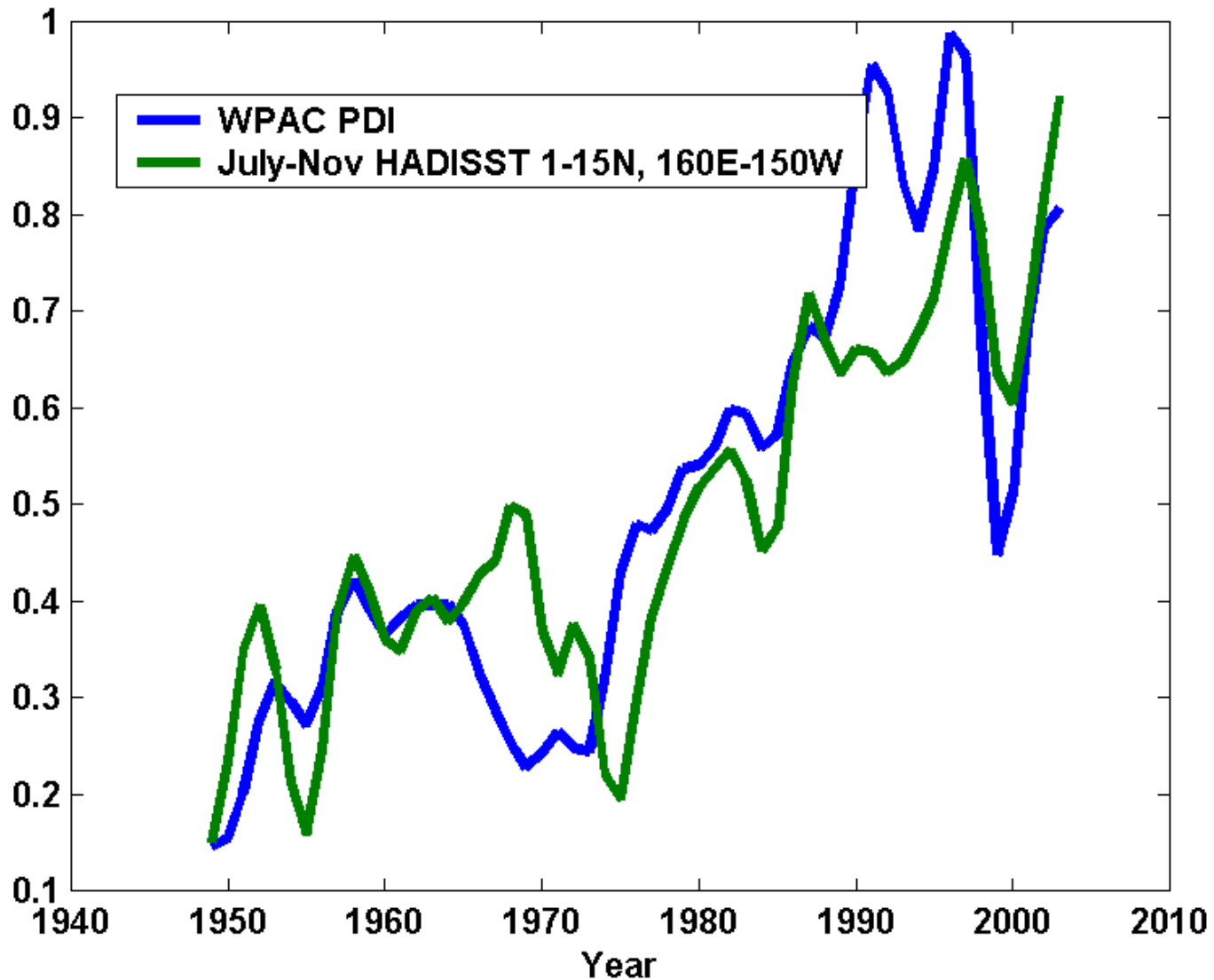
$V_{shear} \equiv \left| \mathbf{V}_{850} - \mathbf{V}_{250} \right| (ms^{-1}).$



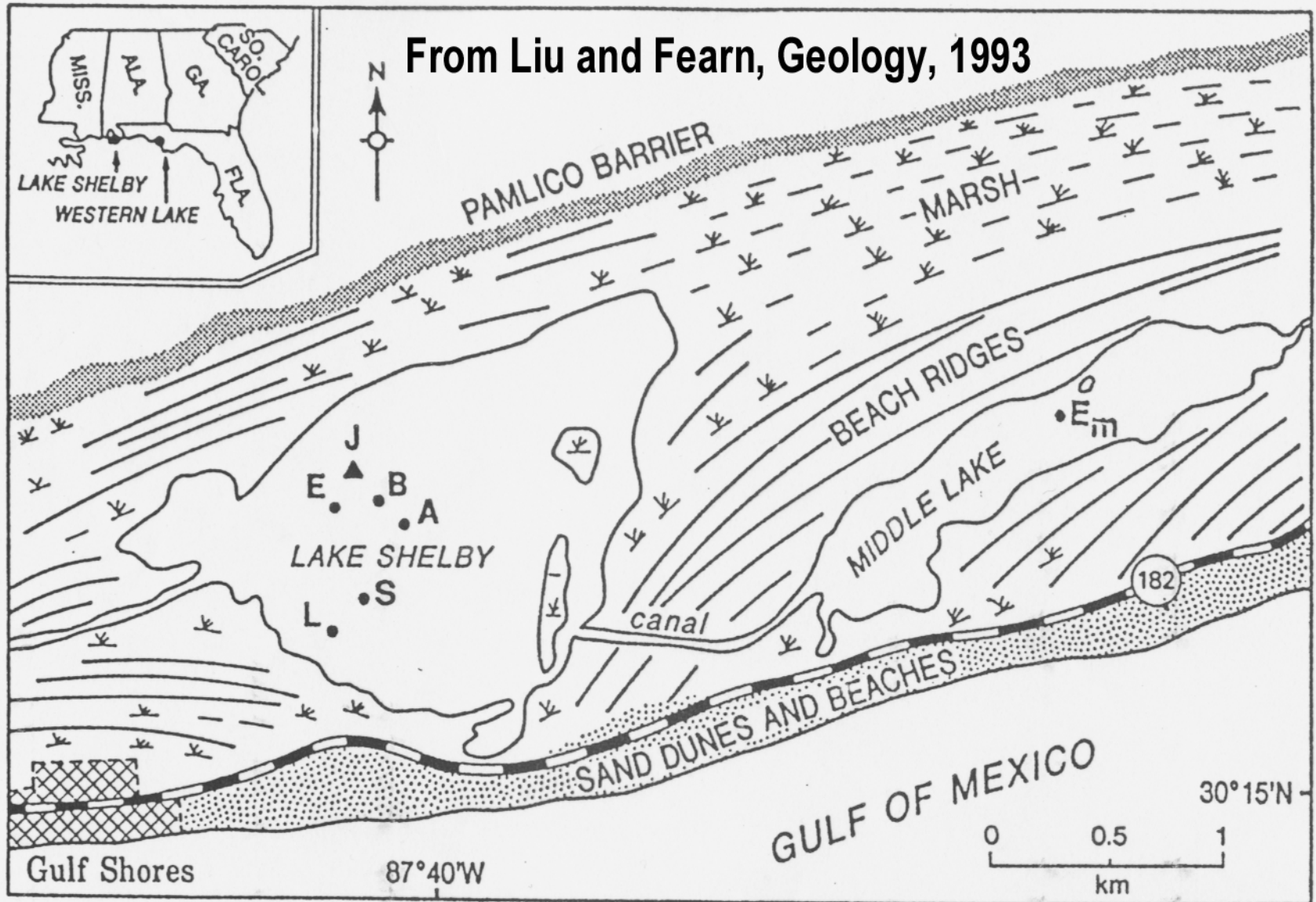
# Atlantic

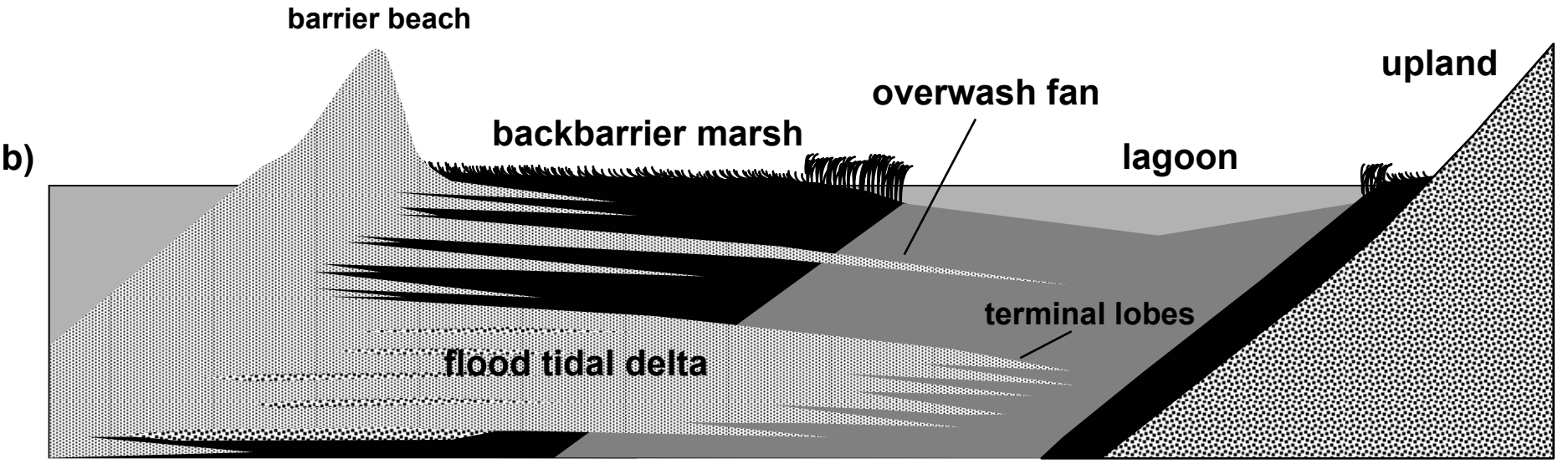
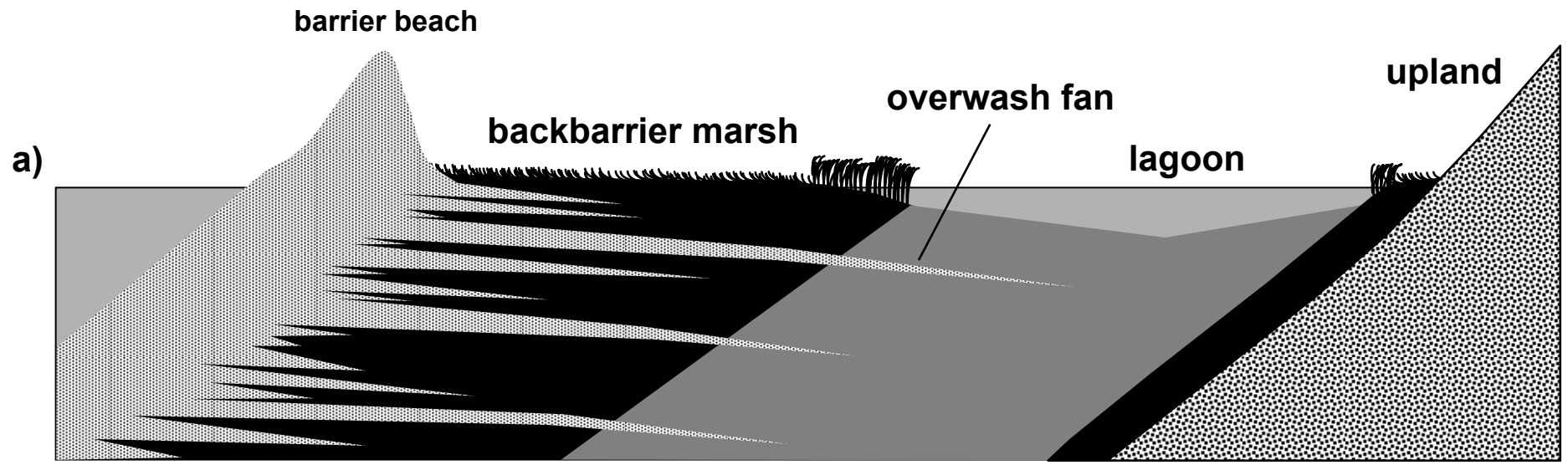


