

High-Resolution Dual-Doppler Analysis of Tornadic  
Thunderstorms using a New Advection-Correction Technique

Presented by Katherine Willingham

# Motivation

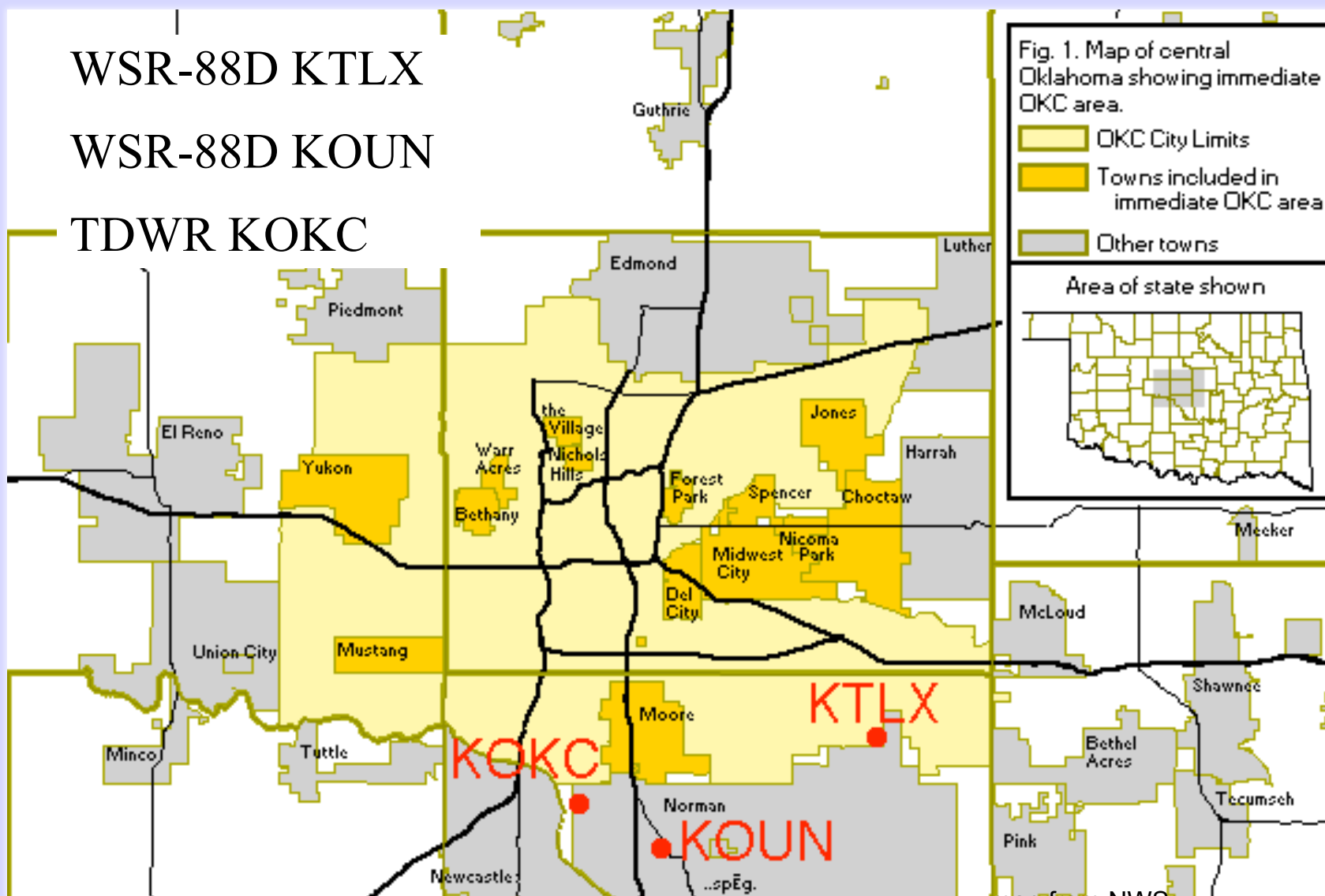
- Verify and complement results of the Neuro-Fuzzy Tornado Detection Algorithm (NFTDA)(Wang et al. 2008)
  - Compare dual-Doppler analysis with NFTDA detections and damage path
- Test a new formulation for advection-correction of radar data
  - Used for small scale features such as mesocyclones and tornadoes
- Compare dual-Doppler results with conceptual models of tornado and mesocyclone structures

