



# How to make simulated hurricanes look like observed hurricanes

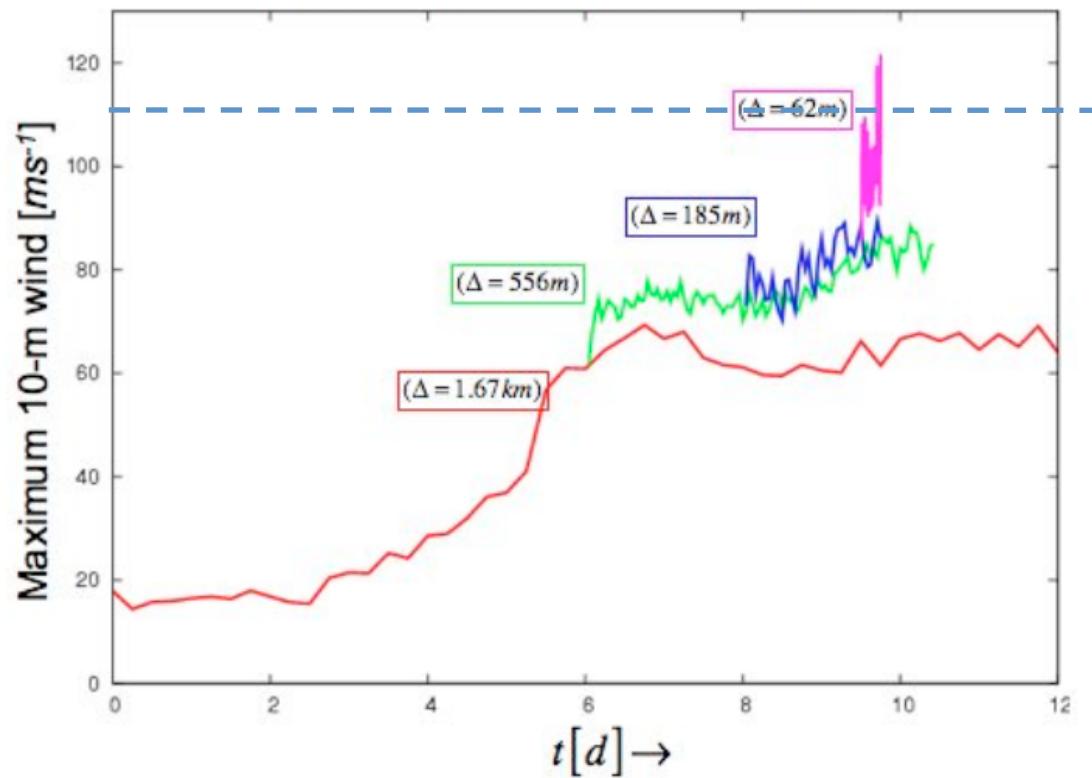
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National Center for Atmospheric Research

Seminar at NOAA/HRD  
15 November 2011

Acknowledgments:  
NOPP/ONR (N00014-10-1-0148)  
NCAR is sponsored by the National Science Foundation

## Numerical Simulations of a Hurricane

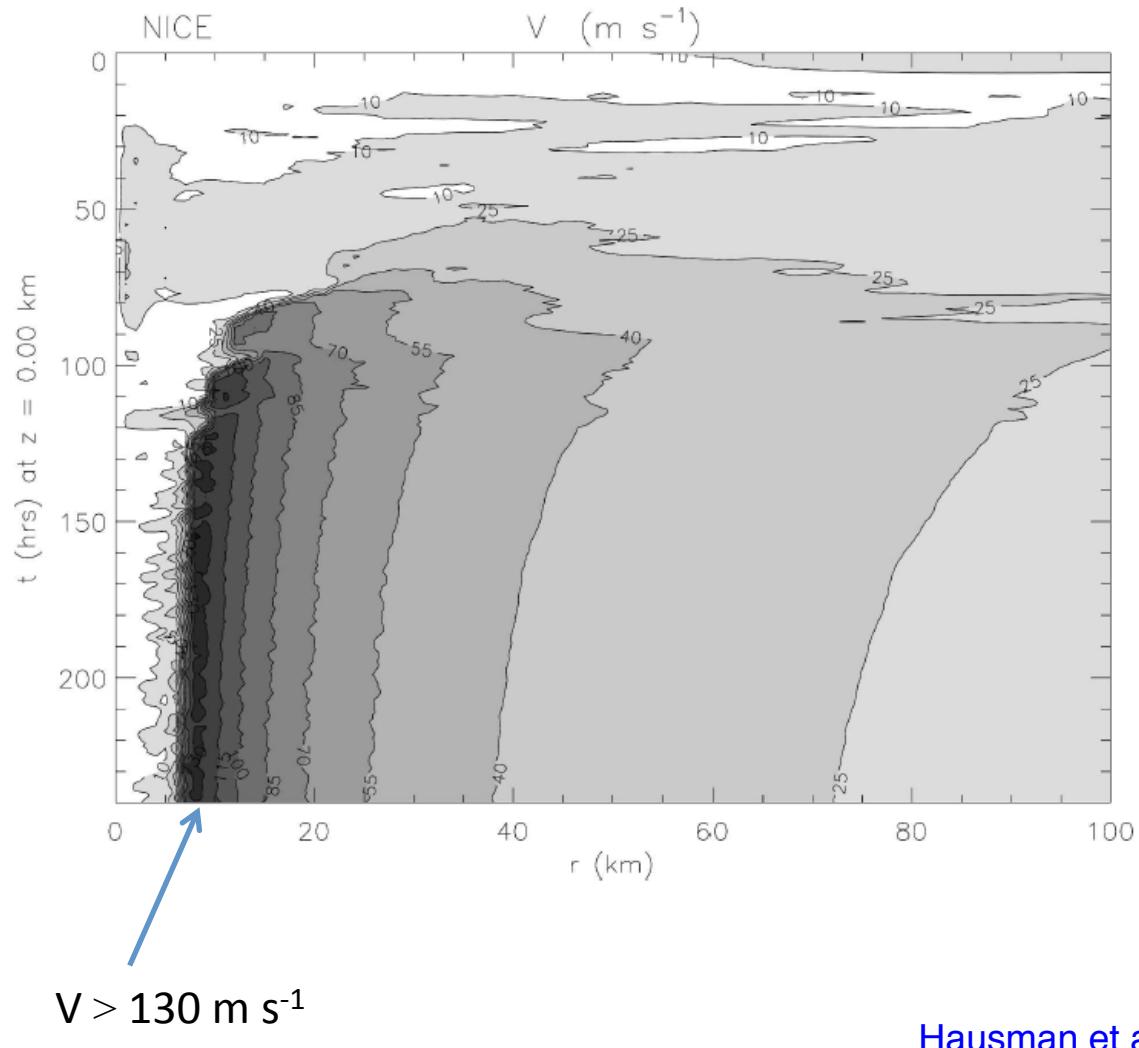
(3d, WRF/ARW model, SST = 26 °C,  $C_k/C_d = 0.65$ )



Official (WMO) peak wind:  
113  $m s^{-1}$ , Olivia (1996)

Rotunno et al (2009)

## Numerical Simulations of a Hurricane (axisymmetric model, SST = 28 °C, $C_k/C_d = 1$ )



# Model components investigated:

[see Bryan and Rotunno (2009, MWR) for details]

- Resolution\* (as long as  $\Delta r < 8$  km,  $\Delta z < 500$  m)
- Numerics (e.g., advection scheme)
- Initial vortex (affects size more than intensity)
- Governing equations (energy-conserving terms change  $V_{\max}$  by  $\sim 10\%$ )
- Microphysics (fall velocity of condensate matters most)
- **Surface exchange coefficients** (but not as much as theory says they should)
- **Turbulence** (relatively unexplored topic until recently)

## Turbulence in mesoscale models (including this axisymmetric model):

Turbulence eddy viscosities:

$$\text{horizontal: } \nu_h = l_h^2 S_h,$$

$$\text{vertical: } \nu_v = l_v^2 (S_v^2 - N_m^2)^{1/2}.$$

Where:  $S$  is deformation

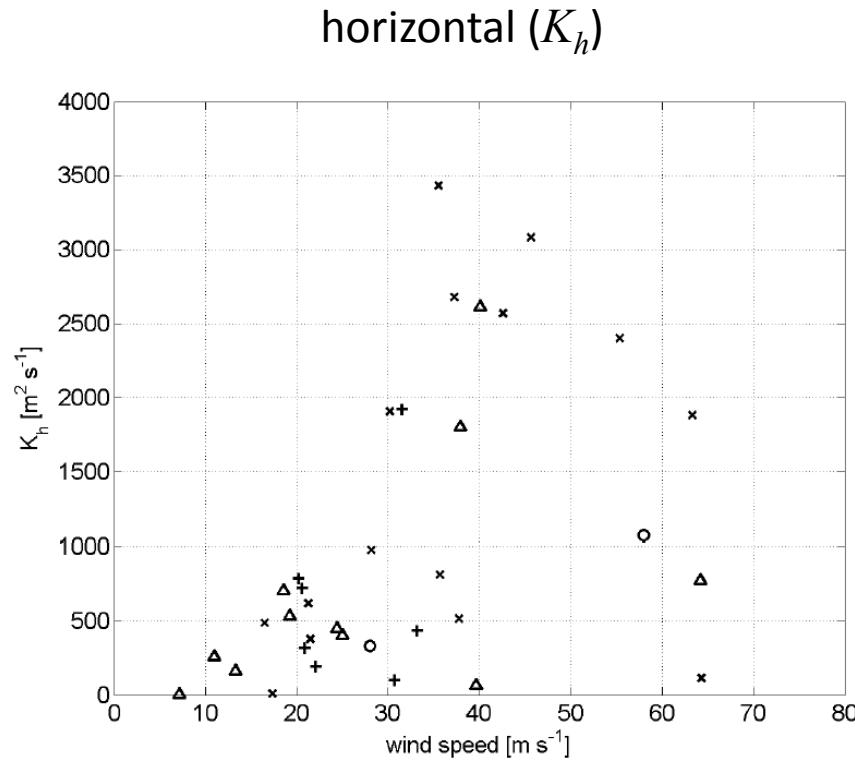
$N_m^2$  is squared Brunt-Vaisala frequency

$l_h$  is a horizontal length scale (unknown; specified here)

$l_v$  is a vertical length scale (unknown; specified here)

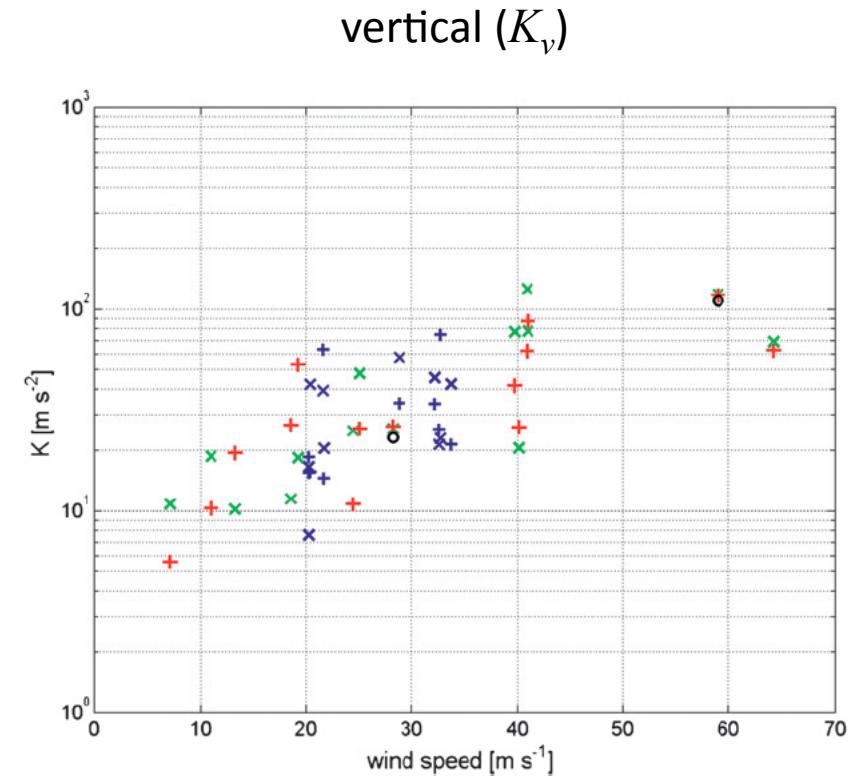
- This turbulence model is used because it has only one free parameter (a length scale  $l$ ) that is intuitive and obtainable from measurements
- Typical settings:
  - $l_h$ : 3000 m (Rotunno and Emanuel 1987) to 0 (Hausman et al 2006)
  - $l_v$ : 200 m (Rotunno and Emanuel 1987) to 40 m (MM5 “bulk PBL” scheme)