# Western North Pacific



# Paleotempestology

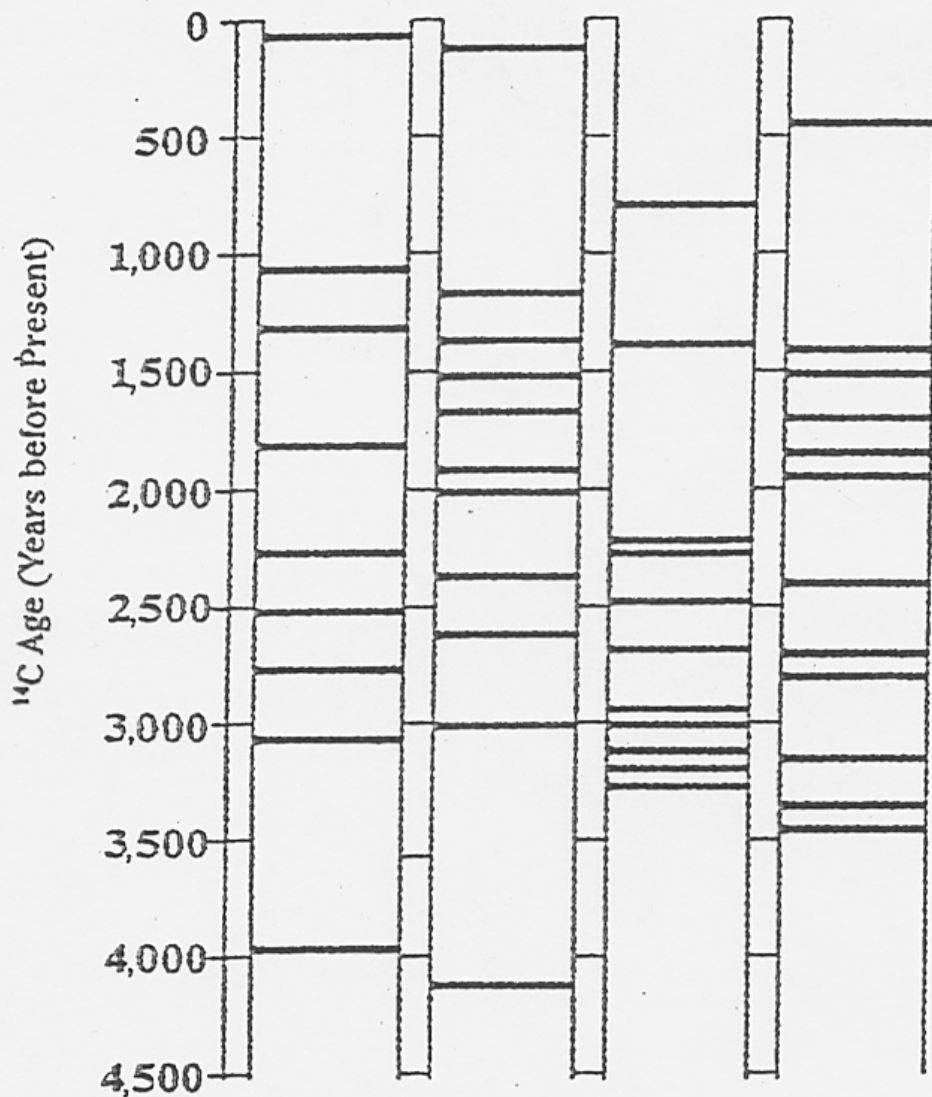




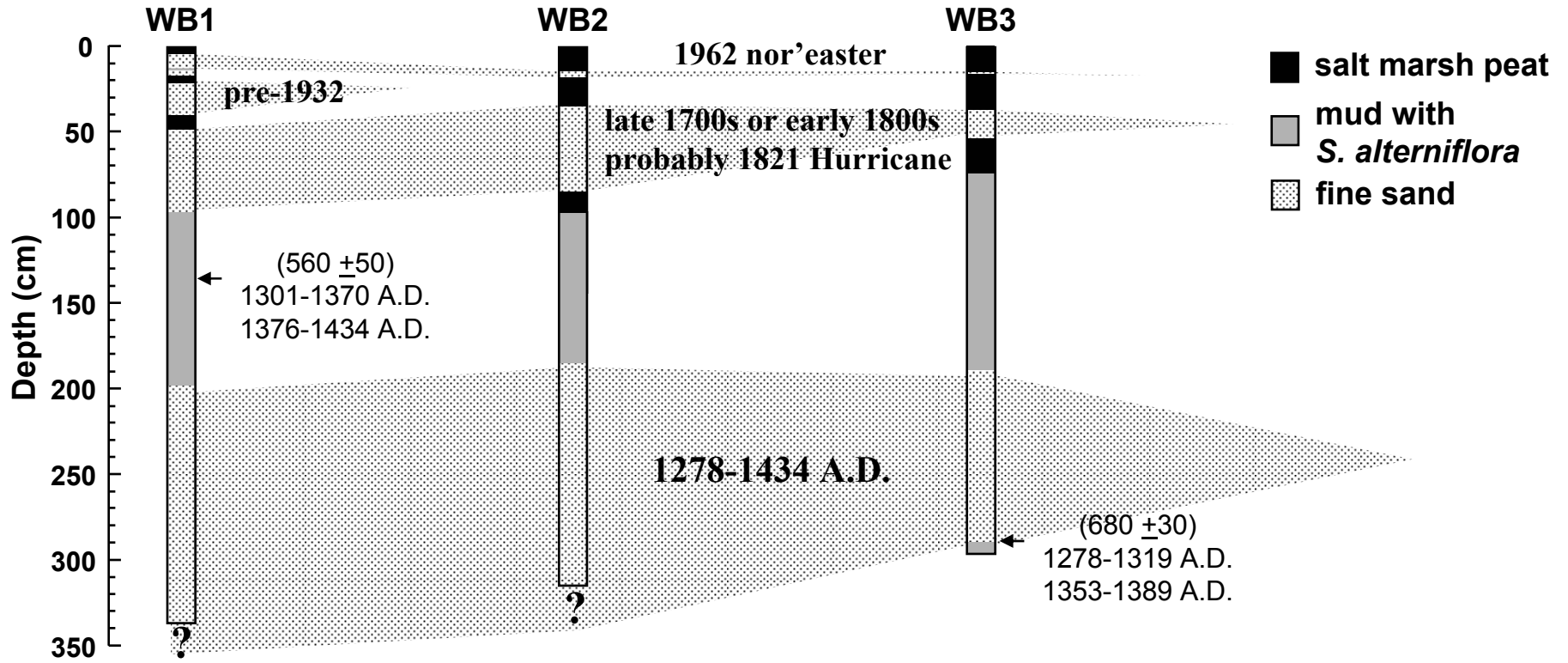
Donnelly – Figure 2

# Work of Liu, 2000 (Science News)

Pearl River Marsh    Pascagoula Marsh    Lake Shelby    Western Lake



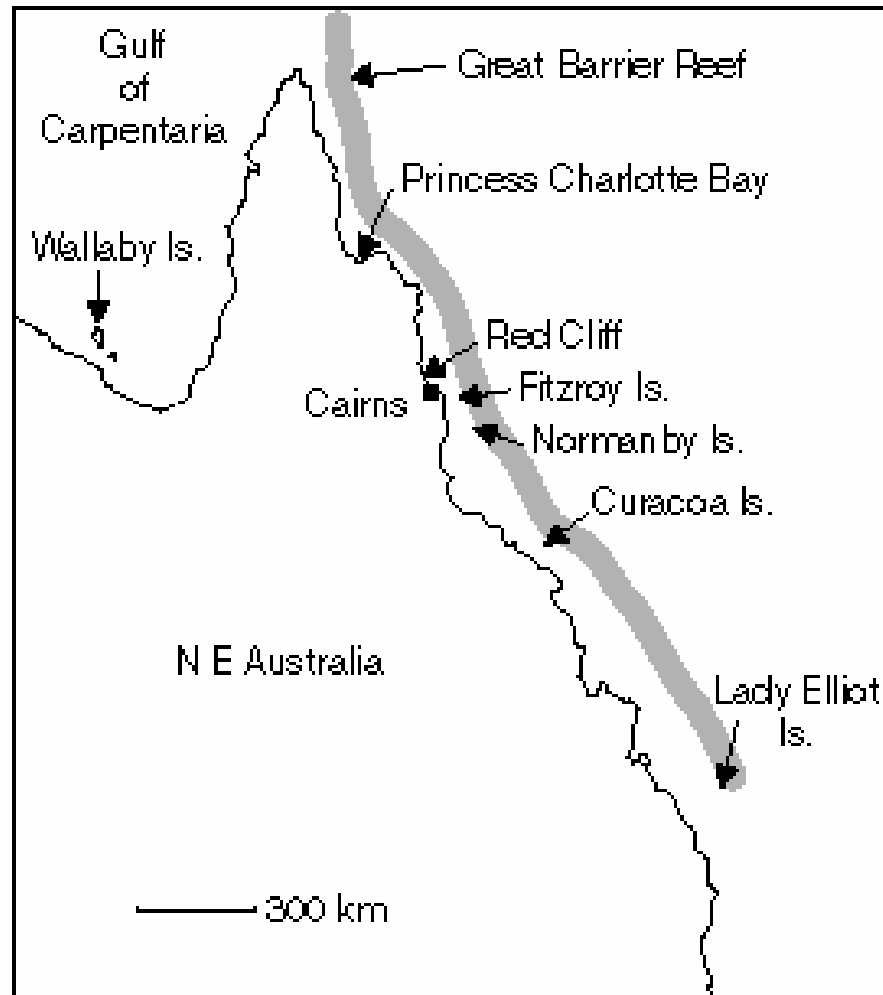
# Whale Beach

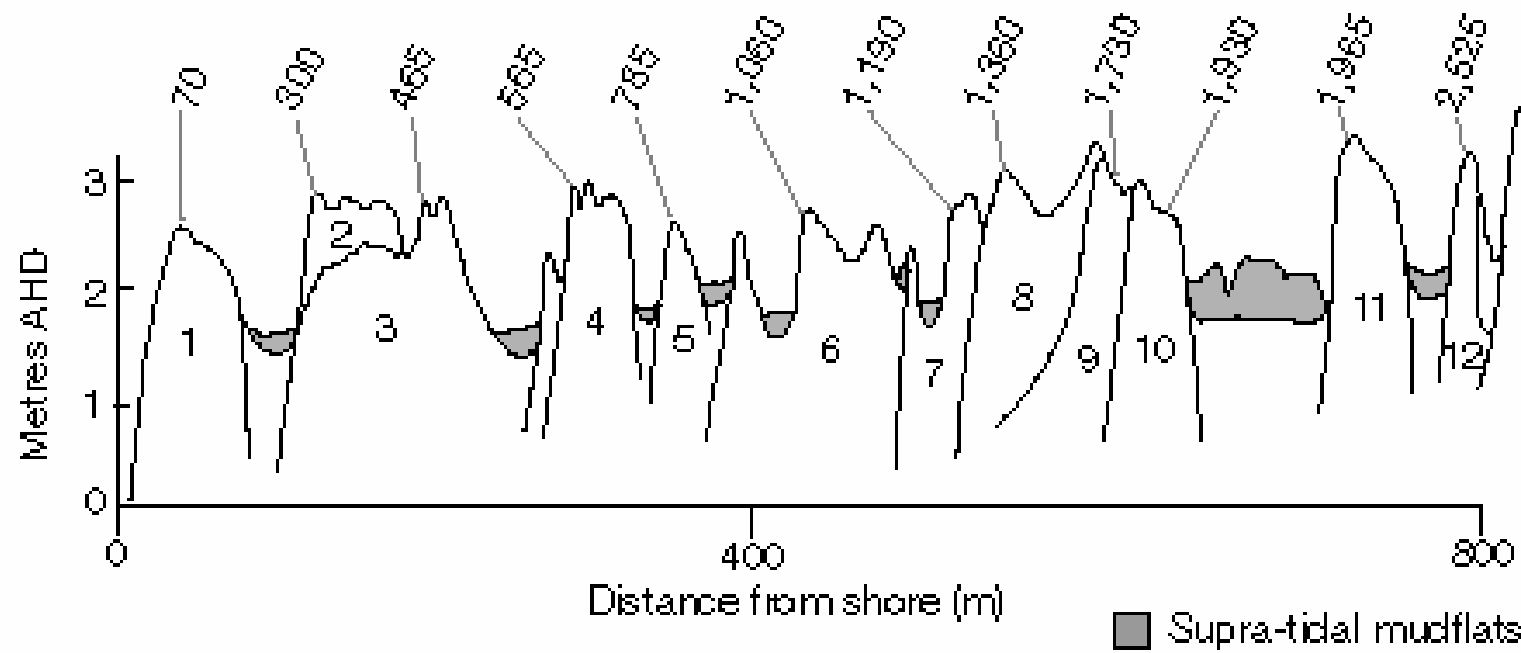
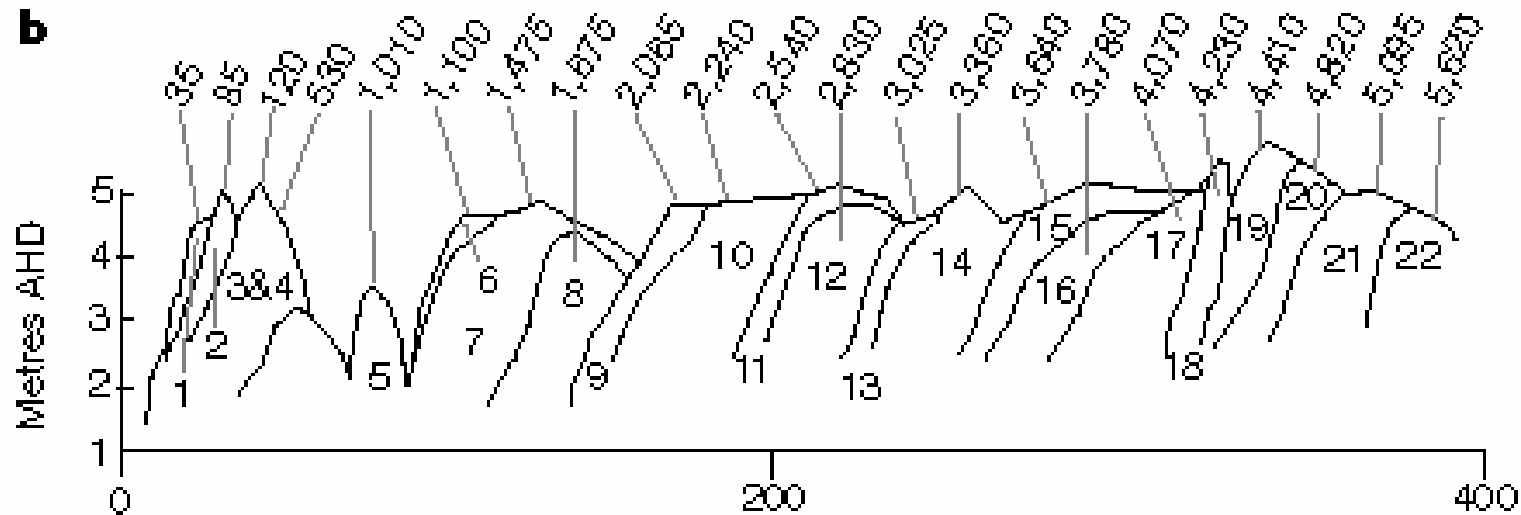