# Map of Radar Locations

WSR-88D KTLX

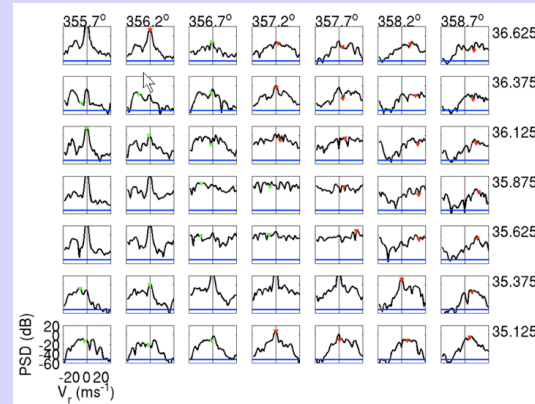
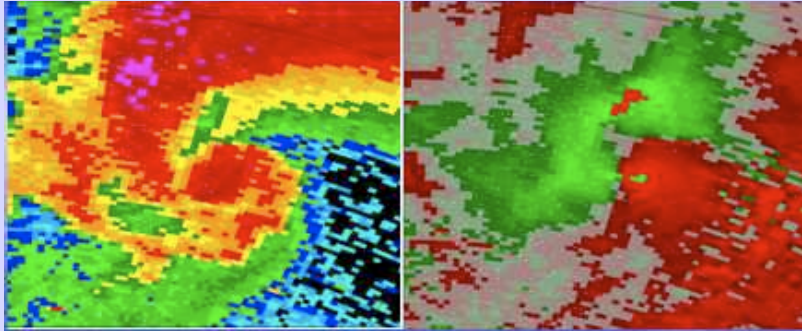
WSR-88D KOUN

TDWR KOKC



# What is the NFTDA?

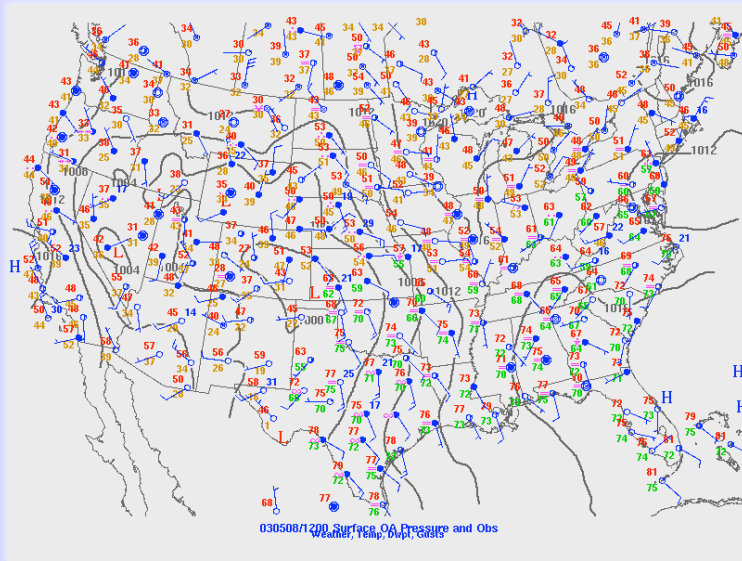
- The algorithm integrates tornadic signatures in both the velocity and spectral domains



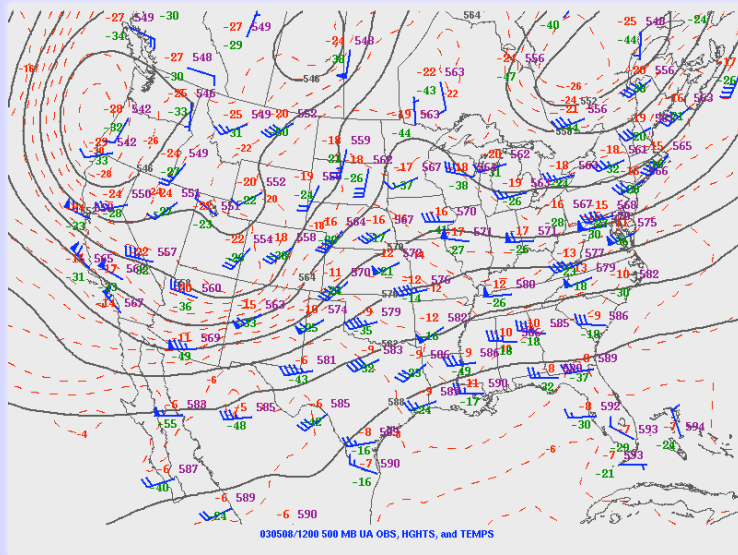
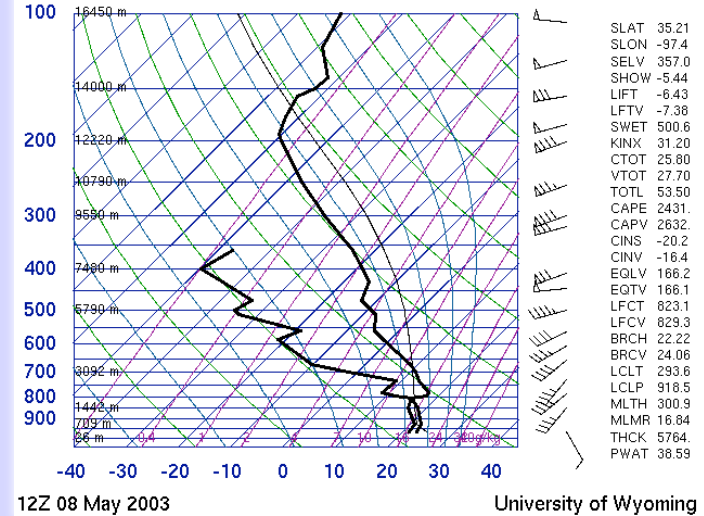
- Verification done by using analytical simulations as well as real data collected by KOUN for two tornadic cases
  - 8 May 2003
  - 10 May 2003
- The NFTDA detects tornadoes even when shear signatures are degraded significantly
- The NFTDA extends the detectable range for tornadoes (Wang et al. submitted)