## Estimated eddy diffusivity ( $K$ ) from flight-level observations (roughly 500 m MSL)



Zhang and Montgomery (submitted)

further analysis shows  $l_h \approx 700 \text{ m}$

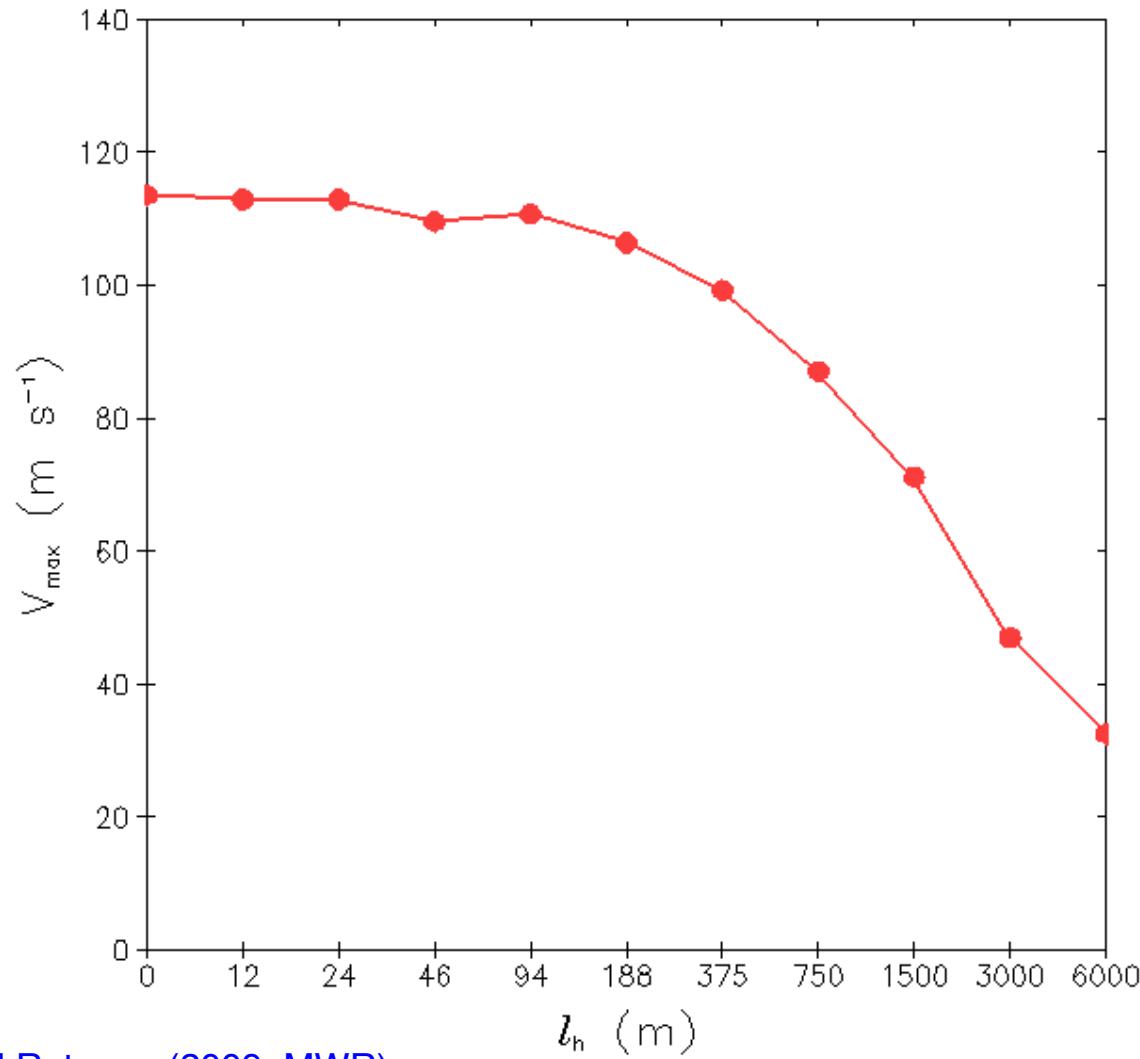


Zhang et al (2011)

further analysis shows  $l_v \approx 100 \text{ m}$

sensitivity of  $V_{\max}$  to horizontal turbulence:

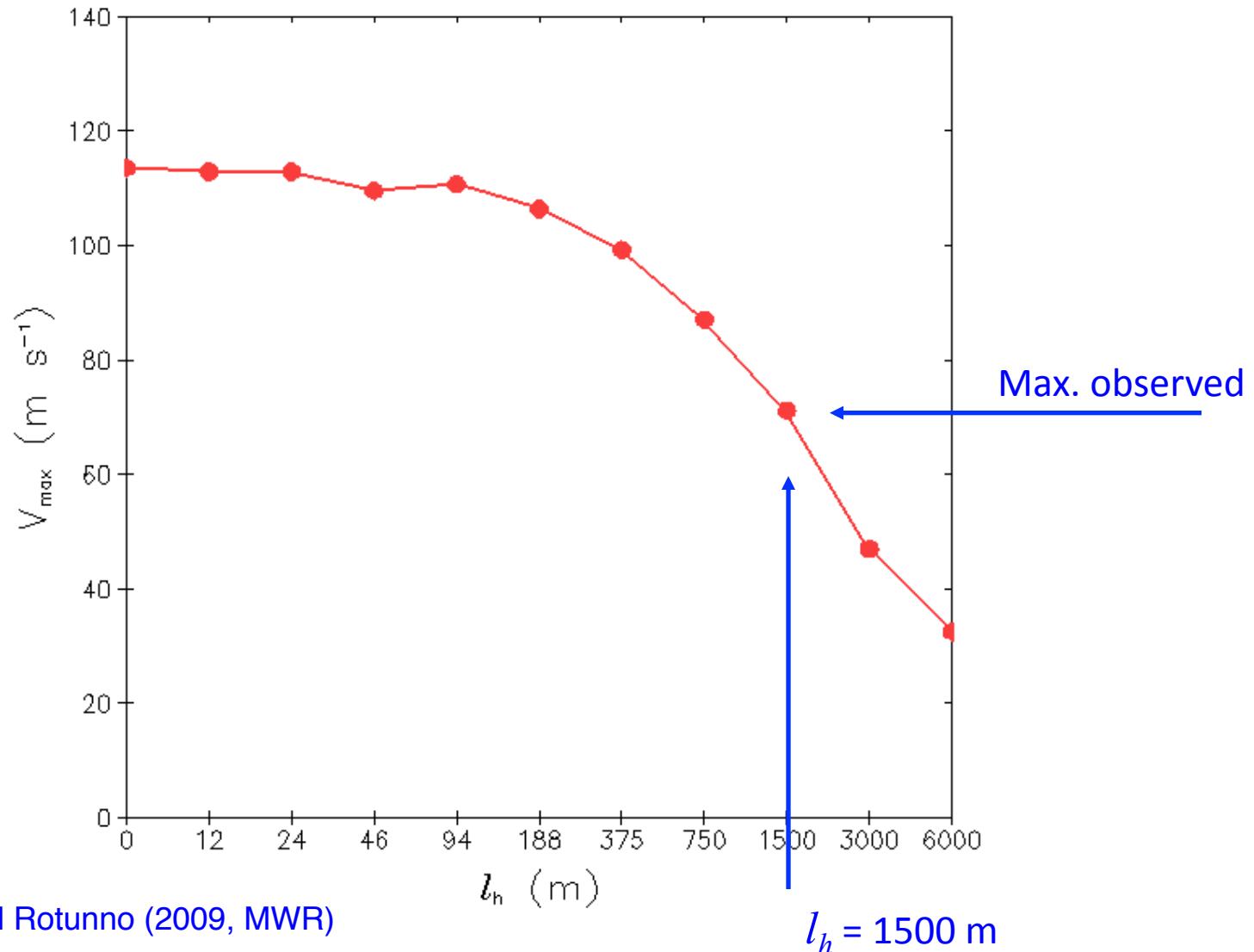
axisymmetric model simulations (CM1, SST = 26 °C,  $C_k/C_d = 1$ ,  $l_v = 200$  m)



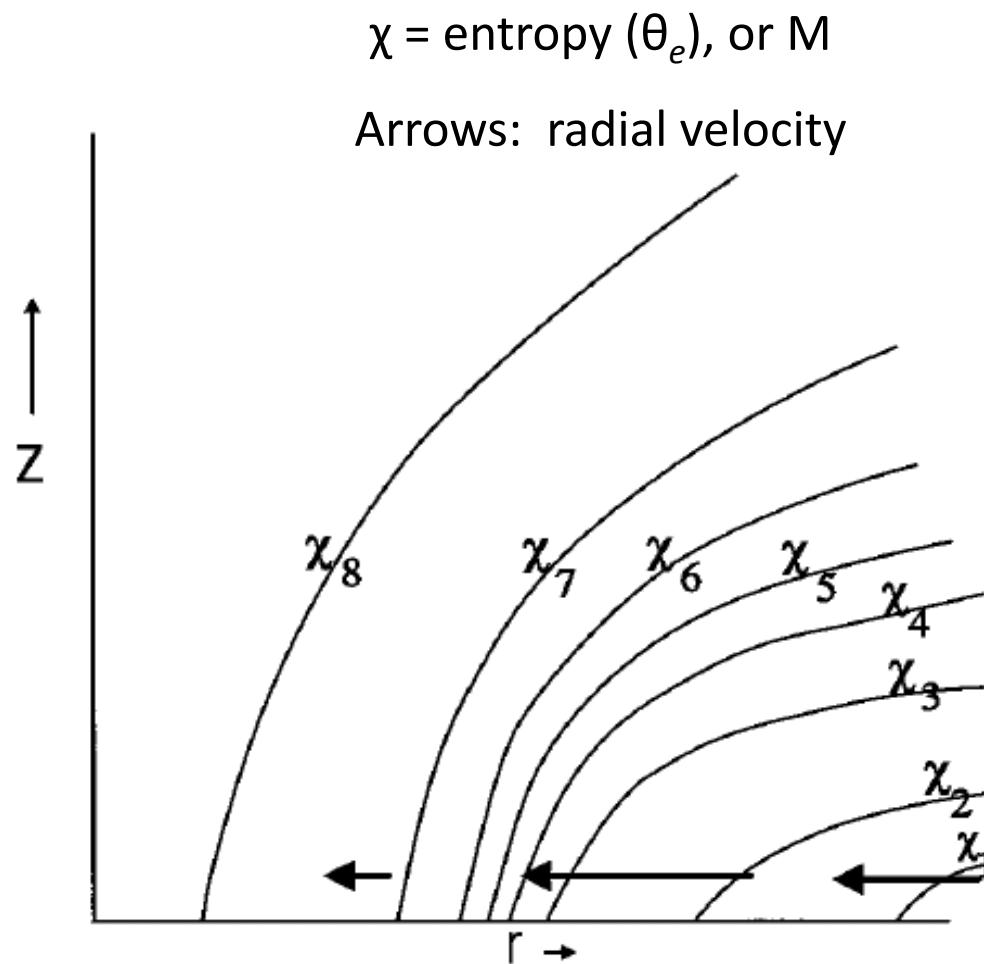
Bryan and Rotunno (2009, MWR)

sensitivity of  $V_{\max}$  to horizontal turbulence:

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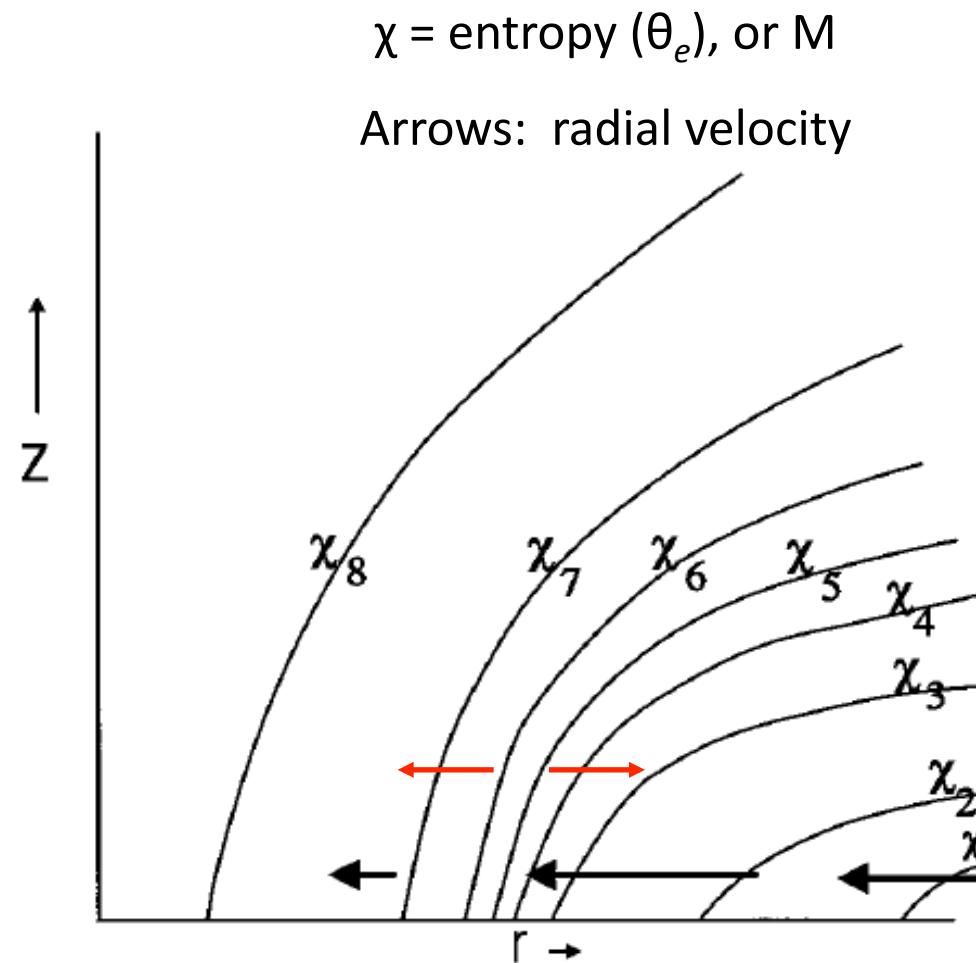


## Frontogenesis in hurricane eyewalls:



Emanuel (1997)

## Frontogenesis in hurricane eyewalls:



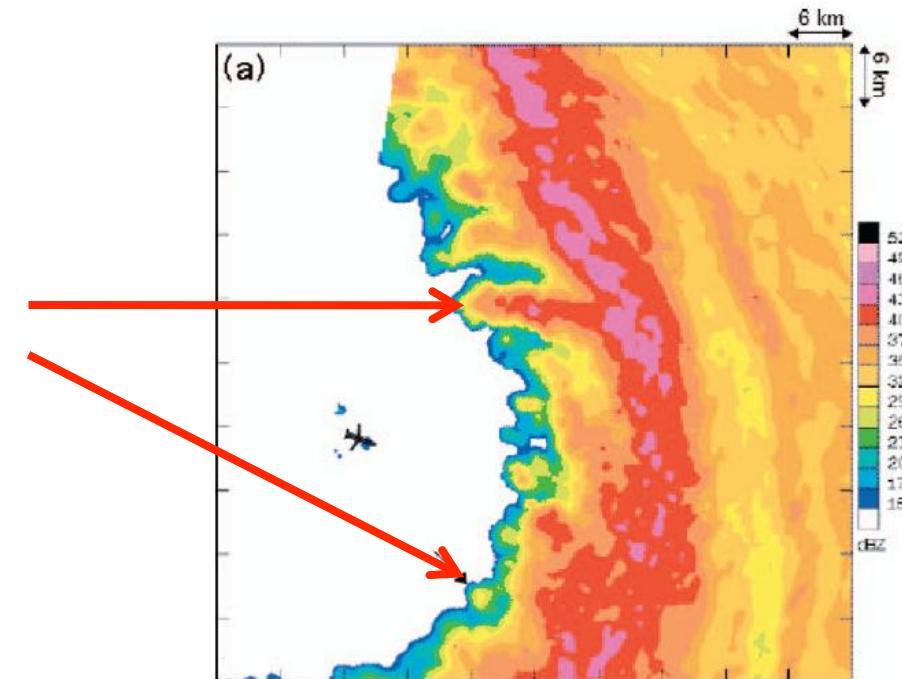
Emanuel (1997)

diffusion is frontolytic! (limits frontal collapse)