Jeffrey Donnelly, WHOI

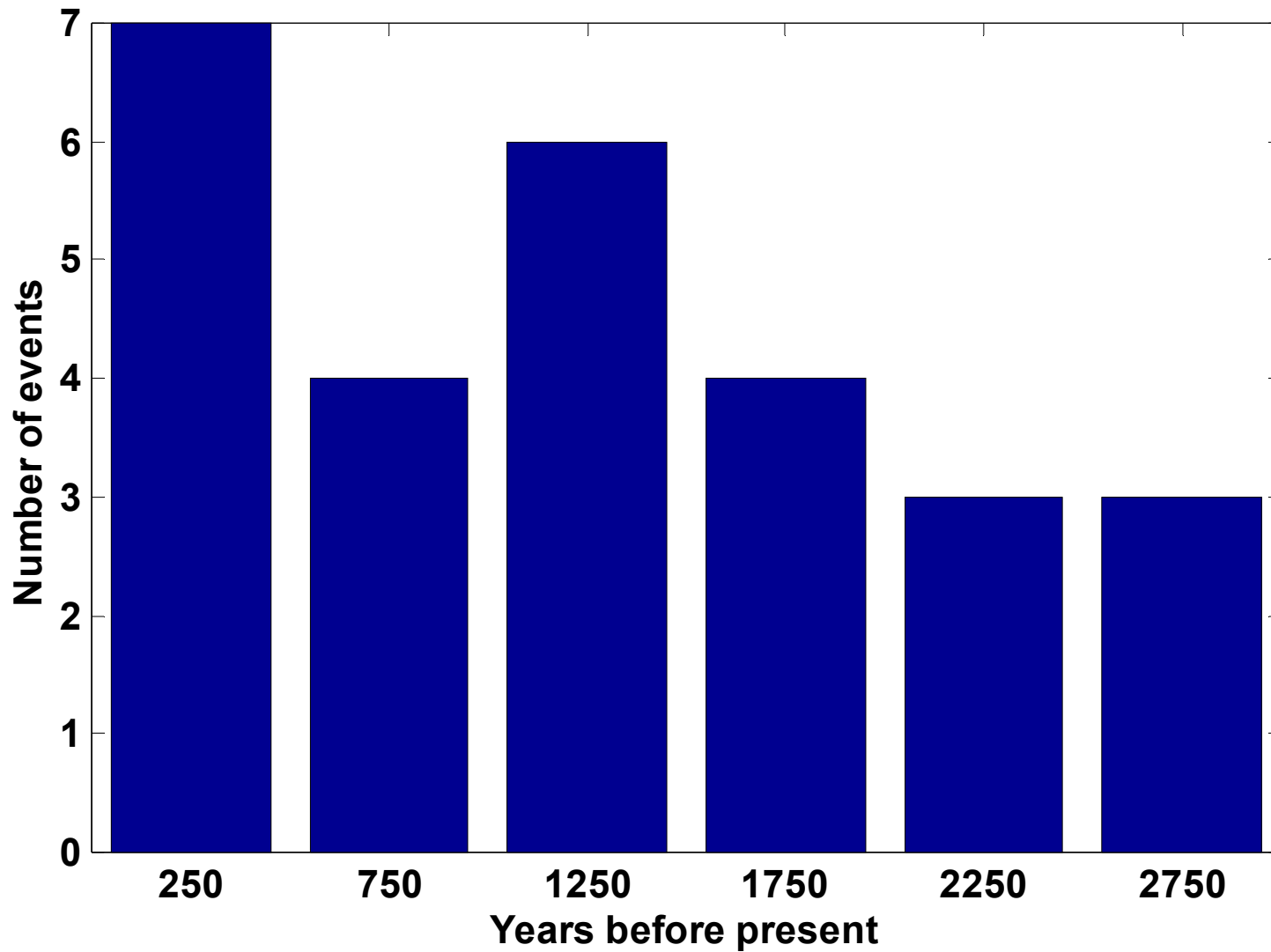
# Beach Deposits

Nott and Hayne, 2001



**b**





# Lake Inwash Deposits

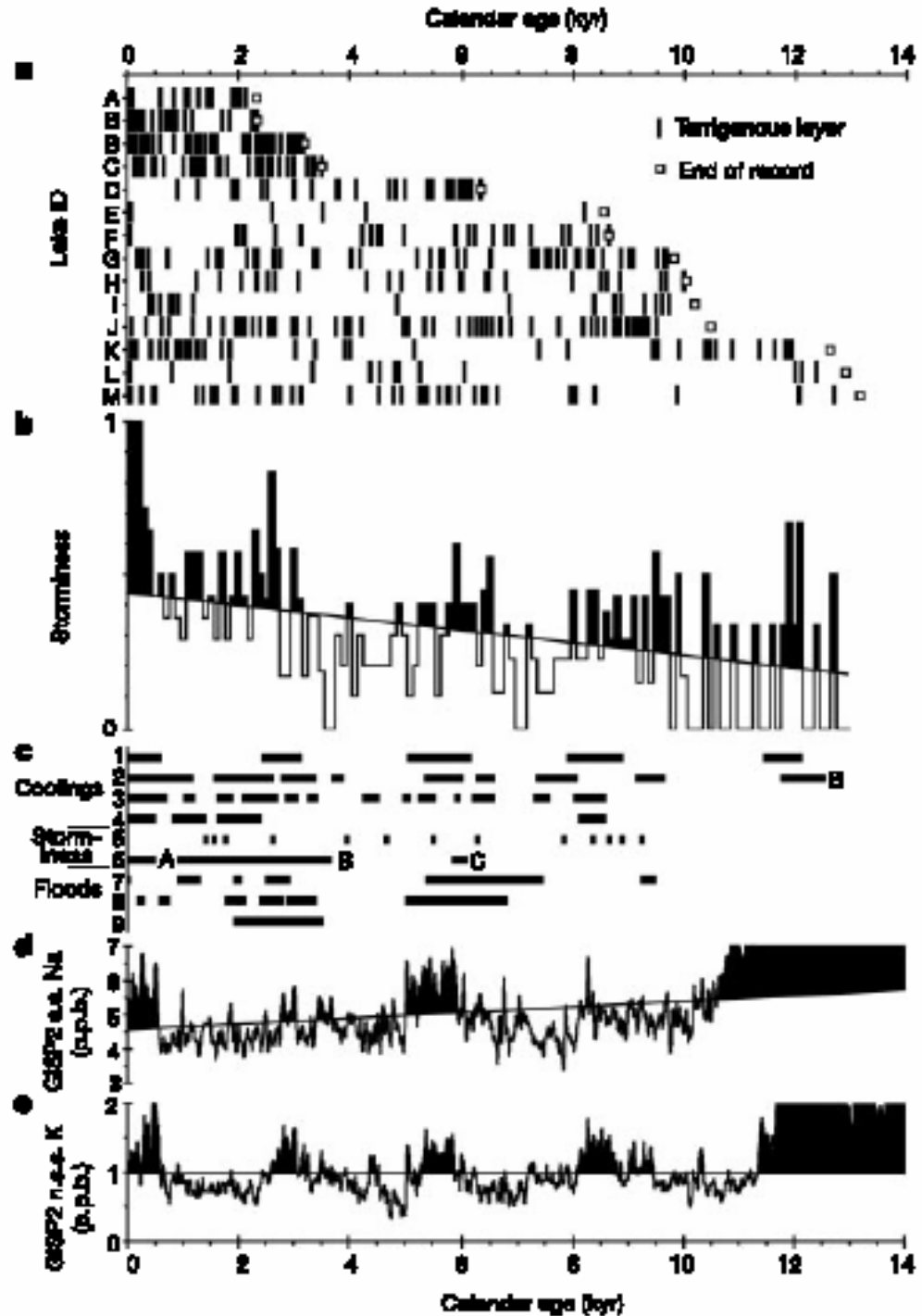
Noren et al., 2002

Core stratigraphies

Sedimentation event histogram

GISP2 sea salt