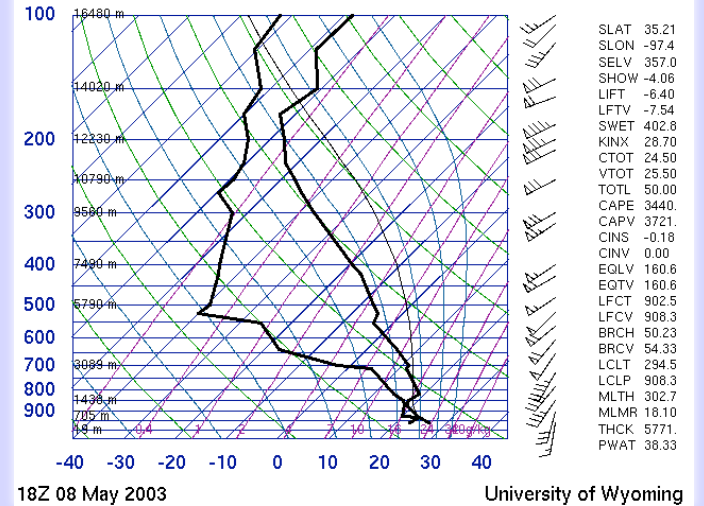
# 8 May 2003 Overview



72357 OUN Norman



72357 OUN Norman



figures: SPC

# 8 May 2003 Tornado Path

- Tornado first reported in Moore, traveled through south OKC, across I-240 and Sooner Rd, across TAFB, across I-40 into SE Midwest City and into Choctaw
- Widespread F3 damage and small areas of F4 damage
- Maximum width 4/10 mi