## Mesoscale turbulence in hurricane eyewalls:

reflectivity,  $z \approx 2.5$  km MSL

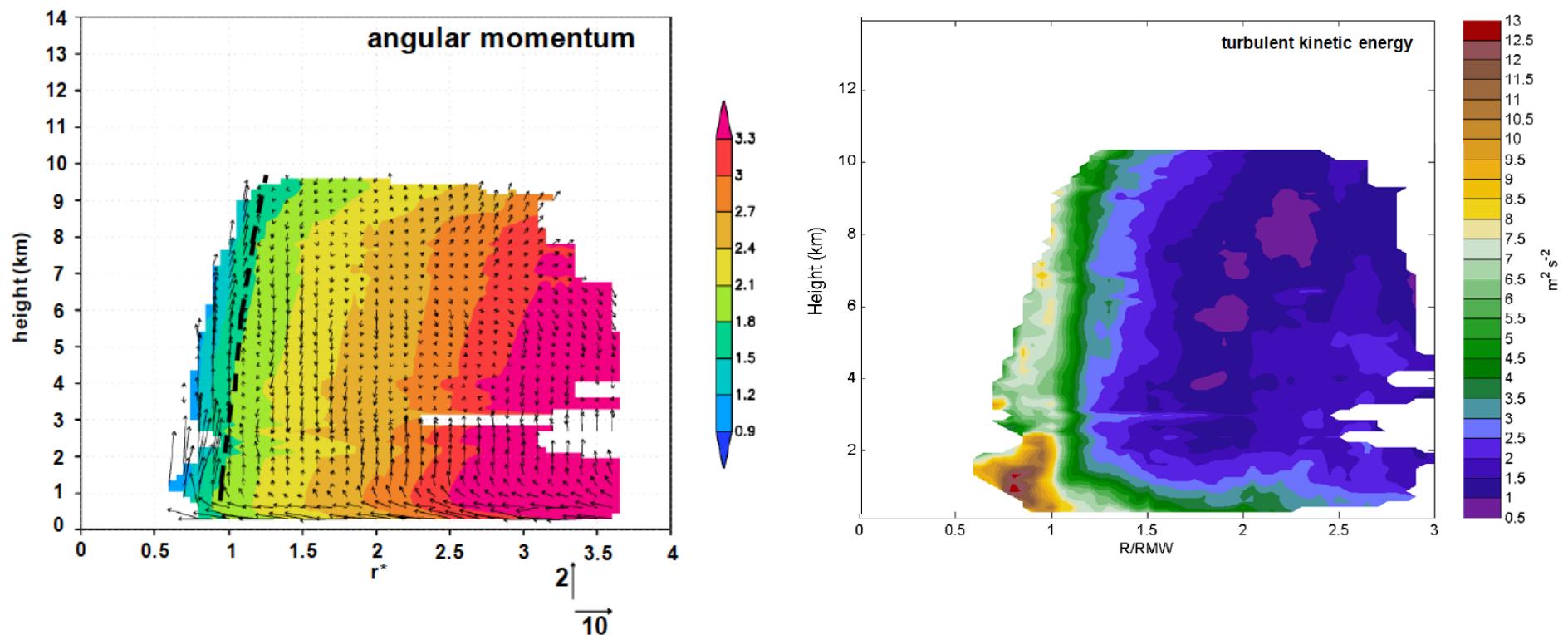
mesovortices at  
eye/eyewall interface



Aberson et al. (2006)

Experience with 3d models:  $\Delta x$  must be  $O(100$  m) to produce these features

## Composite analyses from airborne Doppler radar



Rogers et al (2011)

# Uncertainties in surface exchange coefficients

The exchange of energy and momentum between the surface (ocean) and the atmosphere is parameterized by bulk aerodynamic formulae:

$$\tau_{z\theta} = C_k V (\theta_{\text{surf}} - \theta)$$

$$\tau_{zq} = C_k V (q_{\text{surf}} - q_v)$$

$$\tau_{rz} = C_d V u$$

$$\tau_{rz} = C_d V v$$

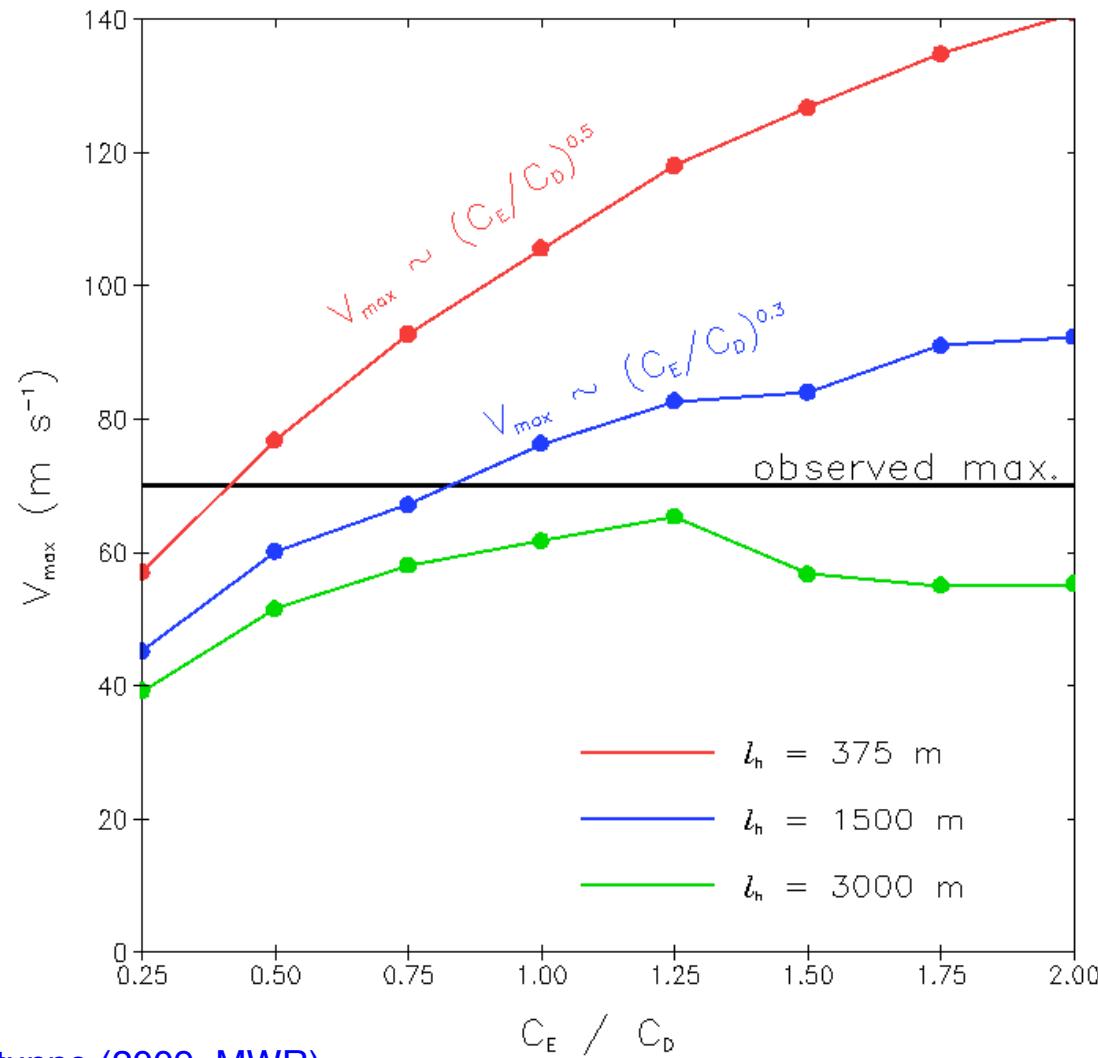
Theoretical models (see review by Emanuel 2004):

$$V_{\max} \sim \left( \frac{C_k}{C_d} \right)^{\frac{1}{2}}$$

Typical numerical model settings:  $C_k/C_d \approx 0.5$  to 1

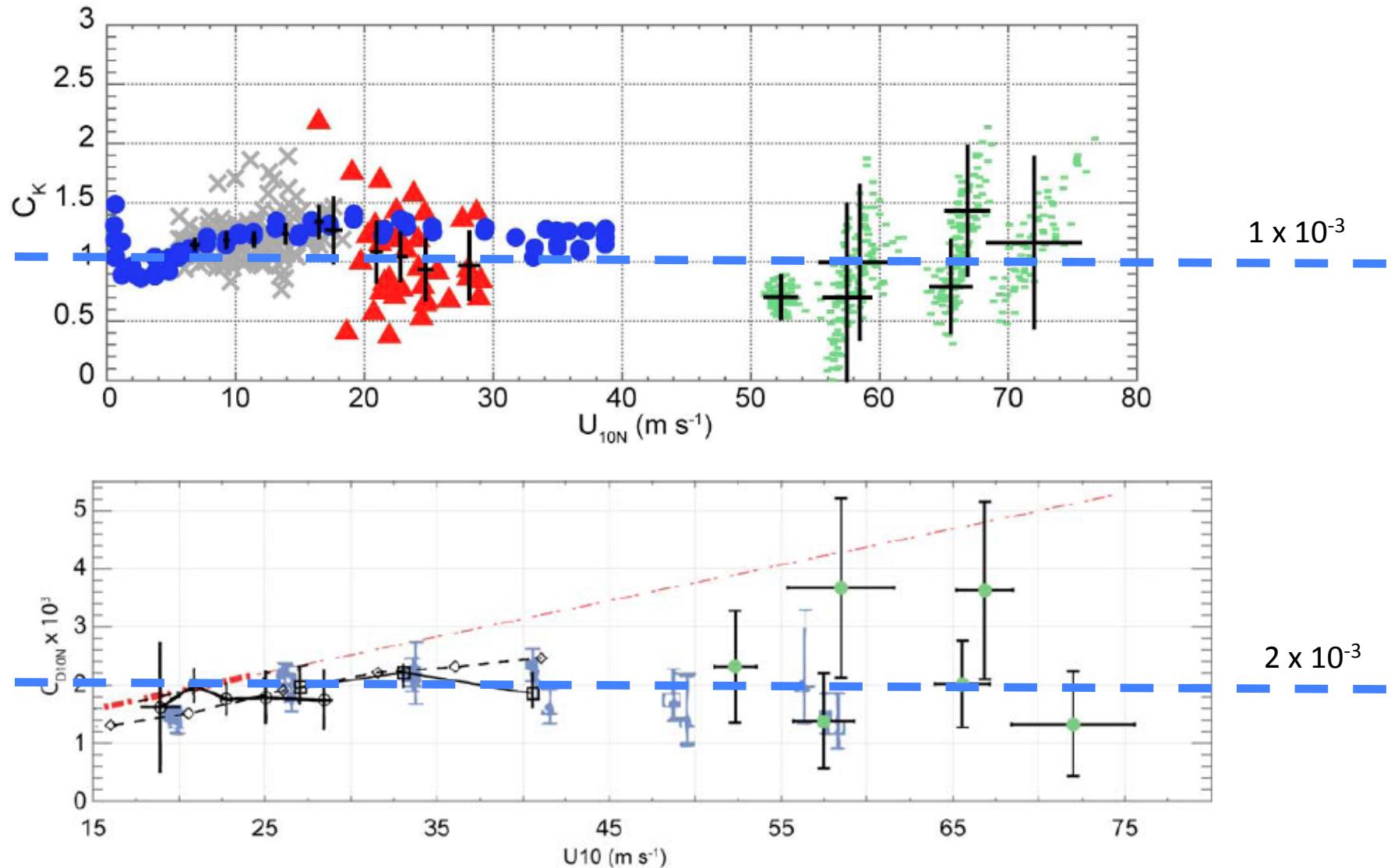
## sensitivity of $V_{\max}$ to surface exchange coefficients:

axisymmetric model simulations (CM1, SST = 26 °C,  $l_v = 200$  m)



Bryan and Rotunno (2009, MWR)

## Observed/diagnosed exchange coefficients

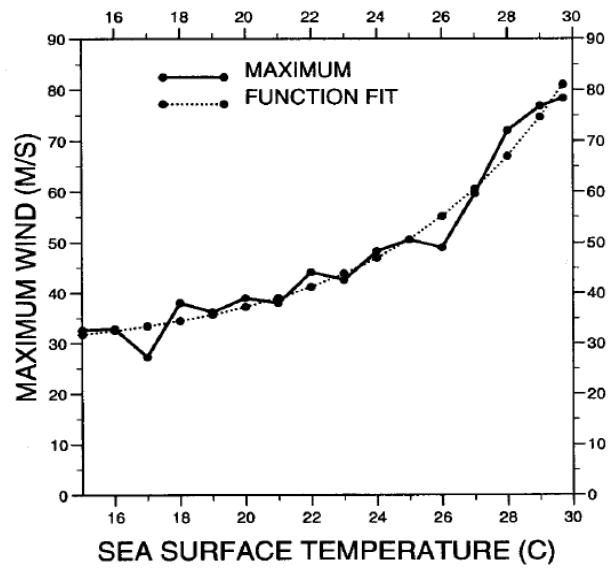


Bell (2010)

- Goal of this study: Determine which combination of parameters  $l_h$ ,  $l_v$ ,  $C_k$ , and  $C_d$  yield reasonable TC intensity *and* structure
- Methodology: Use relatively simple and well-observed metrics of intensity and structure ...