GISP2 non-sea salt



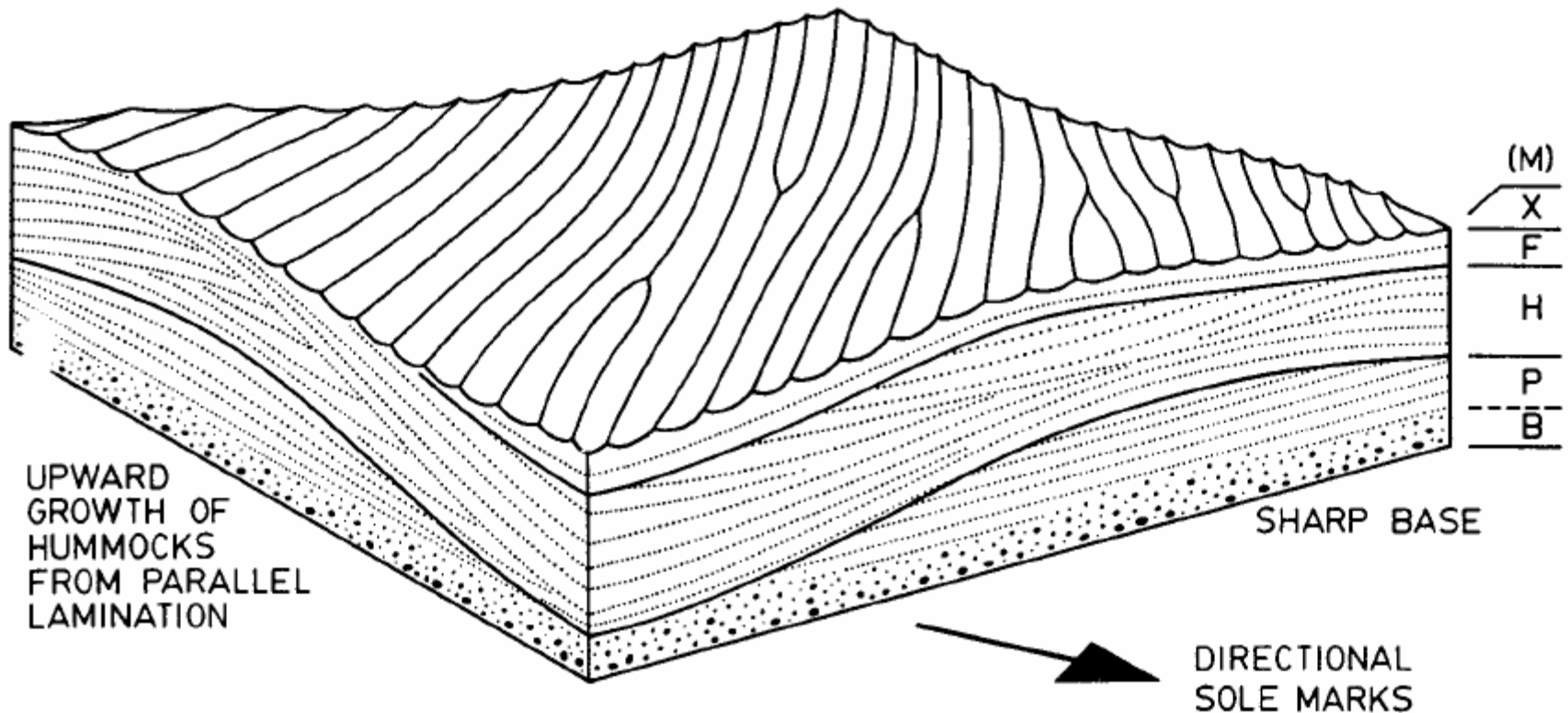
# Hummocky Cross-Stratification

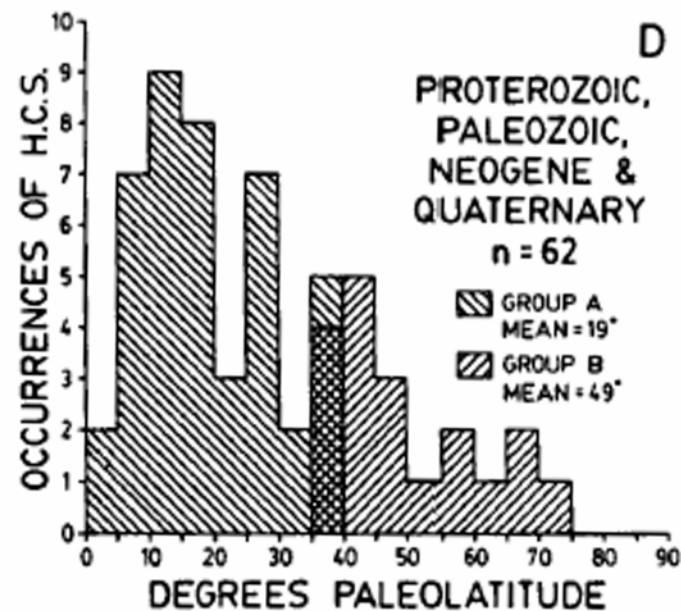
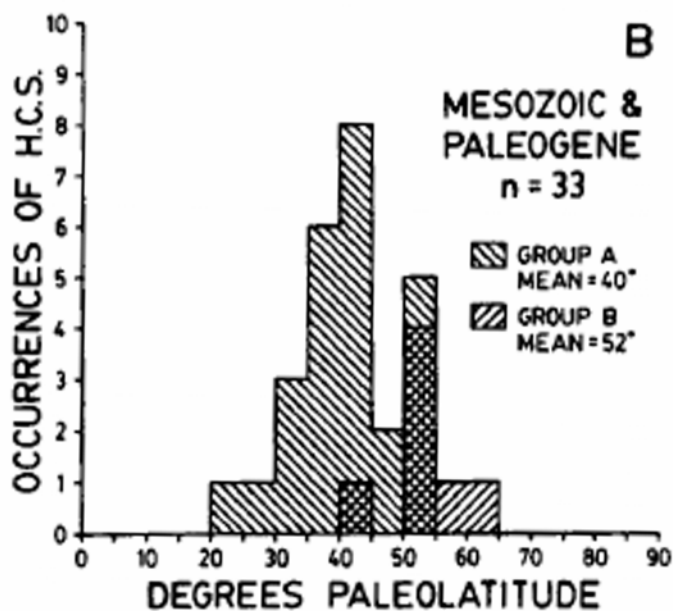
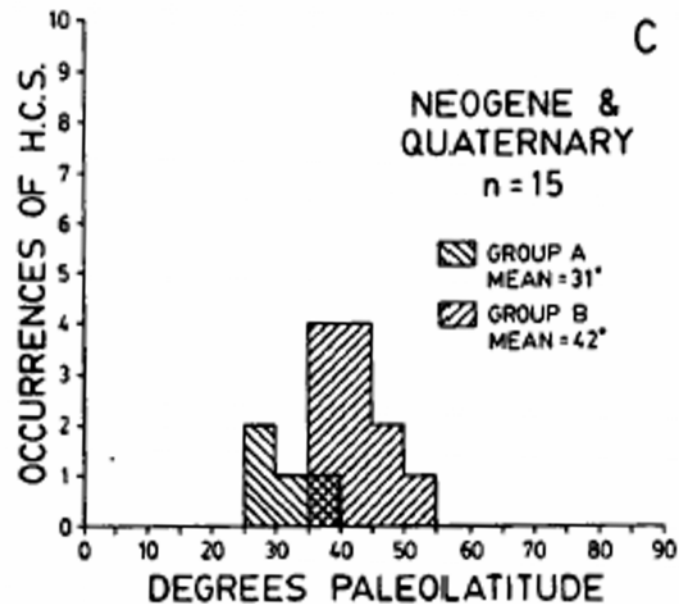
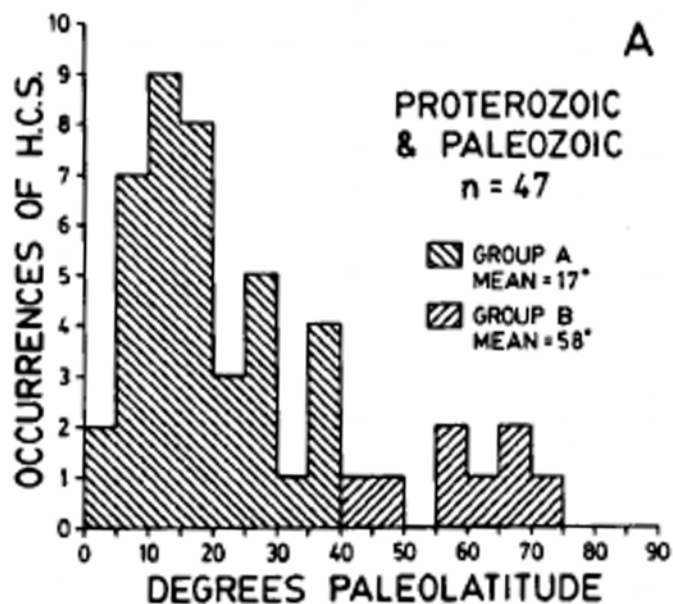
Duke, 1985