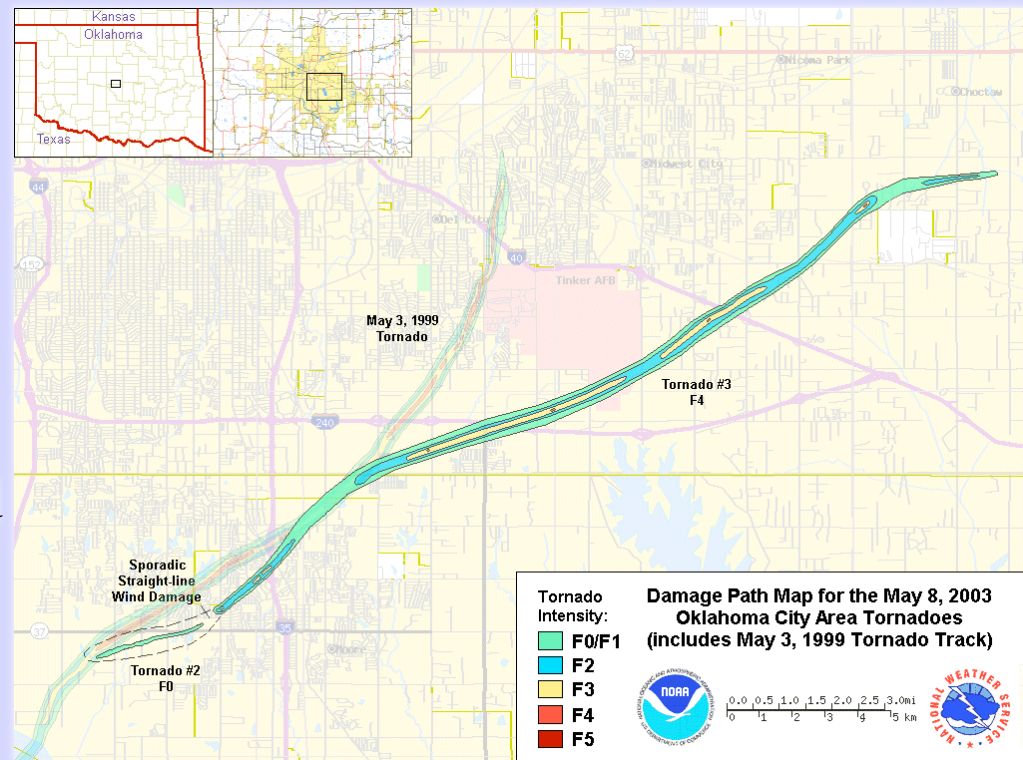
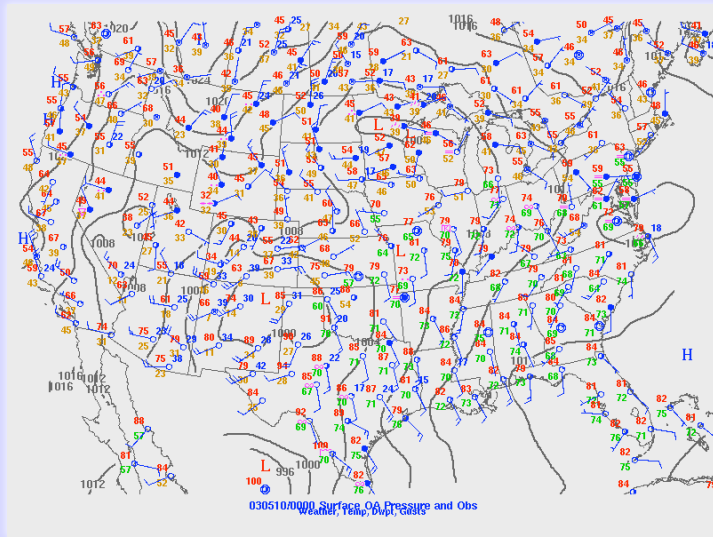
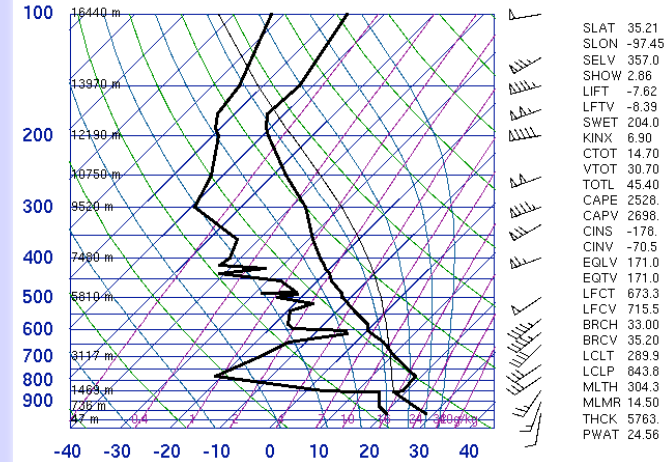