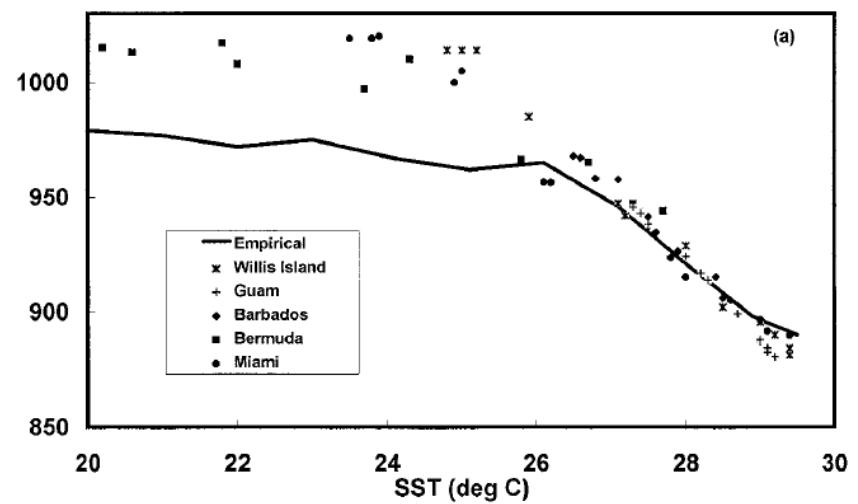
# Intensity:

Max winds:



DeMaria and Kaplan (1994)

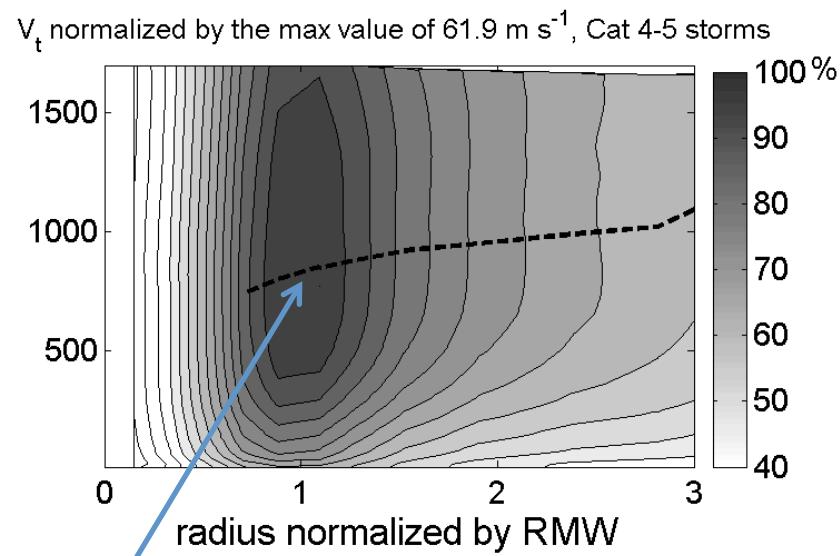
Min surface pressure:



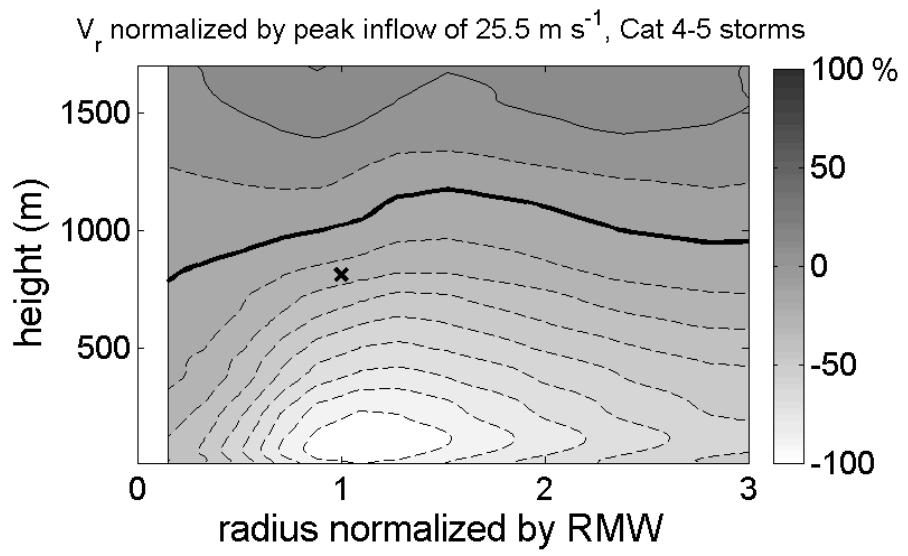
Holland (1997)

Note: for above-surface  $V_{max}$ , 10-m sustained winds have been multiplied by 1.35

## Structure:



Note:  $V_{\max}$  located at 800-900 m MSL



Zhang et al (2011)

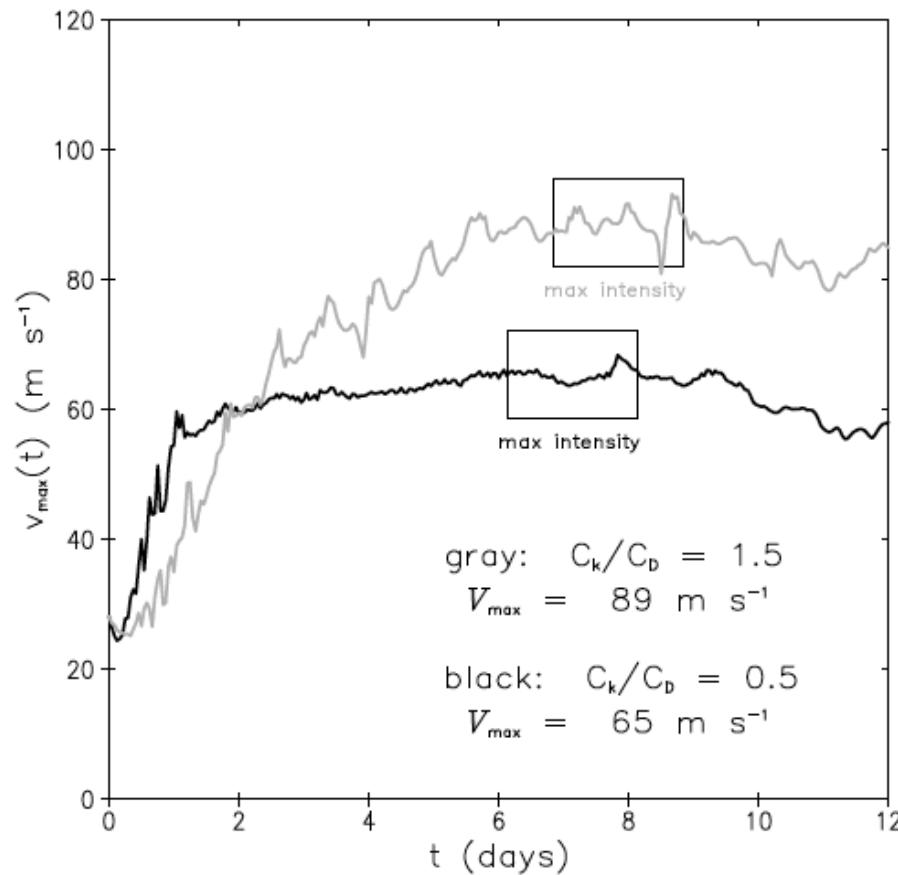
## Other Metrics:

- Surface inflow angle:  $\approx 23^\circ$  (Powell et al 2009)
- Wind-pressure relationships: empirical equations from Knaff and Zehr (2007)

# Model Setup

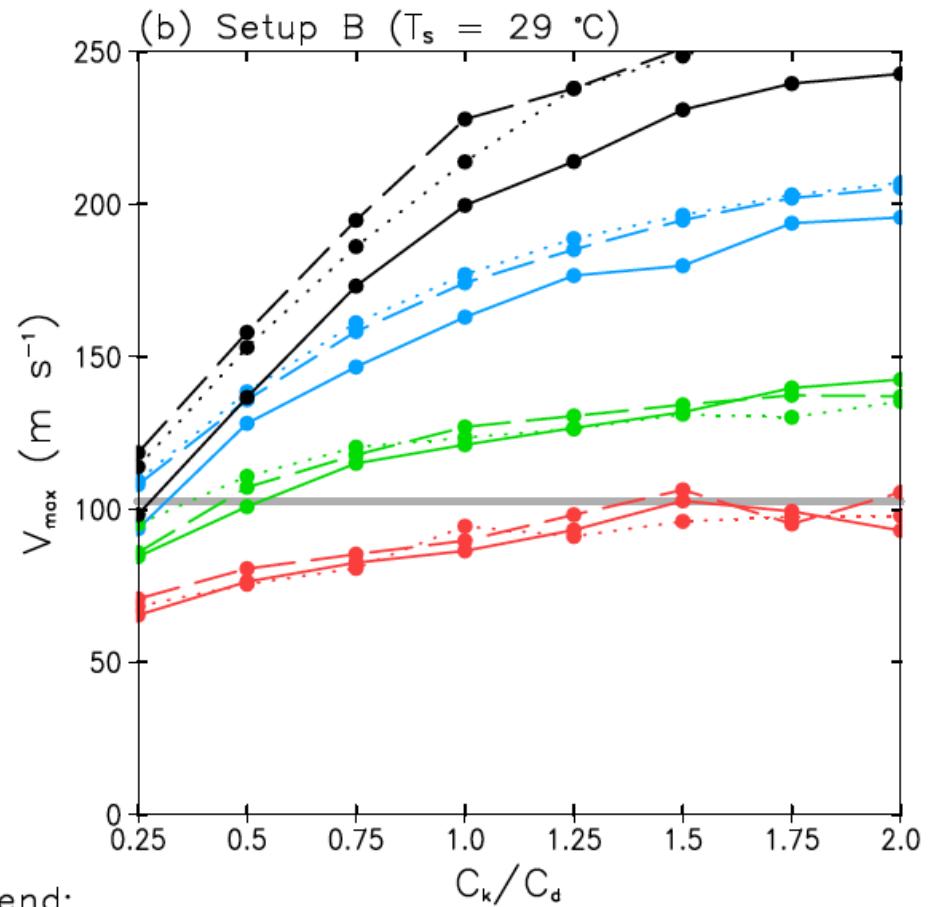
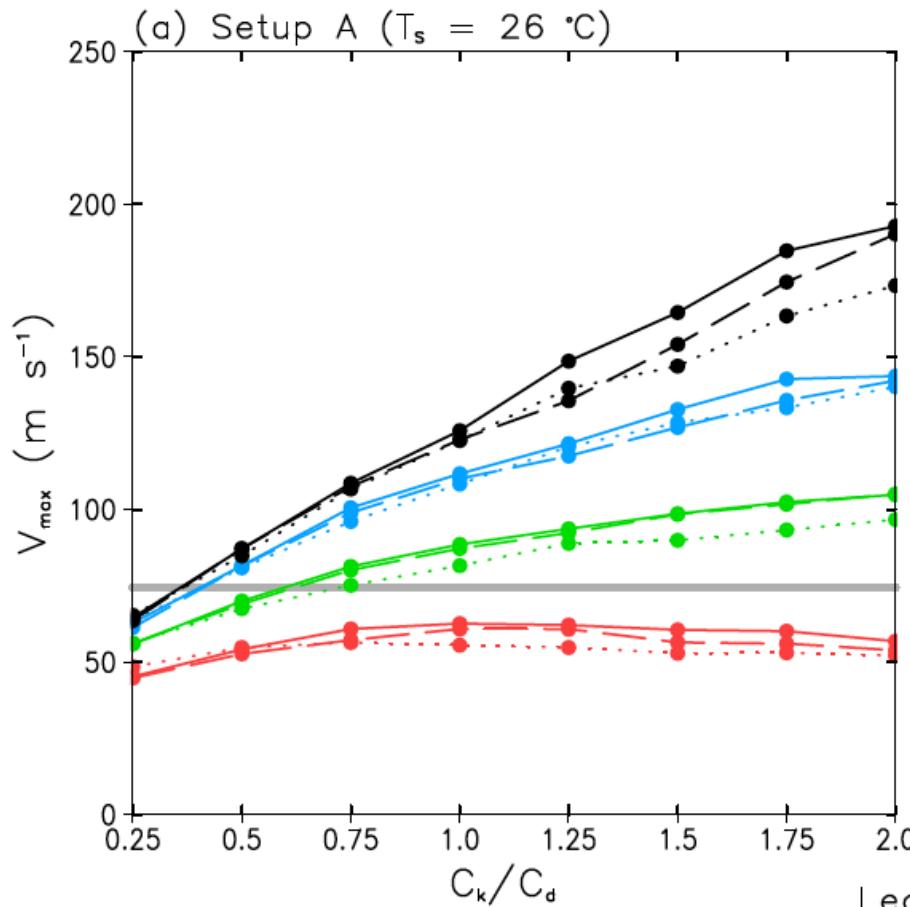
- CM1: Axisymmetric model with  $\Delta r = 1 \text{ km}$  (some 3d results also)
- $\Delta z$  varies (20 m to 250 m); 17 levels below 1 km (123 total levels)
  - First level for  $u, v$  is 10 m ASL
- Two environments considered:
  - Rotunno and Emanuel (1987):  $T_s = 26 \text{ }^\circ\text{C}$ , CAPE = 400 J/kg
  - Dunion (2011) “moist tropical” sounding:  $T_s = 29 \text{ }^\circ\text{C}$ , CAPE = 2400 J/kg  
 $T_s = 29 \text{ }^\circ\text{C}$  is chosen so initial air-sea temperature difference is 2.2  $^\circ\text{C}$  (Cione et al 2000)
- Two microphysical schemes:
  - Rotunno and Emanuel (1987) liquid-only scheme
  - Morrison et al (2009) double-moment mixed-phase scheme
- Nominal setup:  $C_k = \text{constant} = 1.2 \times 10^{-3}$ ,  $C_d = \text{constant}$
- Following results presented in terms of  $C_k/C_d$   
(recall that obs/lab results are finding  $C_k/C_d \approx 0.5$ )
- See Bryan (2011, MWR, in press) for more details