LOW-ANGLE TRUNCATIONS & TERMINATIONS  
LOW-ANGLE CURVED LAMINAE, BOTH  
CONCAVE- AND CONVEX-UPWARD

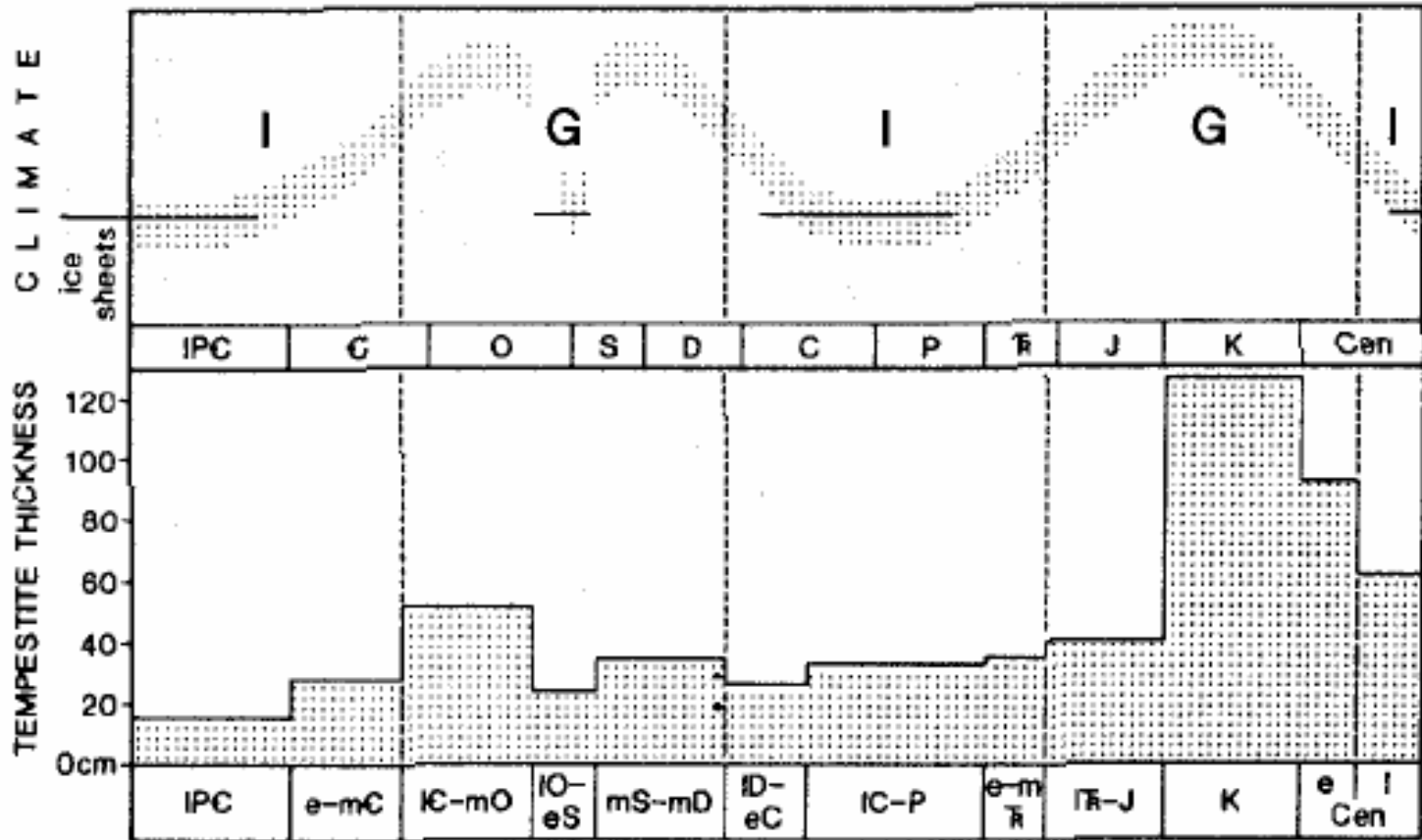
(A)

about 1m.





# Brandt and Elias, 1989



# Do tropical cyclones play a role in the climate system?

- The case for tropical cyclone control of the thermohaline circulation
- Feedback of tropical cyclone activity on climate

# Tropical Cyclone-Climate Feedback

- Sensitive dependence of tropical cyclone frequency and intensity on tropical SSTs

+

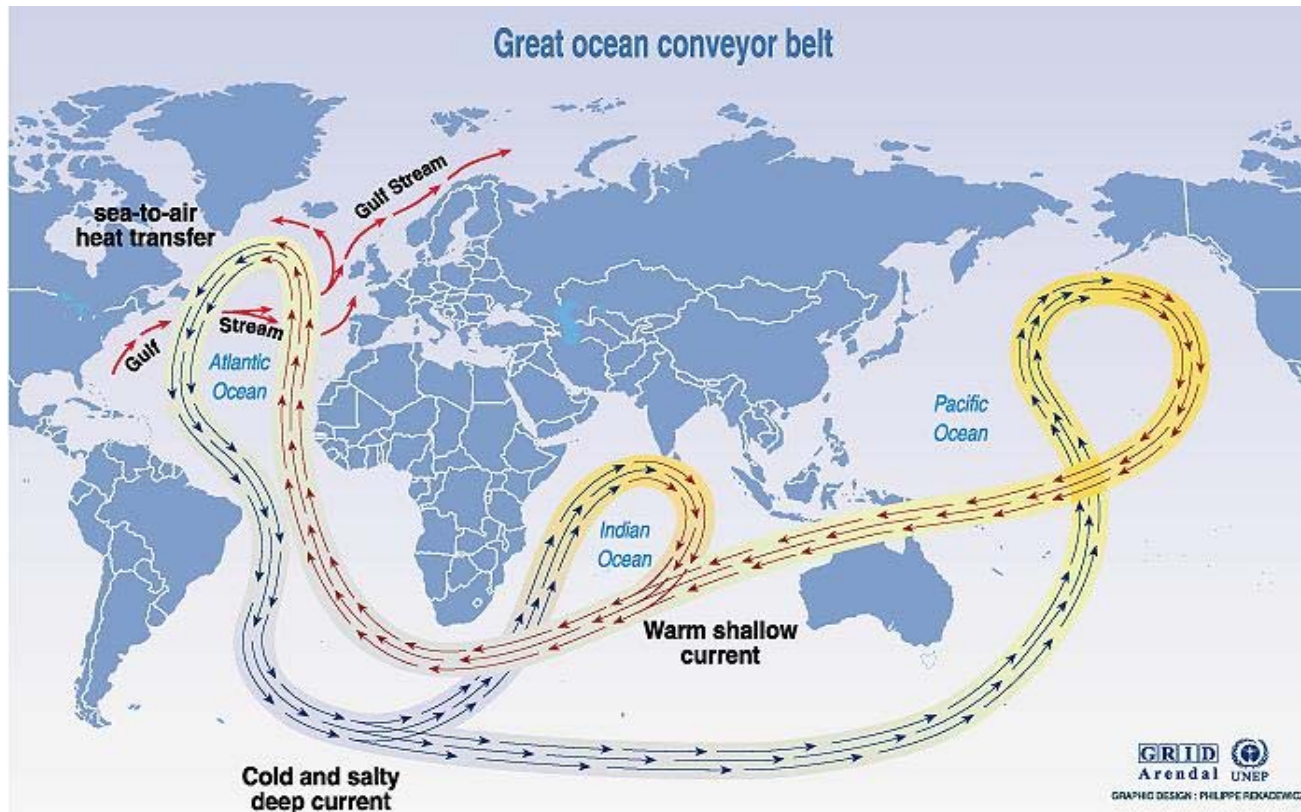
- Dependence of tropical SSTs on global tropical cyclone activity