figure from NWS

# 10 May 2003 Overview

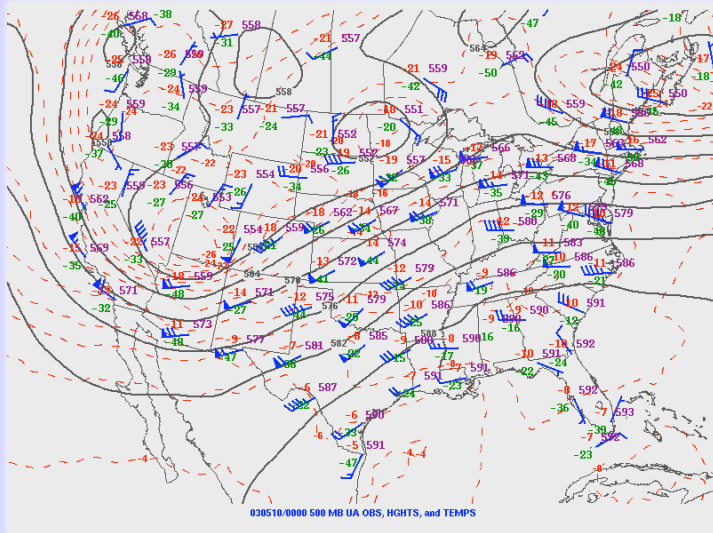


72357 OUN Norman

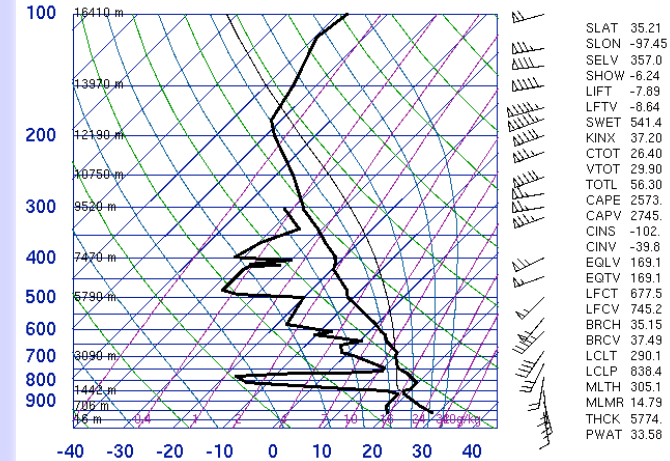


18Z 09 May 2003

University of Wyoming



72357 OUN Norman

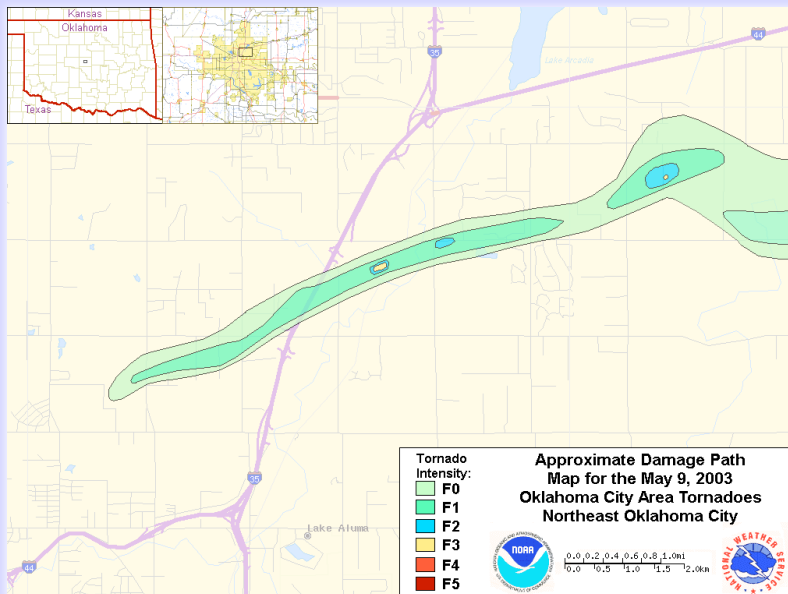


00Z 10 May 2003

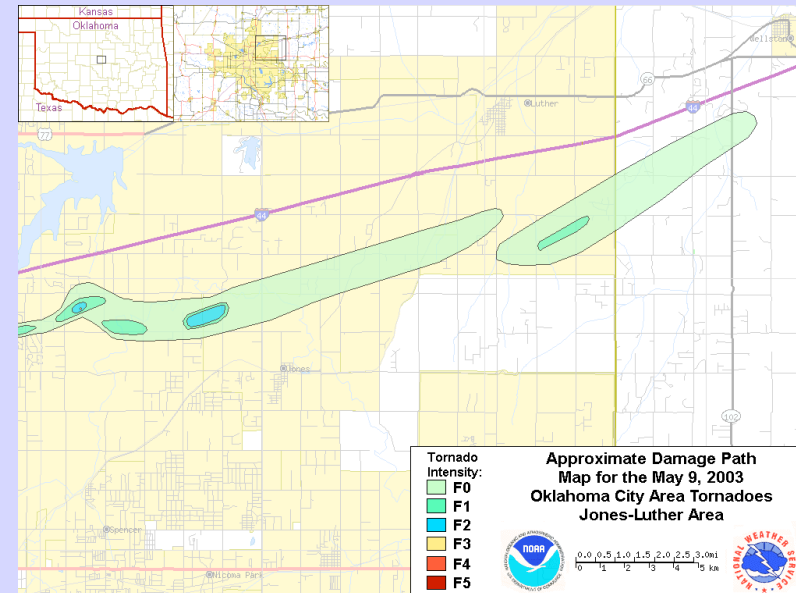
University of Wyoming

figures: SPC

# 10 May 2003 Tornado Path



figures from NWS



- Widespread F2 damage with a small area of F3 damage.
- Maximum width 1/2 mi



# Data Processing

- Data was edited for quality and dealiasing was completed.
- A Cressman interpolation was used for coordinate transformation.
- A range dependent radius of influence  $n$  was used:

	WSR-88D data	TDWR data
Azimuthal Component	$0.9^\circ$	$0.9^\circ$
Elevation Component	$0.9^\circ$	$2.6^\circ$
Range Component	$r*dA$	$r*dA$

- The weight  $W$  for a particular gate value is calculated from

$$W = \frac{n^2 - r^2}{n^2 + r^2},$$

where  $n$  is the radius of influence and  $r$  is the range from the radar.