## Time of maximum intensity



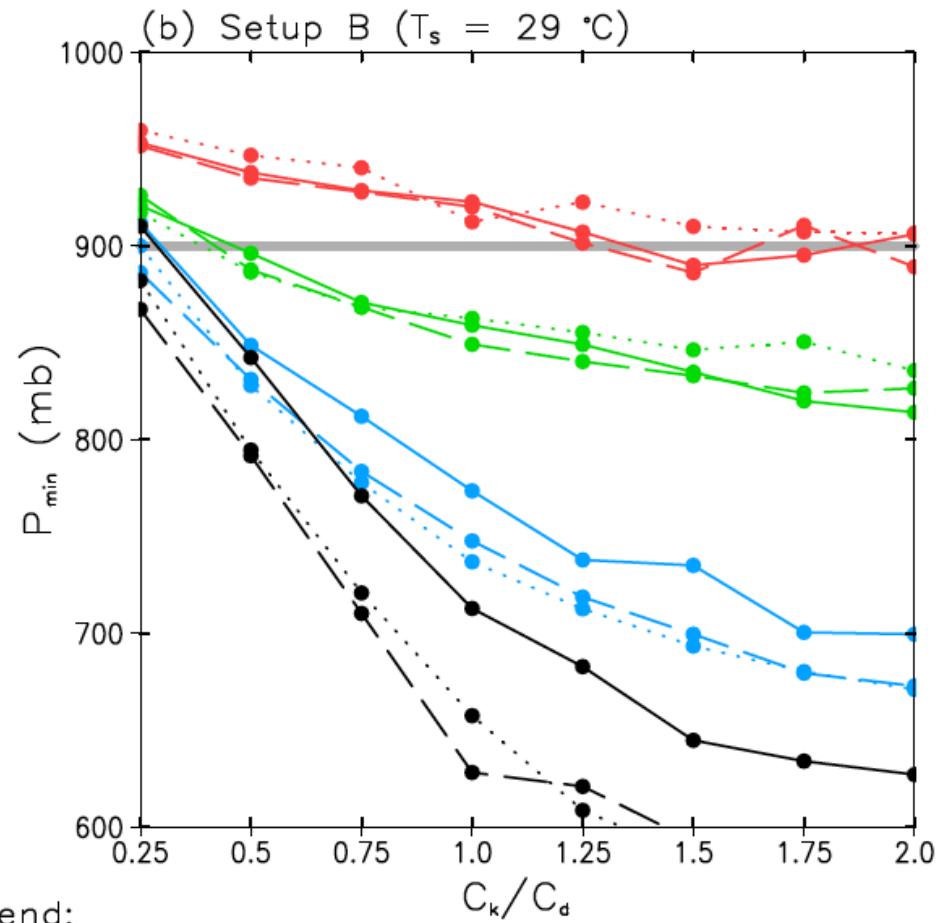
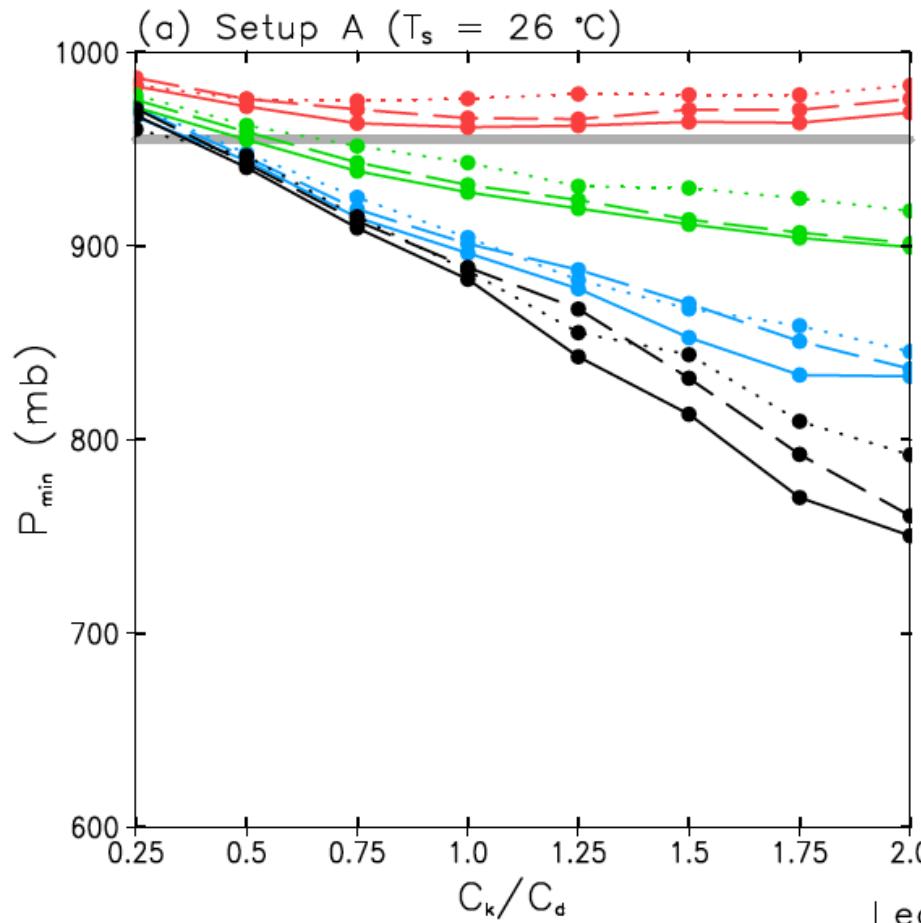
## Maximum tangential windspeed (note: *above surface*)

---> Horizontal gray line: observed  $V_{\max}$  (see Bryan 2011 for details)