= Tropical thermostat

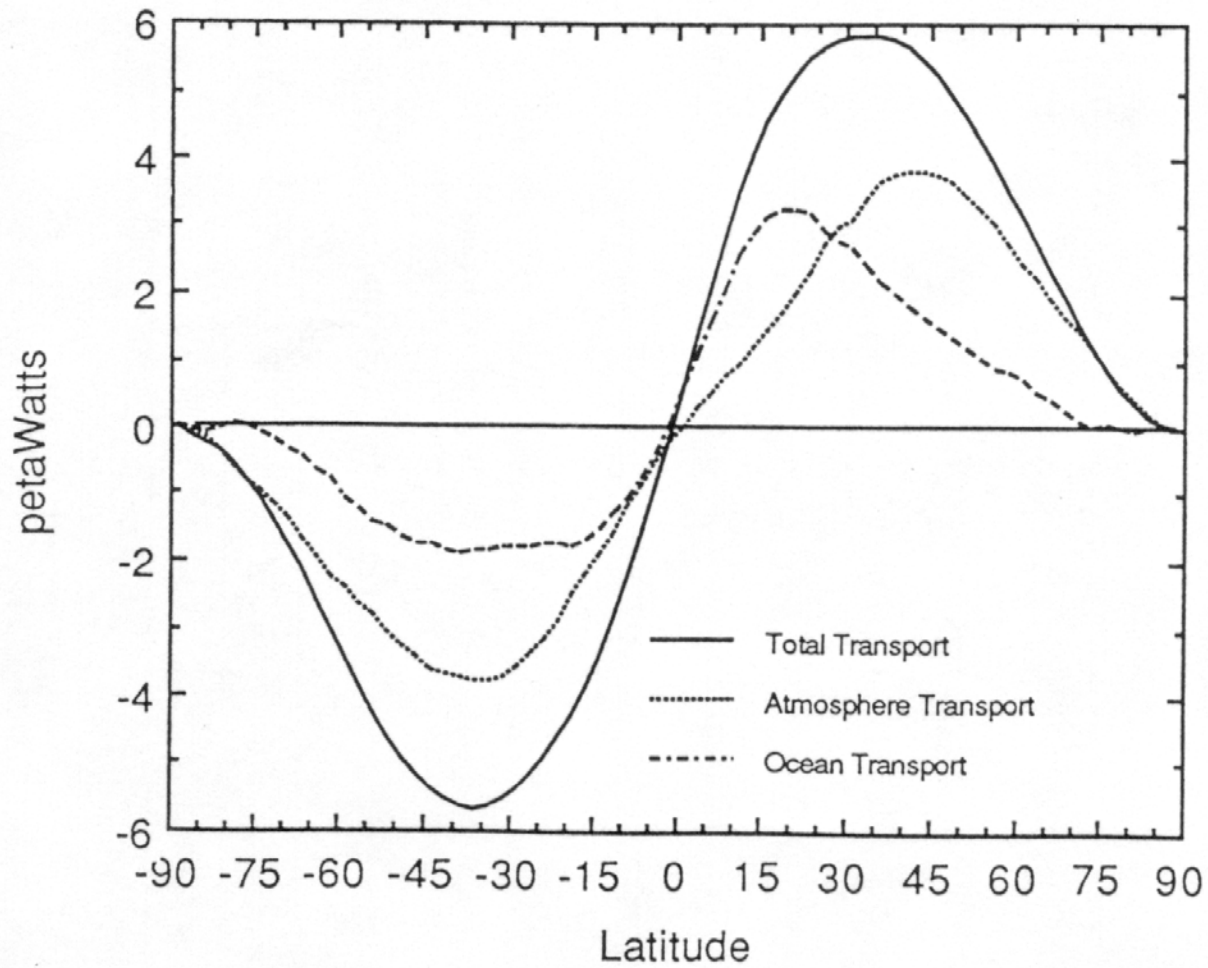


# Ocean Feedback

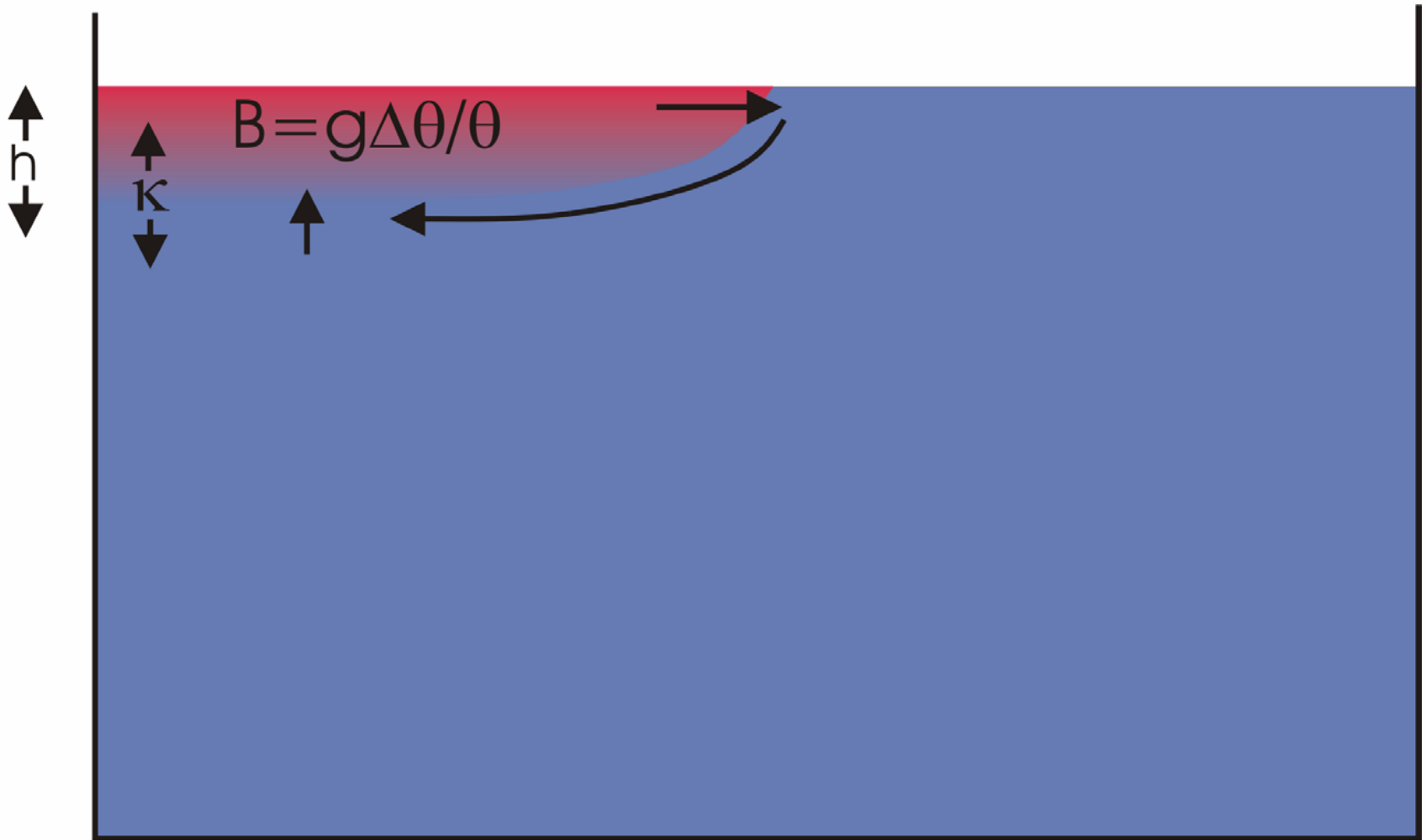
# Ocean Thermohaline Circulation



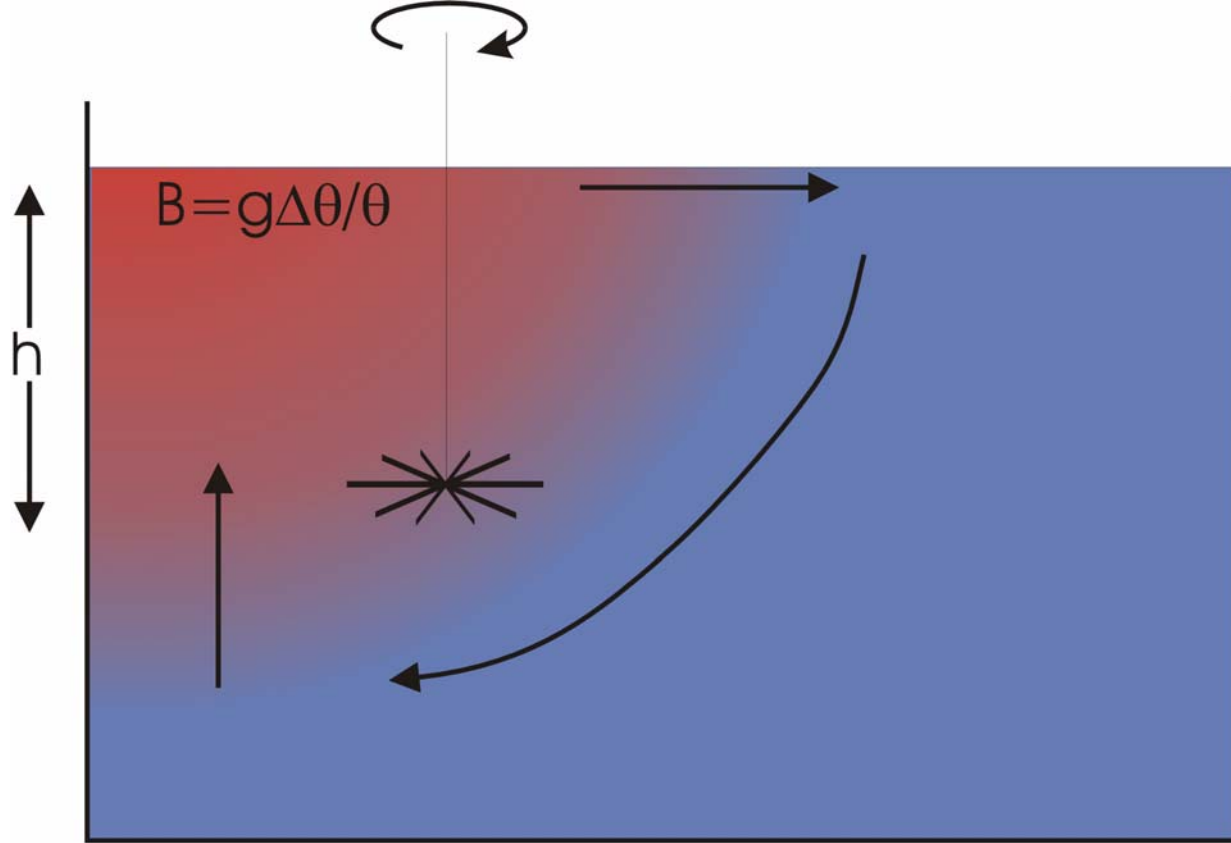
Source: Broecker, 1991, in Climate change 1995, Impacts, adaptations and mitigation of climate change: scientific-technical analyses, contribution of working group 2 to the second assessment report of the intergovernmental panel on climate change, UNEP and WMO, Cambridge press university, 1996.



Heat Transport by Oceans and Atmosphere



A hot plate is brought in contact with the left half of the surface of a swimming pool of cold water. Heat diffuses downward and the warm water begins to rise. The strength of the circulation is controlled in part by the rate of heat diffusion. In the real world, this rate is very, very small.



$$\text{Heat Flux} \sim P^{2/3} B^{2/3}$$

$$h \sim P^{1/3} B^{-2/3}$$

Adding a stirring rod to this picture greatly enhances the circulation by mixing the warm water to greater depth and bringing more cold water in contact with the plate. The strength of the lateral heat flux is proportional to the  $2/3$  power of the power put into the stirring, and the  $2/3$  power of the temperature of the plate.