# Analysis Grid and Data

8 May 2003

- $\delta x = \delta y = 250\text{m}$
- $\delta z = 500\text{m}$
- Radars used:
  - KOKC and KTLX
- Time analyzed:
  - 22:26 - 22:43 UTC

10 May 2003

- $\delta x = \delta y = 250\text{m}$
- $\delta z = 500\text{m}$
- Radars used:
  - KTLX and KOUN
- Time analyzed:
  - 03:19 - 03:43 UTC

# Patterns on the Go

Two types of unsteadiness:

Propagation. Pattern of unchanging for translates horizontally.

Evolution. Pattern changes in size, shape or intensity.

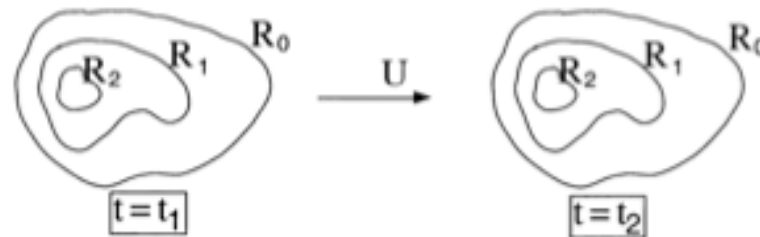
- Temporal-resolution-sensitive analysis products are prone to errors if the flow is sufficiently unsteady (flow time scales  $\leq$  volume scan period).
- Examples of volume scan periods:
  - WSR-88D: 10 min clear air mode, 4-6 min precip mode
  - TDWR: 6 min, but 1 min for lowest tilt
  - Research radars (DOW, SMART-R, CASA, NWRT):  $<1$  min



# Mitigating Temporal Errors

- Dual-Doppler wind analysis is a temporal-resolution-sensitive analysis product
- Advection-correction is used to mitigate propagation error
- Traditional methods use the frozen-turbulence hypothesis.

## Frozen-turbulence hypothesis



For  $R$ :  $\frac{DR}{Dt} = 0$ , or equivalently  $\frac{\partial R}{\partial t} + U\frac{\partial R}{\partial x} + V\frac{\partial R}{\partial y} = 0$ .

For  $\vec{v}$ :  $\frac{D\vec{v}}{Dt} = 0$ , or equivalently  $\frac{\partial \vec{v}}{\partial t} + U\frac{\partial \vec{v}}{\partial x} + V\frac{\partial \vec{v}}{\partial y} = 0$ .

For  $v_r$ :  $\frac{D^2(rv_r)}{Dt^2} = 0$ , or equivalently  $\left(\frac{\partial}{\partial t} + U\frac{\partial}{\partial x} + V\frac{\partial}{\partial y}\right)^2 (rv_r) = 0$ .

# A New Formulation of Advection-Correction

(Shapiro et al. submitted)

**Goal:** Improve analysis of small scale features embedded within (and advected by) larger-scale features.

**Idea:** Spatially-variable  $U, V$  may improve analyses of tornadoes and other small/mesoscale phenomena

**Method:** Apply a weak frozen-turbulence constraint on  $R$  with  $R$ -data supplied at two time levels. Determine  $U, V$  and advection corrected  $R$ , then use  $U, V$  to advection correct  $v_r$

# A New Formulation of Advection-Correction

(Shapiro et al. submitted)

- $U, V, R$  are the fields that minimize a cost-function  $J_i$ , defined for the  $i^{\text{th}}$  analysis surface as

$$J_i \equiv \iiint \left[ \alpha \left( \frac{\partial R}{\partial t} + U \frac{\partial R}{\partial x} + V \frac{\partial R}{\partial y} \right)^2 + \beta |\nabla_h U|^2 + \beta |\nabla_h V|^2 \right] dx dy dt$$

with  $R$  imposed at two effective data times,  $t=t_1$  and  $t=t_1 + T$

- $\alpha$  is a binary analysis coverage footprint function imposed with a strong constraint

$$\frac{\partial \alpha}{\partial t} + U \frac{\partial \alpha}{\partial x} + V \frac{\partial \alpha}{\partial y} = 0$$

- There must be data at both the start and end times for a trajectory to be calculated
  - $\alpha$  depends on the topology of data voids

# A New Formulation of Advection-Correction

(Shapiro et al. submitted)