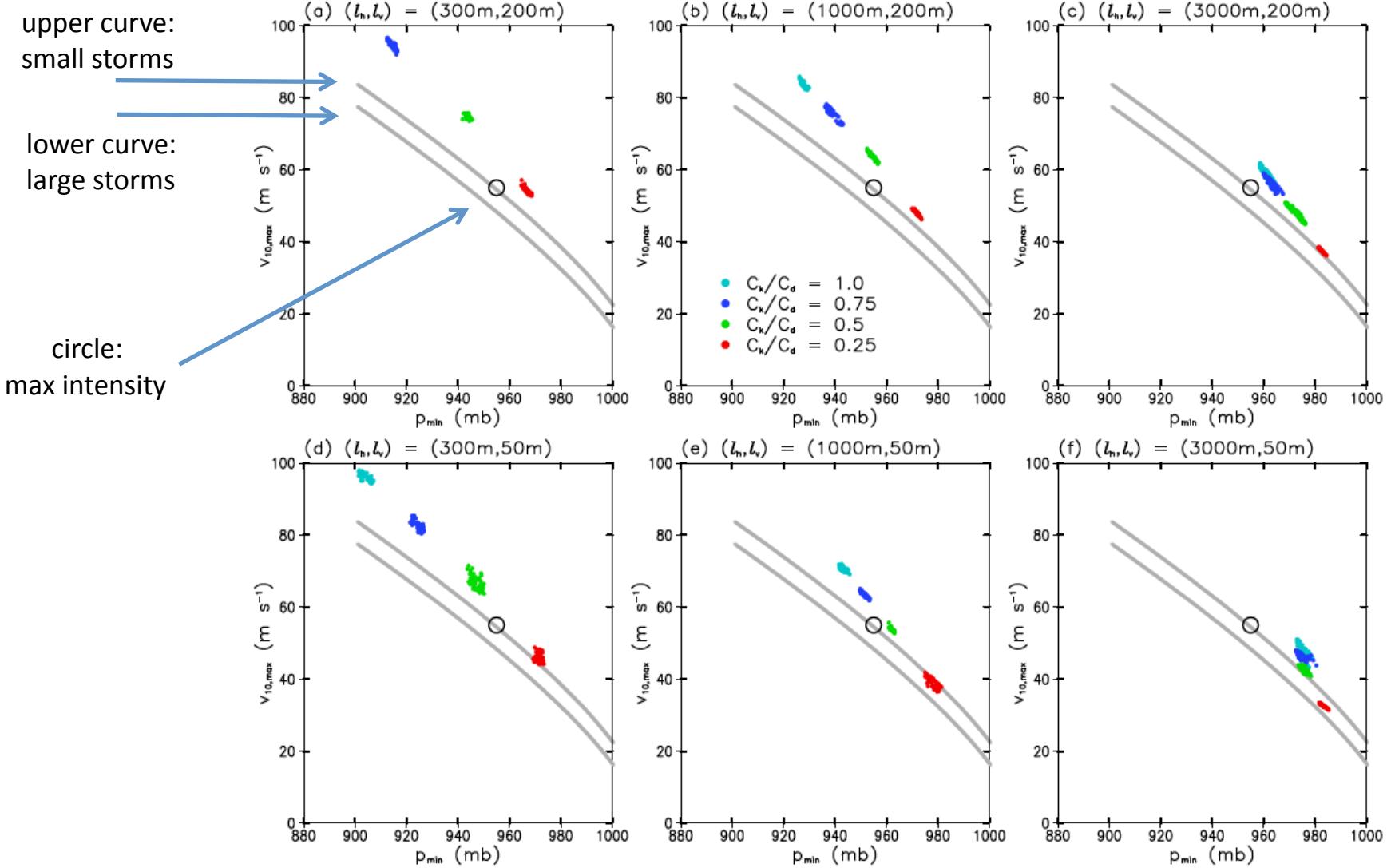


## Minimum Surface Pressure

---> Horizontal gray line: observed  $P_{\min}$



## Wind-pressure relationship: Setup A ( $T_s = 26^\circ\text{C}$ )

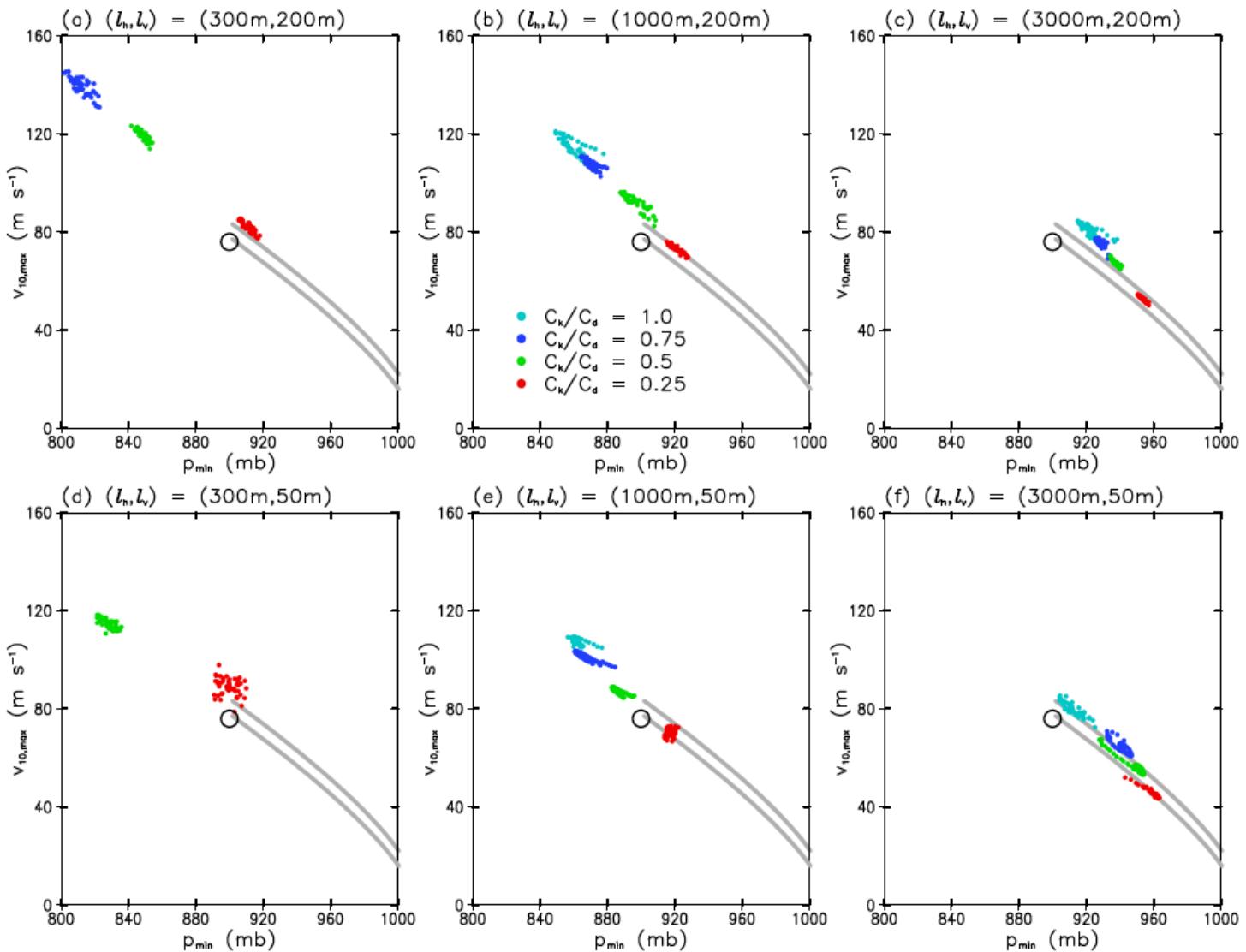


## Wind-pressure relationship: Setup B ( $T_s = 29^\circ\text{C}$ )

upper curve:  
small storms

lower curve:  
large storms

circle:  
max intensity

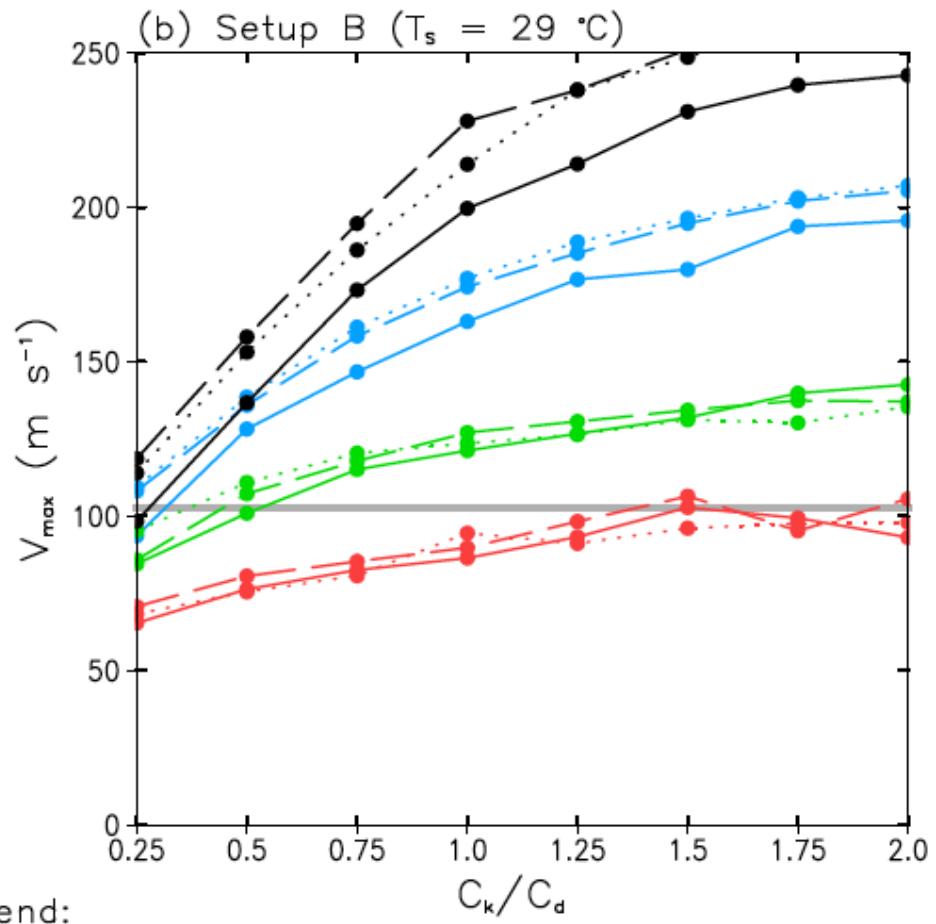
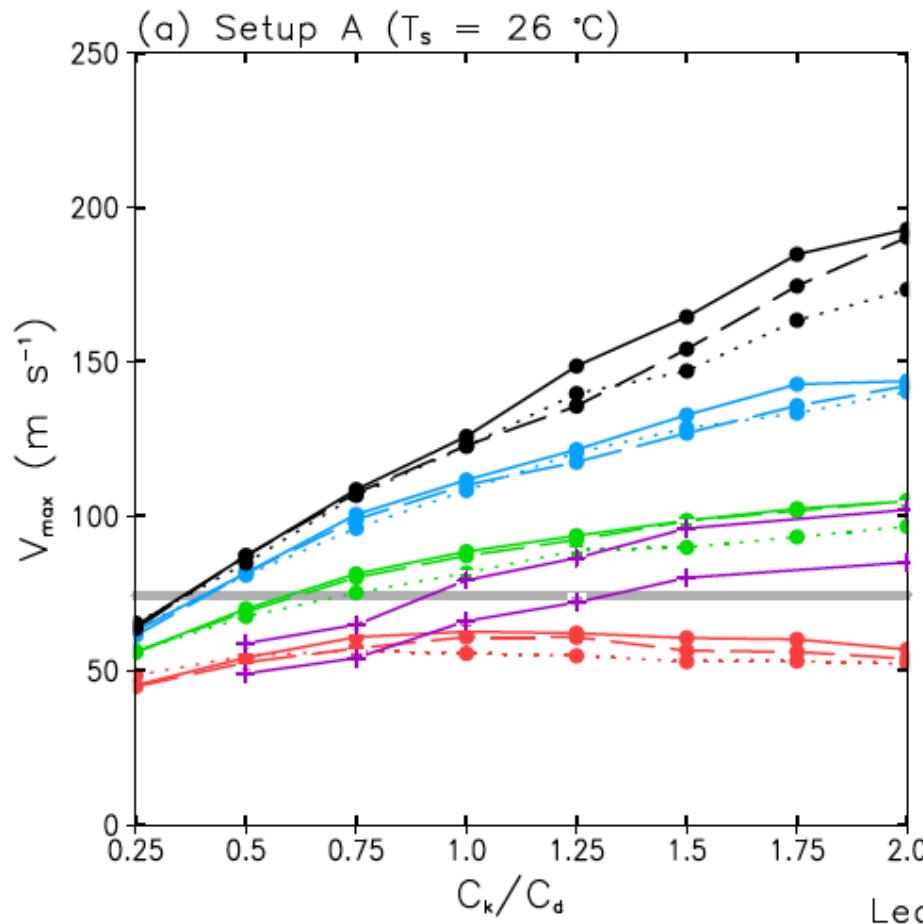


## A similar study by Emanuel (1995)

- Concluded that  $C_k/C_d$  is most likely 1.2-1.5 in intense storms
- “In no event are the results from either [numerical] model consistent with values of  $C_k/C_d$  less than about three-fourths; otherwise, the wind speeds would be much weaker than observed.”

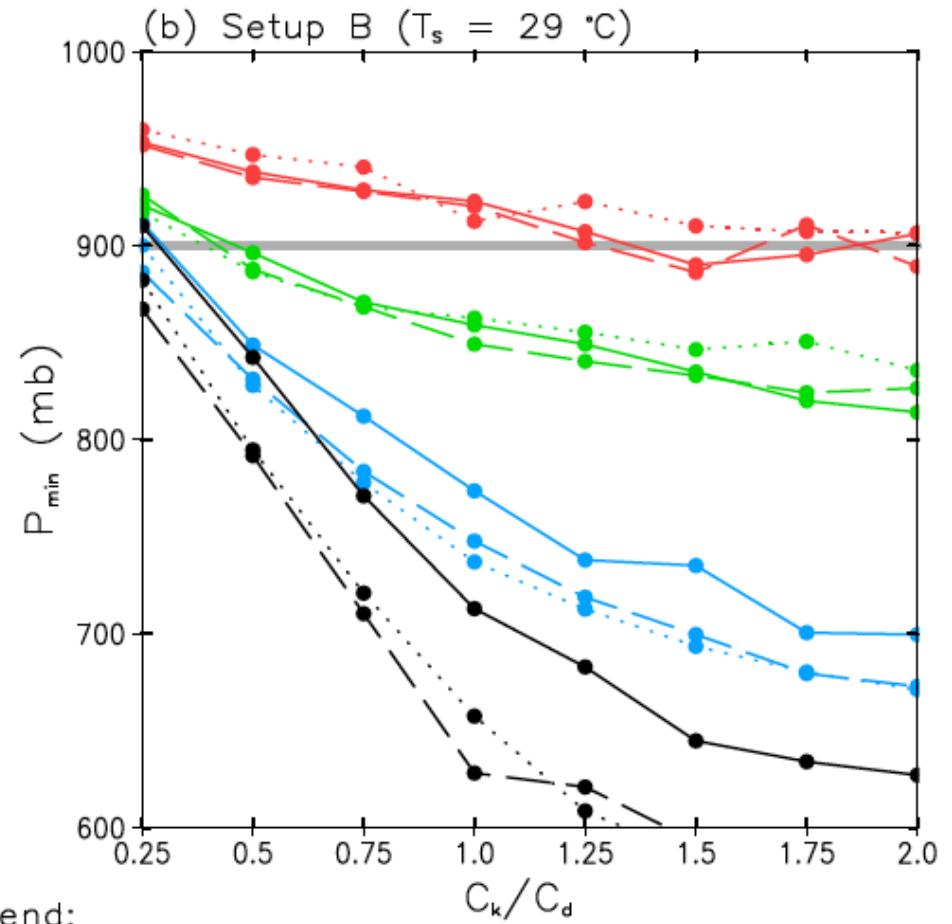
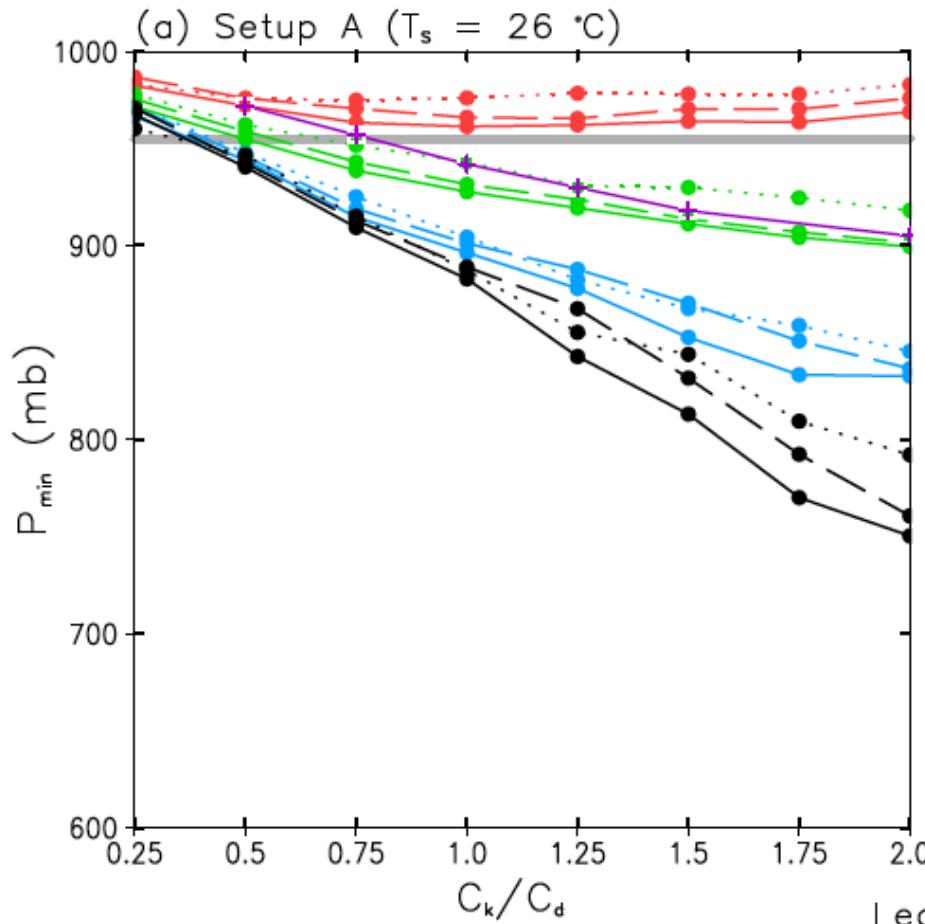
## Maximum tangential windspeed (note: *above surface*)

---> Horizontal gray line: observed  $V_{\max}$  (see Bryan 2011 for details)



## Minimum Surface Pressure

---> Horizontal gray line: observed  $P_{\min}$

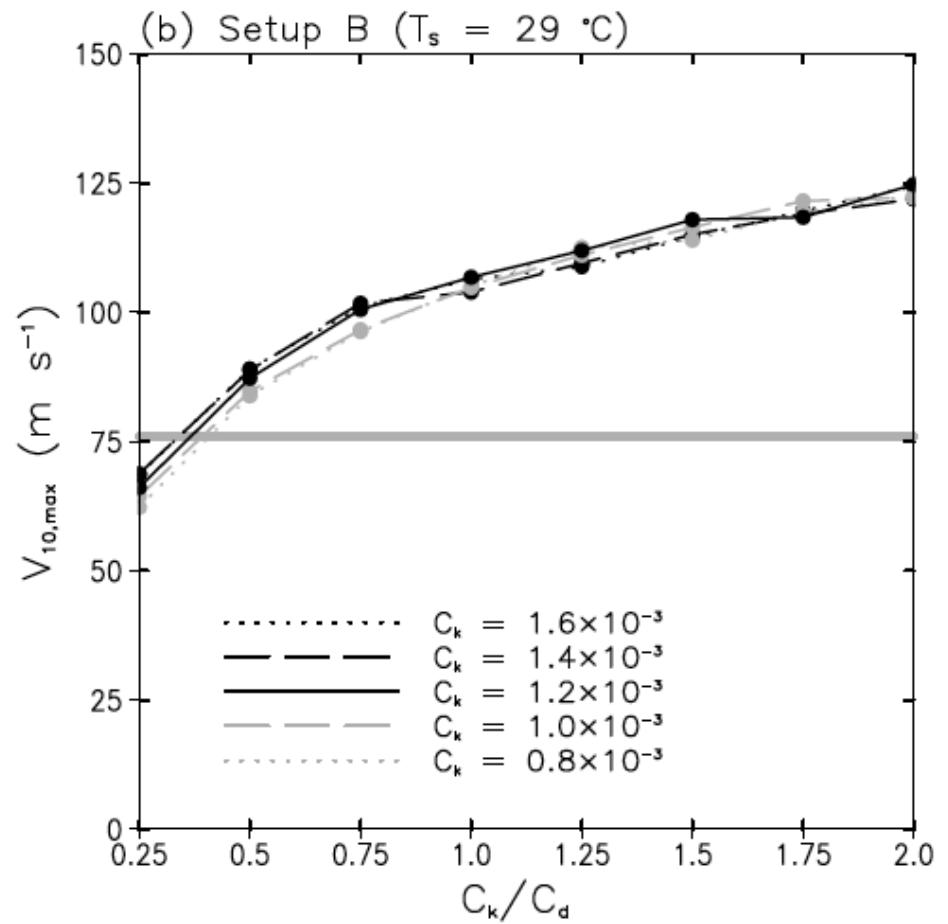
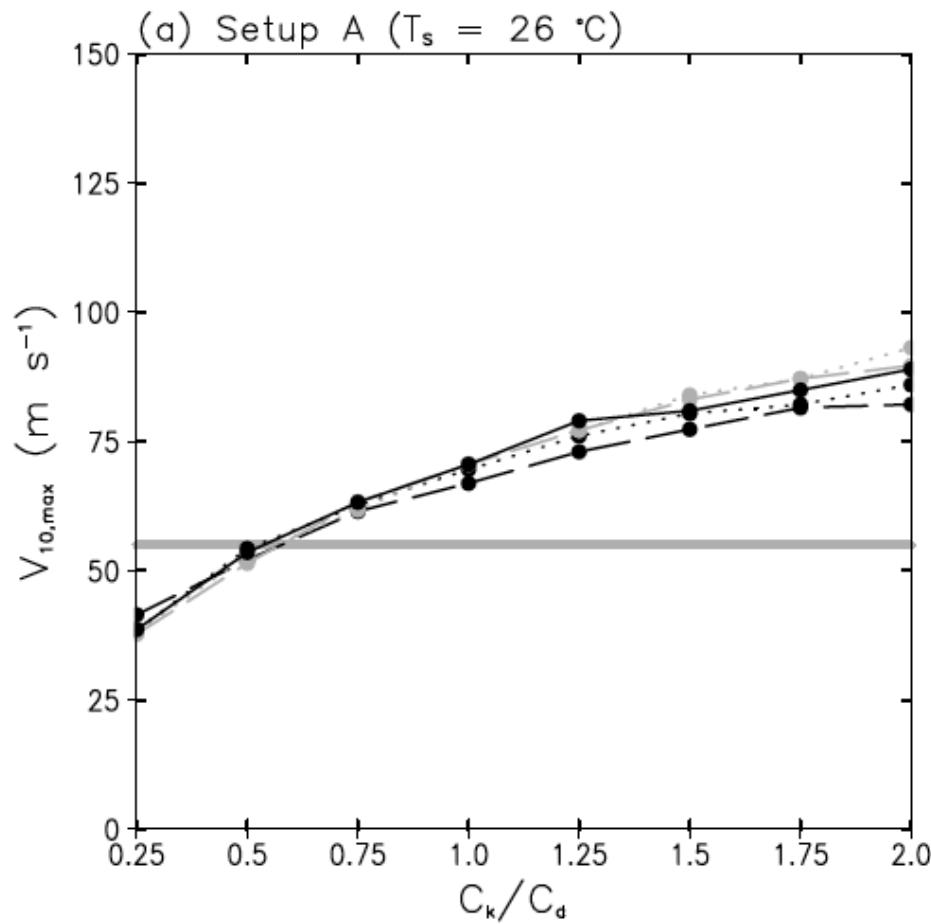


solid:  $l_v = 200 \text{ m}$   
 dashed:  $l_v = 100 \text{ m}$   
 dotted:  $l_v = 50 \text{ m}$

black:  $l_h = 0 \text{ m}$   
 blue:  $l_h = 300 \text{ m}$   
 green:  $l_h = 1000 \text{ m}$   
 red:  $l_h = 3000 \text{ m}$   
 purple: E95