Coupled Ocean-Atmosphere model run for 67 of the 83 tropical cyclones that occurred in calendar year 1996

Accumulated TC-induced ocean heating divided by 366 days

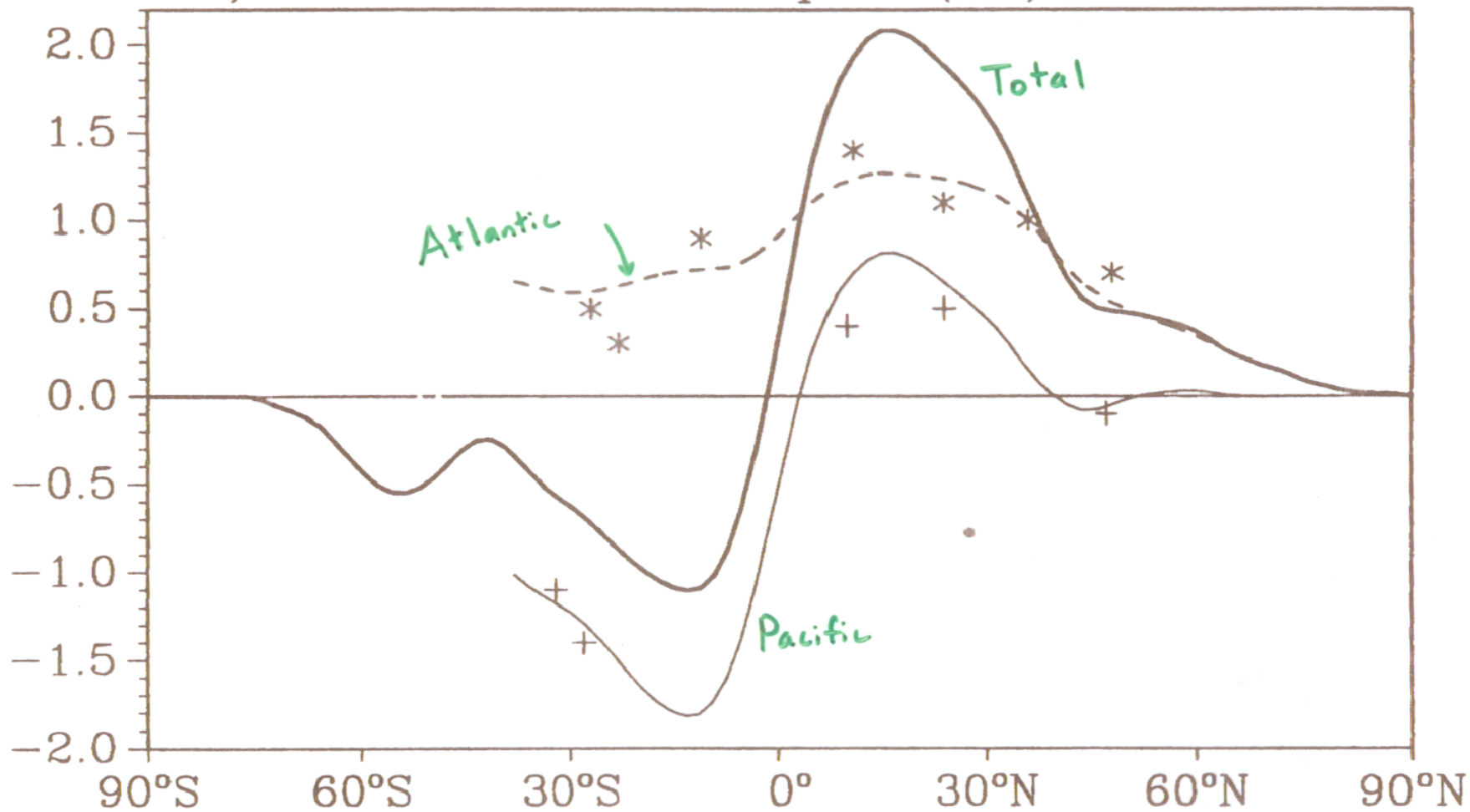
Result:

Net column-integrated heating of ocean induced by global tropical cyclone activity:

$$(1.4 \pm 0.7) \times 10^{15} \text{ W}$$

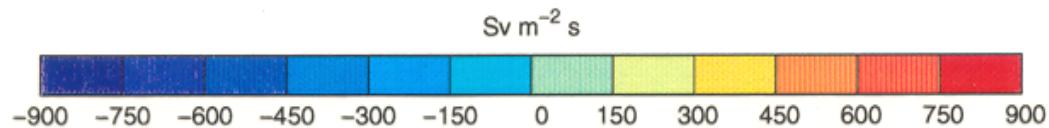
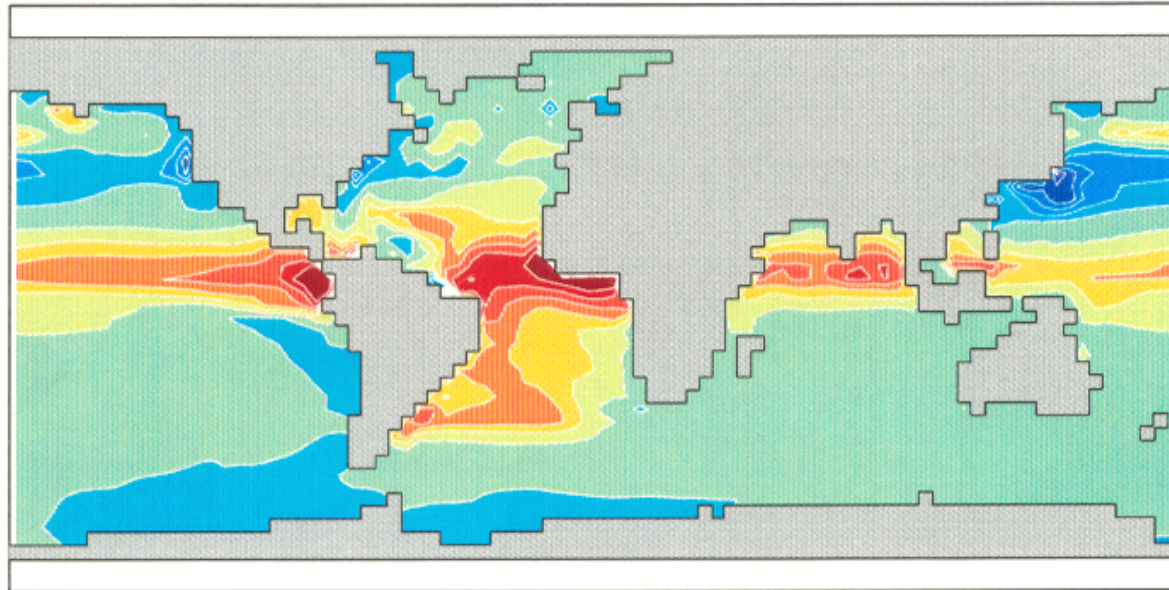
Trenberth et al., 2001  
Heat Transport (PW)

b)



## SENSITIVITY OF THE MERIDIONAL OVERTURNING – OCEAN + ATMOSPHERE

Diapycnal Mixing (MIN =  $-1066.94 \text{ Sv m}^{-2} \text{ s}$  & MAX =  $1167.95 \text{ Sv m}^{-2} \text{ s}$ )

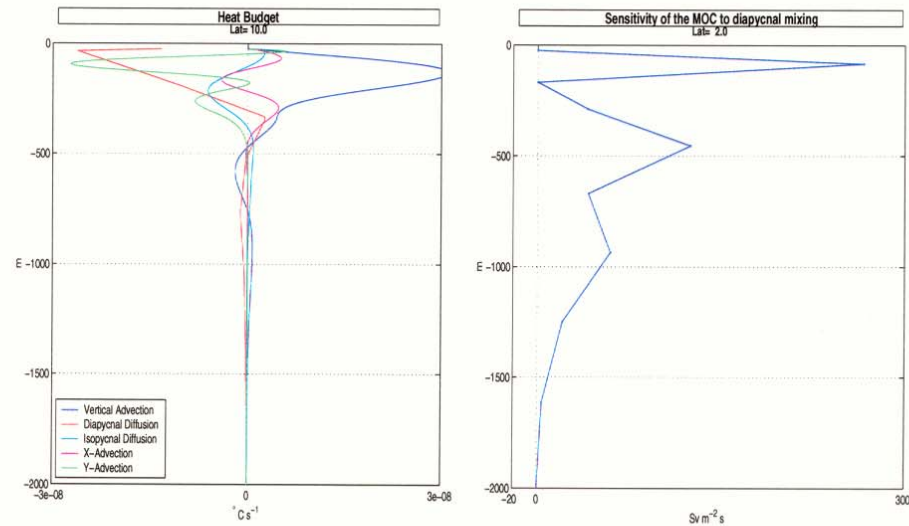


Veronique Bugnion used an ocean model to calculate the sensitivity of the total poleward heat flux by the world oceans to the strength and distribution of vertical mixing. This sensitivity, shown here, is concentrated in the Tropics, where hurricanes occur.