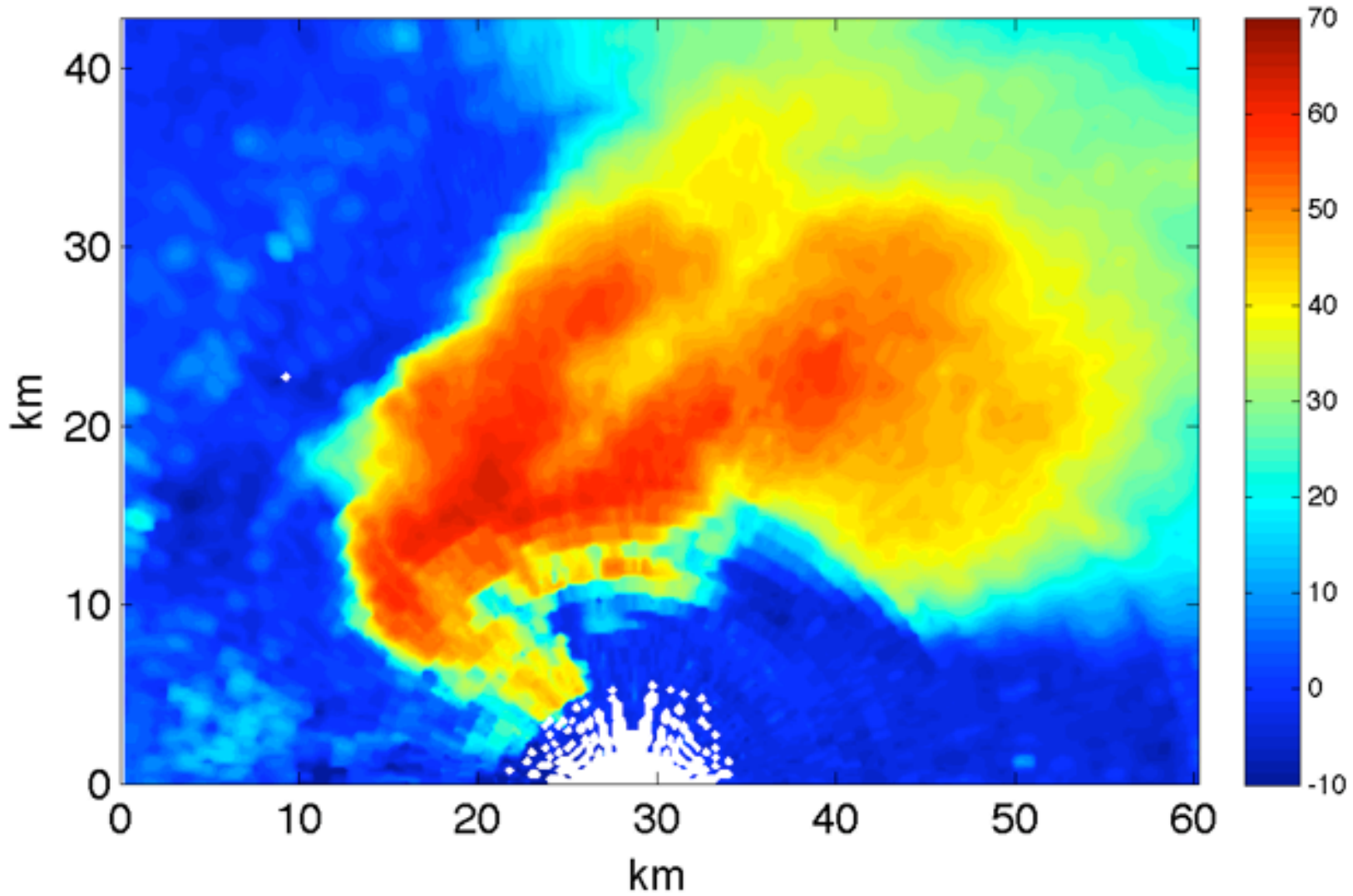
- Set  $\delta J=0$ , integrate by parts. Leads to Euler-Lagrange equations for U,V and R:

$$\frac{\partial^2 U}{\partial x^2} + \frac{\partial^2 U}{\partial y^2} - \frac{\alpha}{\beta T} \left[ \int \frac{\partial R}{\partial t} \frac{\partial R}{\partial x} dt + U \int \left( \frac{\partial R}{\partial x} \right)^2 dt + V \int \frac{\partial R}{\partial x} \frac{\partial R}{\partial y} dt \right] = 0$$