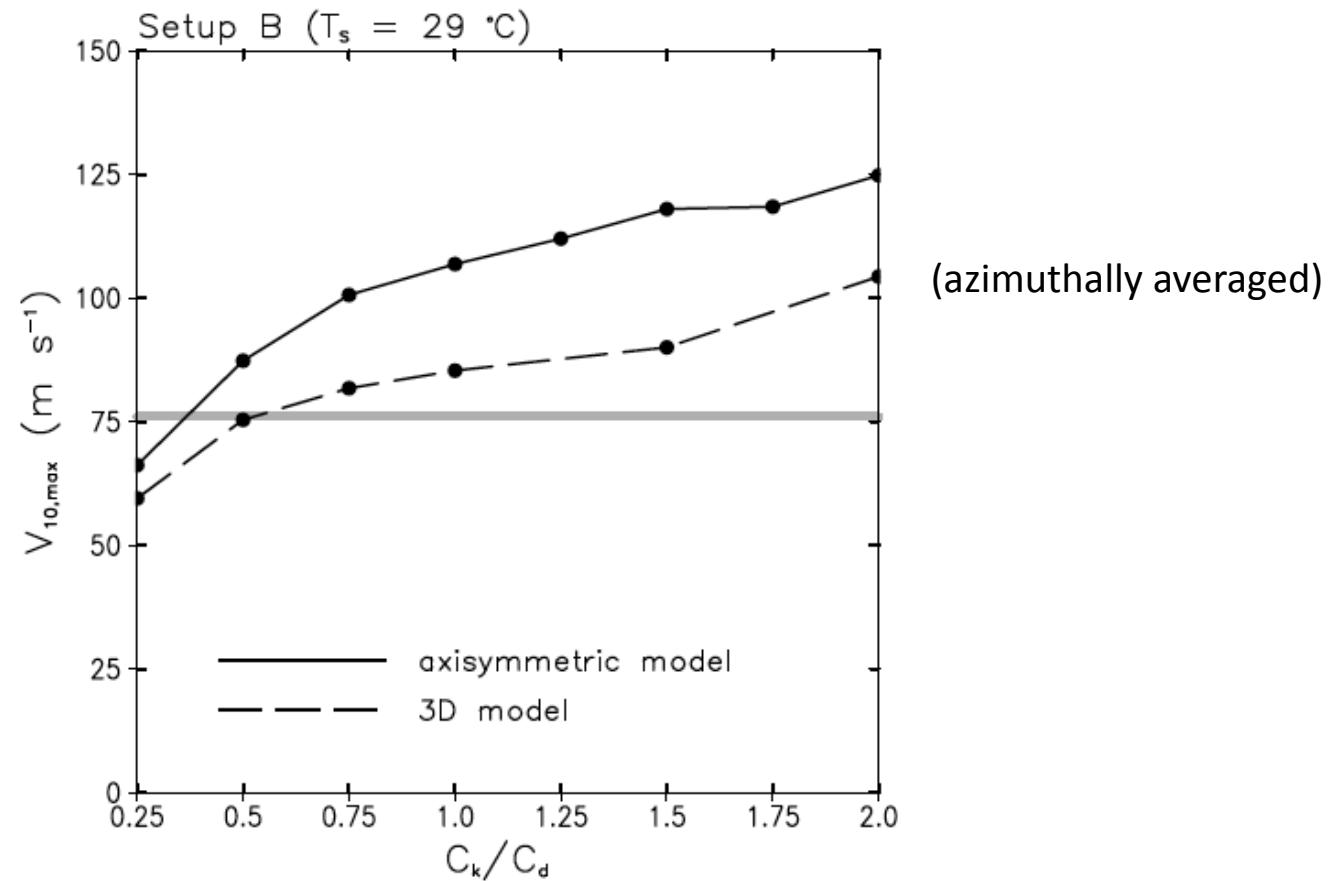
## Results using different $C_k$

(here, showing only simulations with  $l_h = 1000\text{m}$  and  $l_v = 50\text{m}$ )



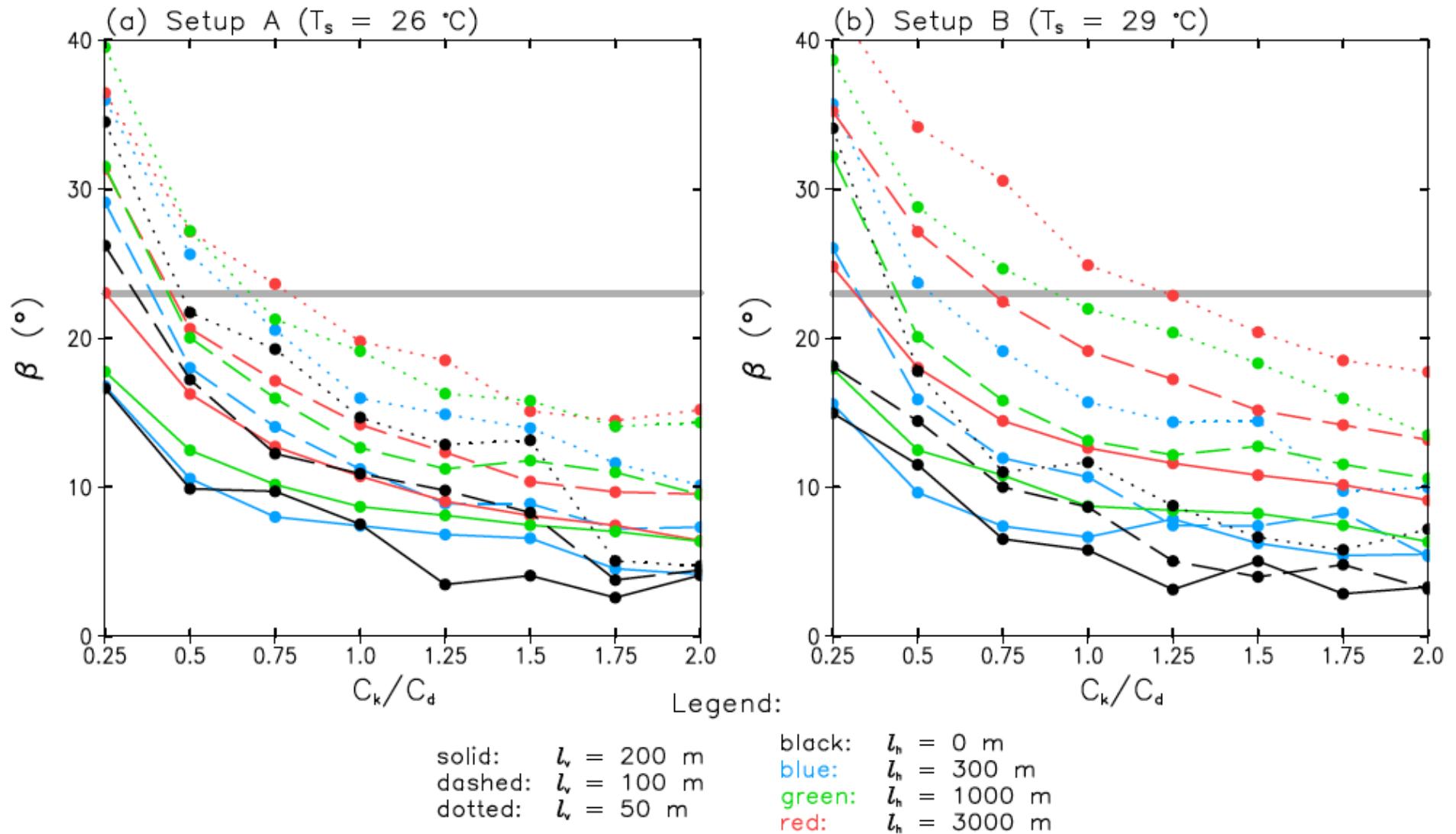
## Comparison of axisymmetric model and 3D model

(here, showing only simulations with  $l_h = 1000\text{m}$  and  $l_v = 50\text{m}$ )



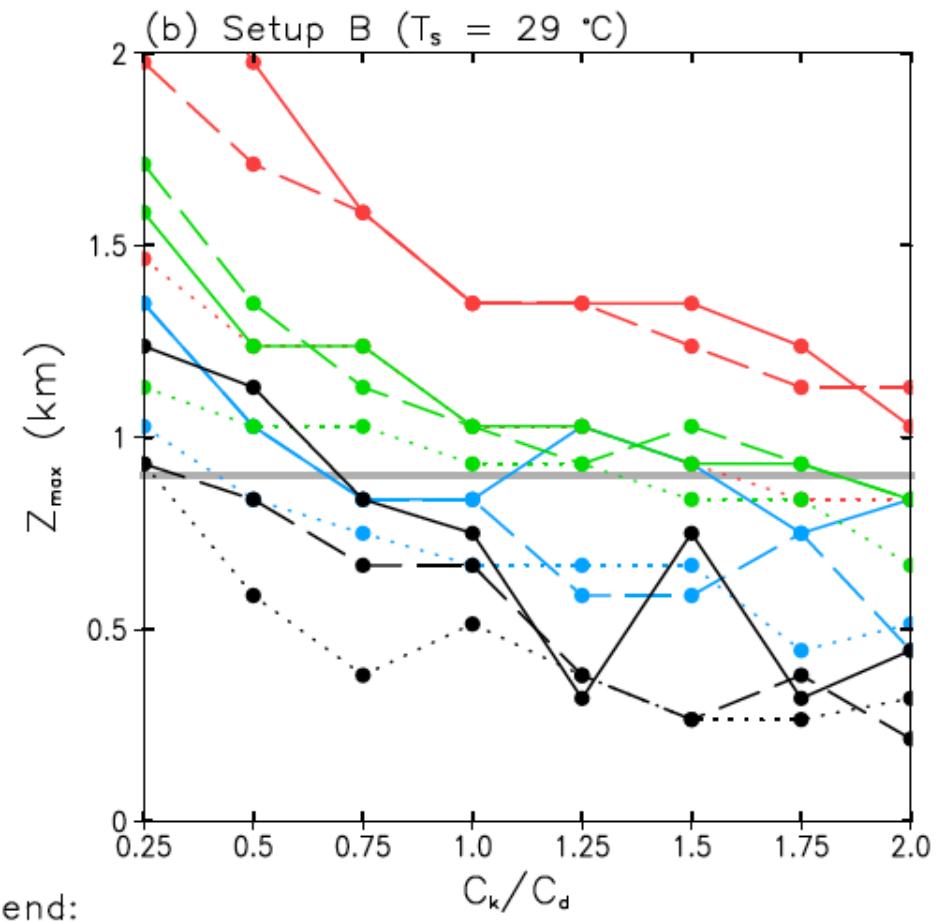
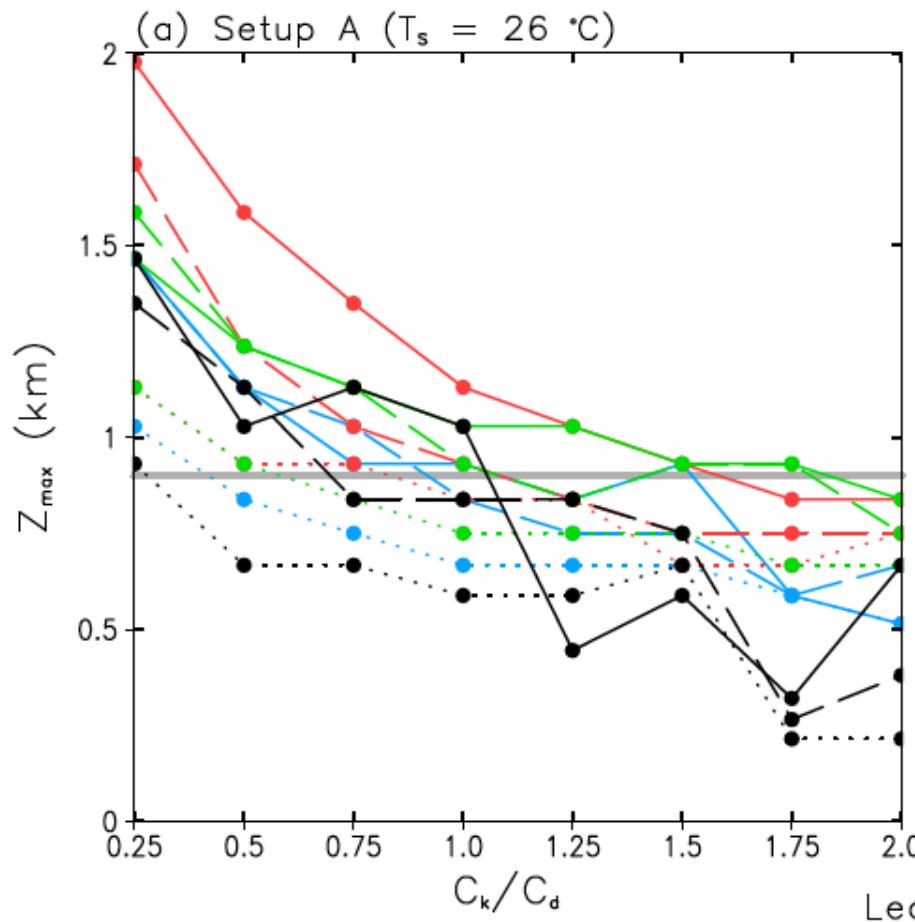
## Surface (10-m) inflow angle

----> Horizontal gray line: average value from dropsonde observations (Powell et al 2009)