# The Role of Wind Forcing

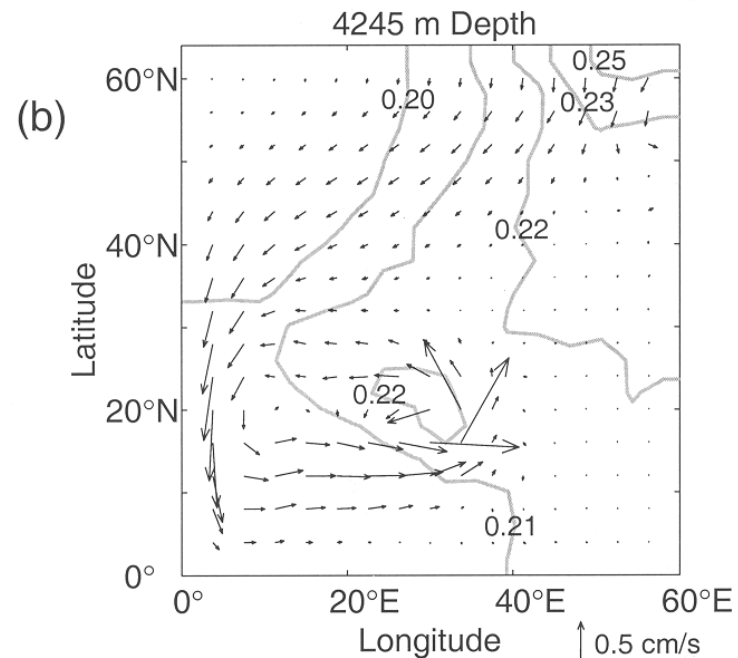
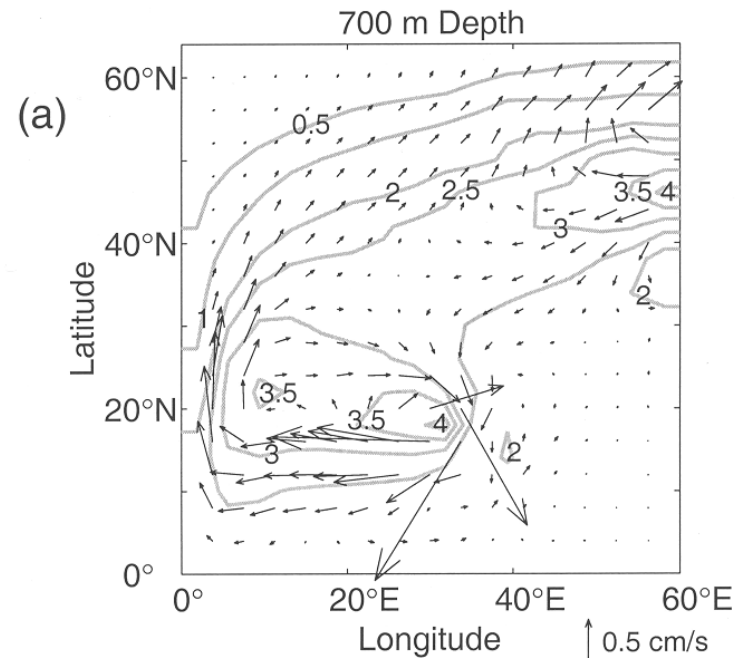
## Vertical profiles in the tropics



- Near surface heat fluxes are three times larger than without wind
- Near surface sensitivities dominate
- The secondary maximum occurs at the depth of transition between the wind driven and diffusive thermoclines

These diagrams show the currents generated by a very localized source of vertical mixing at  $20^{\circ}$  N and  $25^{\circ}$  E. The upper diagram shows the currents near the top of the ocean, while the bottom diagram show currents closer to the bottom. Note in particular the strong northward flow of warm water along the western boundary of the ocean, near the surface. These plots have been generated using a complex ocean model set in a simple rectangular basin.

Courtesy of Jeff Scott



# Implications for Climate:

$$\textit{Poleward Heat Flux} \sim FP^{\frac{2}{3}}$$

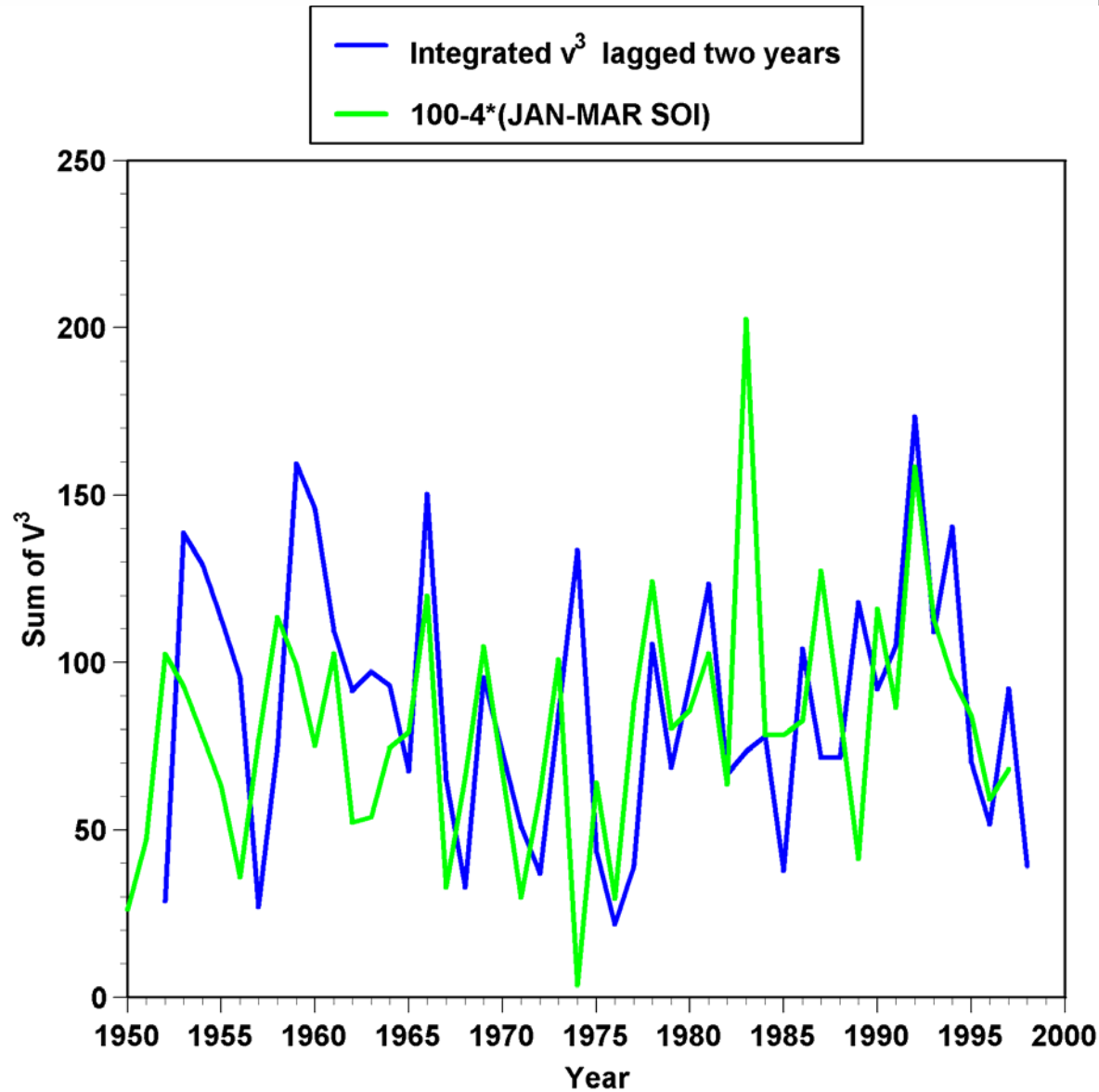
$$F \sim PI^3$$

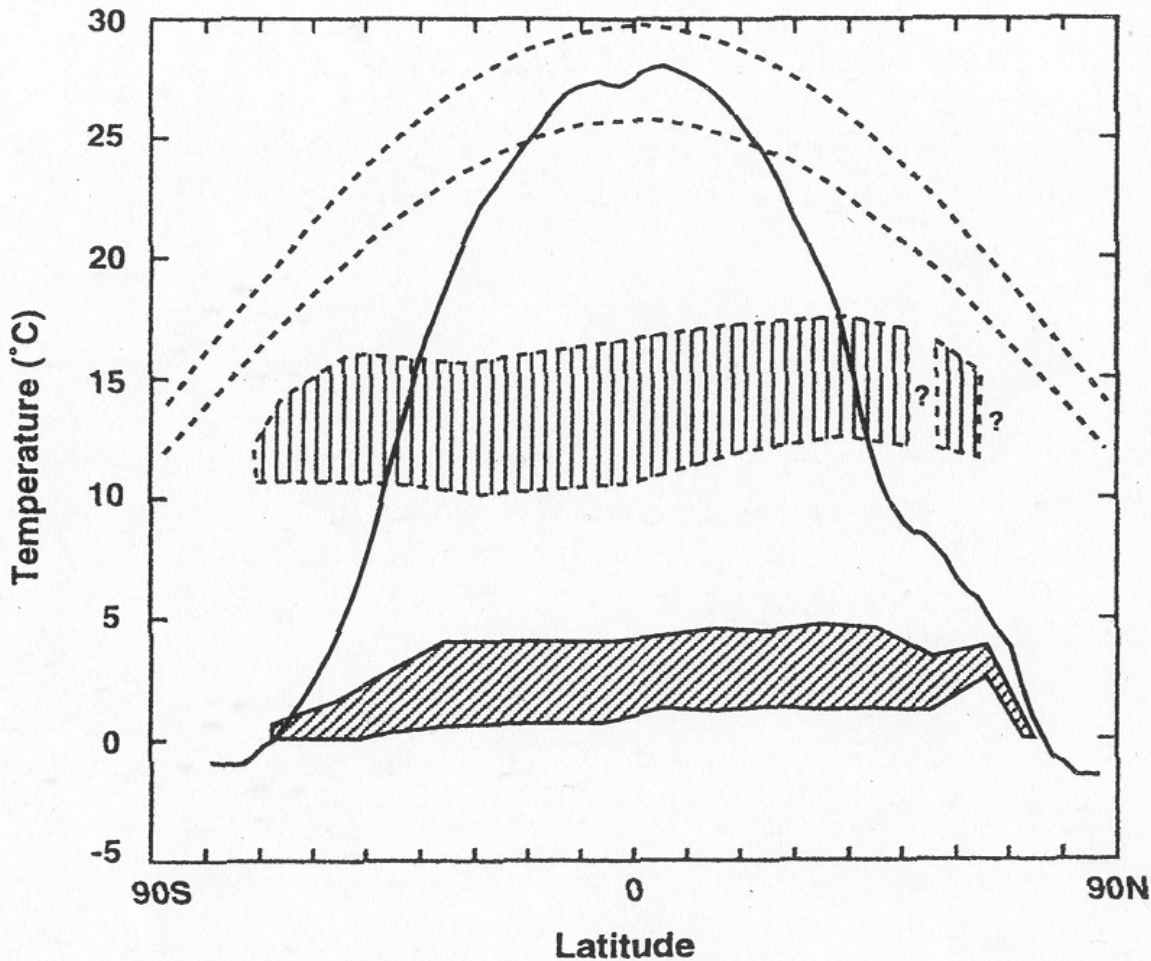
$$P \sim PI^3$$

$$\rightarrow \textit{Poleward Heat Flux} \sim PI^5$$

May be conservative, in view of Nolan's results

This plot shows a measure of El Niño/La Niña (green) and a measure of the power put into the far western Pacific Ocean by tropical cyclones (blue). The blue curve has been shifted rightward by two years on this graph. There is the suggestion that powerful cyclones in the western Pacific can trigger El Niño/La Niña cycles.





**Figure 4.1.** Modern (solid line) and estimated early Eocene (dashed lines) zonal sea surface temperatures. Modern (diagonal hatch) and estimated early Eocene (vertical hatch) water temperatures at bottom depths between 1000 m and 5000 m. Modern data are from the *World Ocean Atlas data set* (Levitus and Boyer, 1994). The cooler Eocene SST profile is based on Zachos *et al.* (1994); the warmer SST profile is based on Crowley and Zachos (Chapter 3, this volume).