## Height of $V_{\max}$

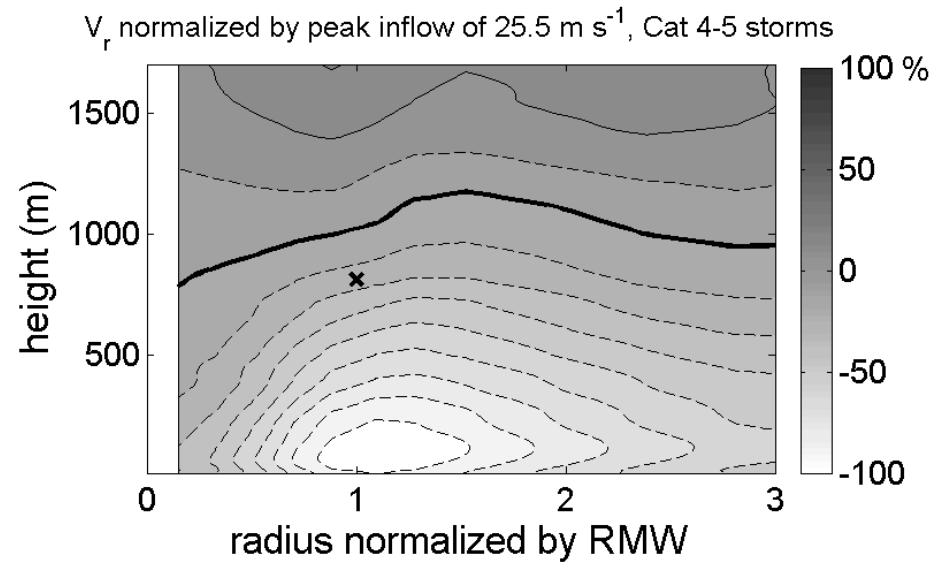
---> Horizontal gray line: value from composite analysis of dropsonde data (Zhang et al 2011)



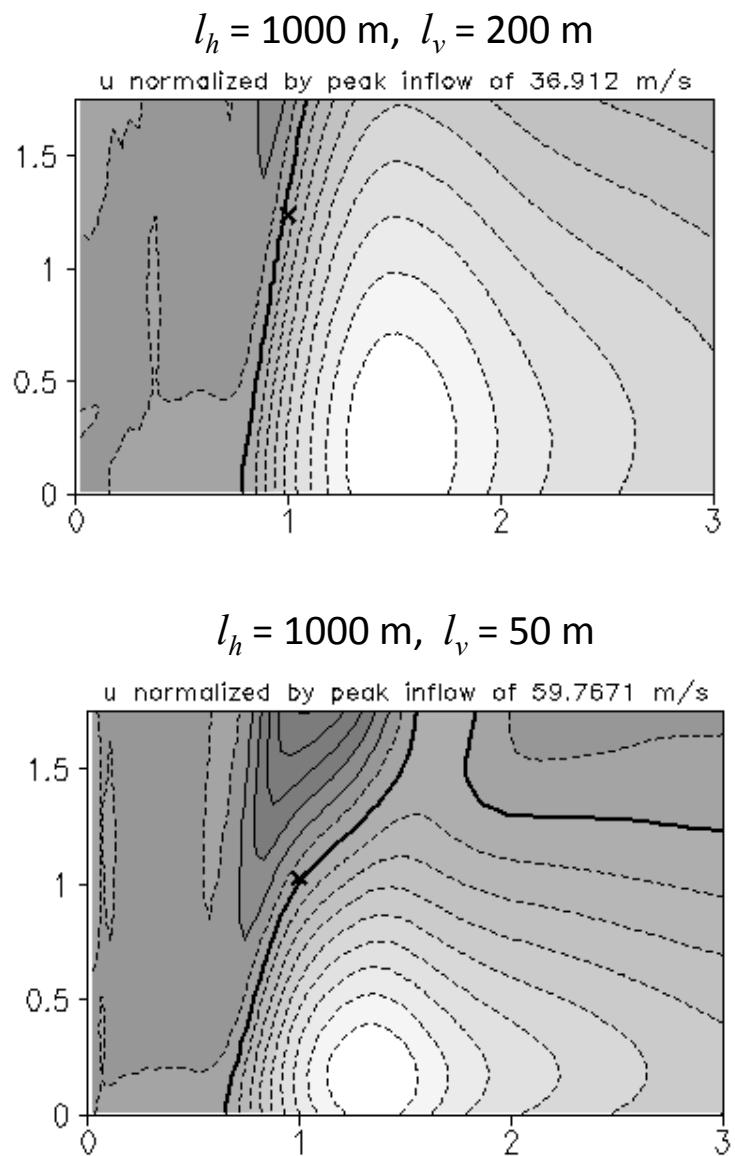
Legend:

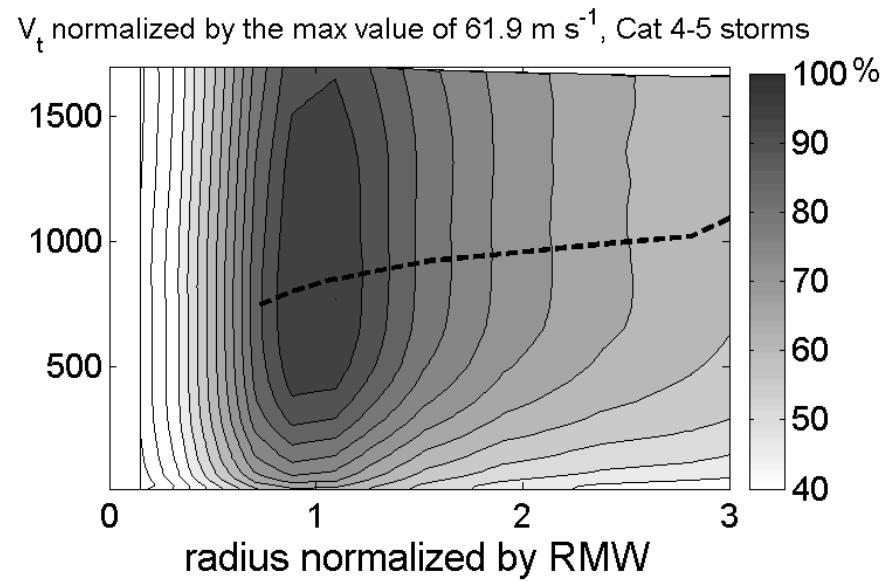
solid:  $l_v = 200 \text{ m}$   
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 dotted:  $l_v = 50 \text{ m}$

black:  $l_h = 0 \text{ m}$   
 blue:  $l_h = 300 \text{ m}$   
 green:  $l_h = 1000 \text{ m}$   
 red:  $l_h = 3000 \text{ m}$

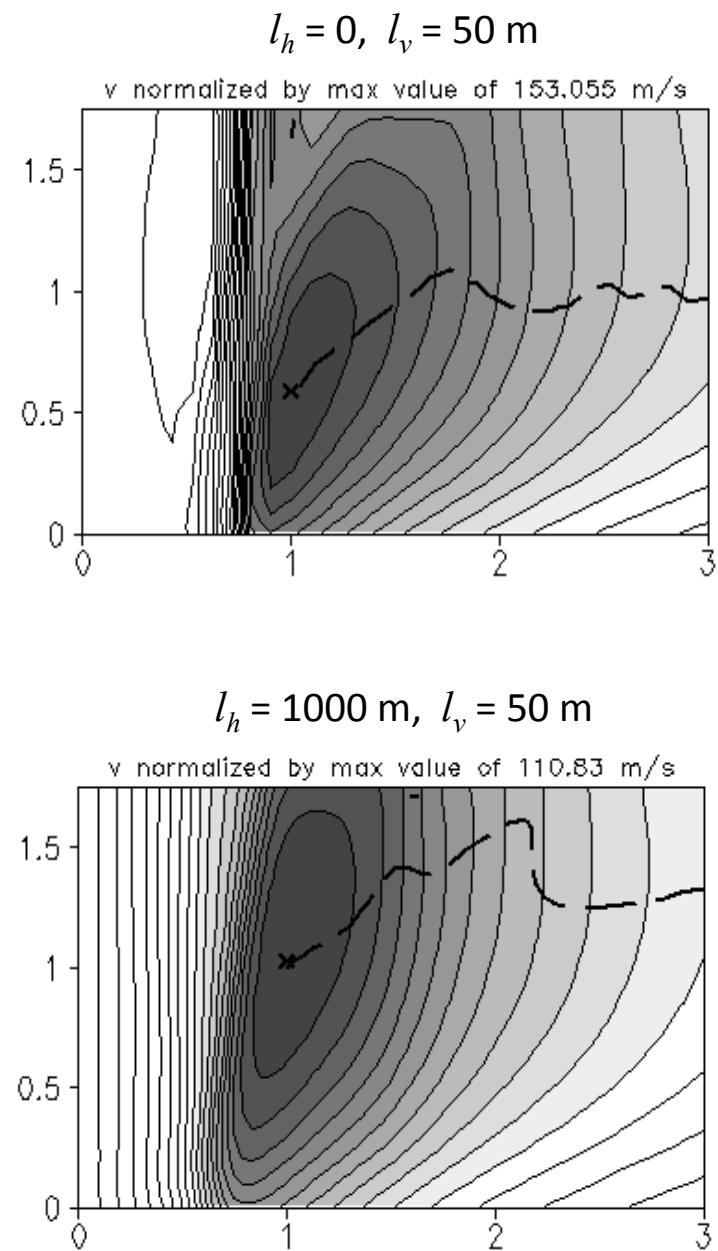


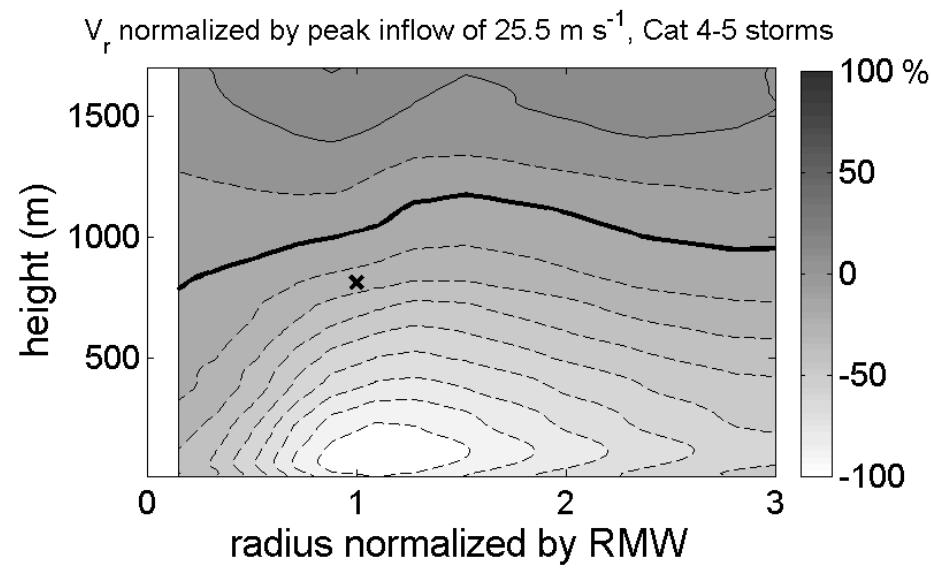
Zhang et al (2011)



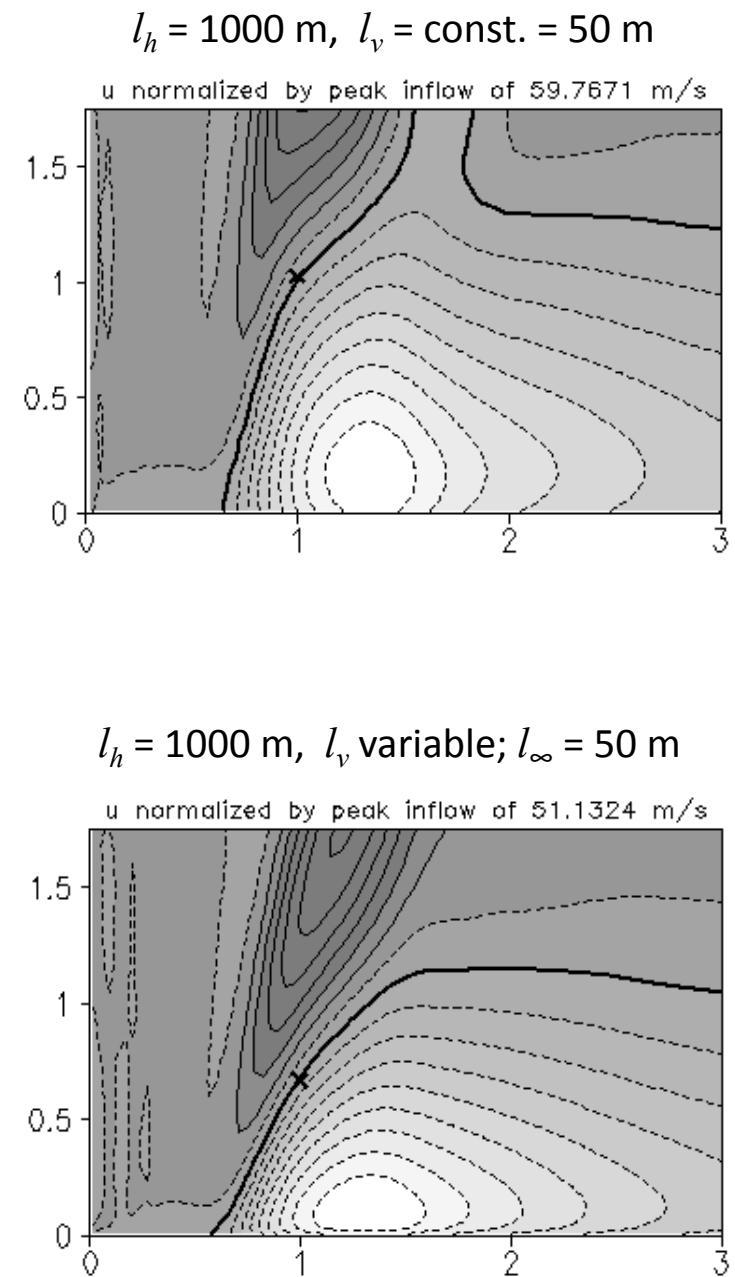


Zhang et al (2011)





Zhang et al (2011)



- Summary: Settings for Category 4-5 storms:
  - $l_h \approx 1000$  m (although, axisymmetric models need larger  $l_h$ )
  - $l_v \approx 50$  m (variable  $l_v(z)$  produces better structure than constant  $l_v$ )
  - $C_k/C_d \approx 0.5$
- Other aspects of simulations not show:
  - Air-sea temperature difference varies with  $V_{max}$  (settings above give 2.5-3.5 °C)
  - Storm size: RMW varies with  $l_h$   
Radius of gale-force winds varies with  $C_k/C_d$
  - Dynamics/theory: gradient-wind imbalance (overshoot) increases as  $C_k/C_d$  decreases (E86 theory works ok as long as  $C_k/C_d > 1.5$ )