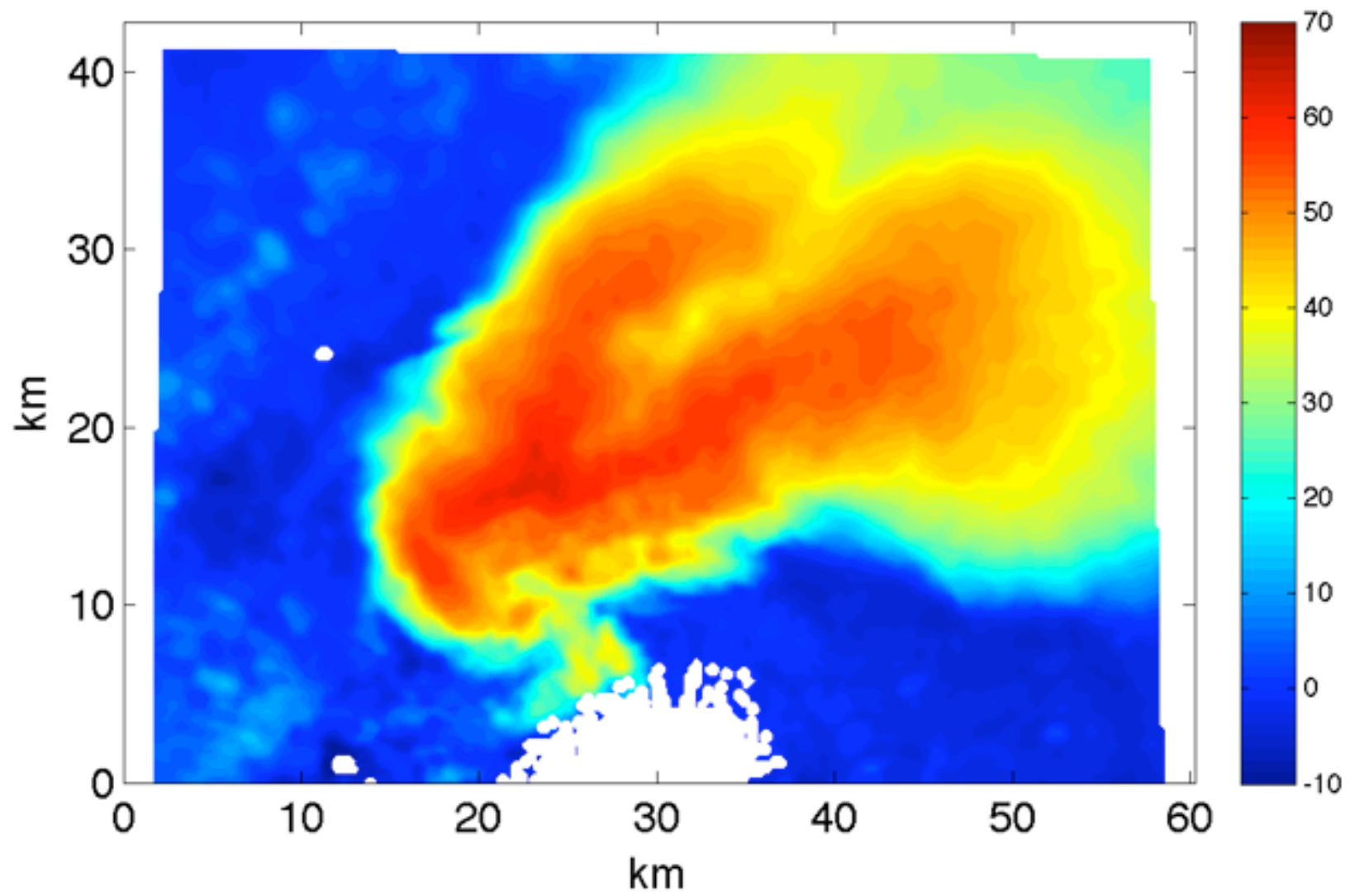
$$\frac{\partial^2 V}{\partial x^2} + \frac{\partial^2 V}{\partial y^2} - \frac{\alpha}{\beta T} \left[ \int \frac{\partial R}{\partial t} \frac{\partial R}{\partial y} dt + U \int \frac{\partial R}{\partial x} \frac{\partial R}{\partial y} dt + V \int \left( \frac{\partial R}{\partial y} \right)^2 dt \right] = 0$$

$$\alpha \left( \frac{\partial}{\partial t} + U \frac{\partial}{\partial x} + V \frac{\partial}{\partial y} \right)^2 R + \alpha \left( \frac{\partial U}{\partial x} + \frac{\partial V}{\partial y} \right) \left( \frac{\partial R}{\partial t} + U \frac{\partial R}{\partial x} + V \frac{\partial R}{\partial y} \right) + \left( \frac{\partial \alpha}{\partial t} + U \frac{\partial \alpha}{\partial x} + V \frac{\partial \alpha}{\partial y} \right) \left( \frac{\partial R}{\partial t} + U \frac{\partial R}{\partial x} + V \frac{\partial R}{\partial y} \right) = 0$$

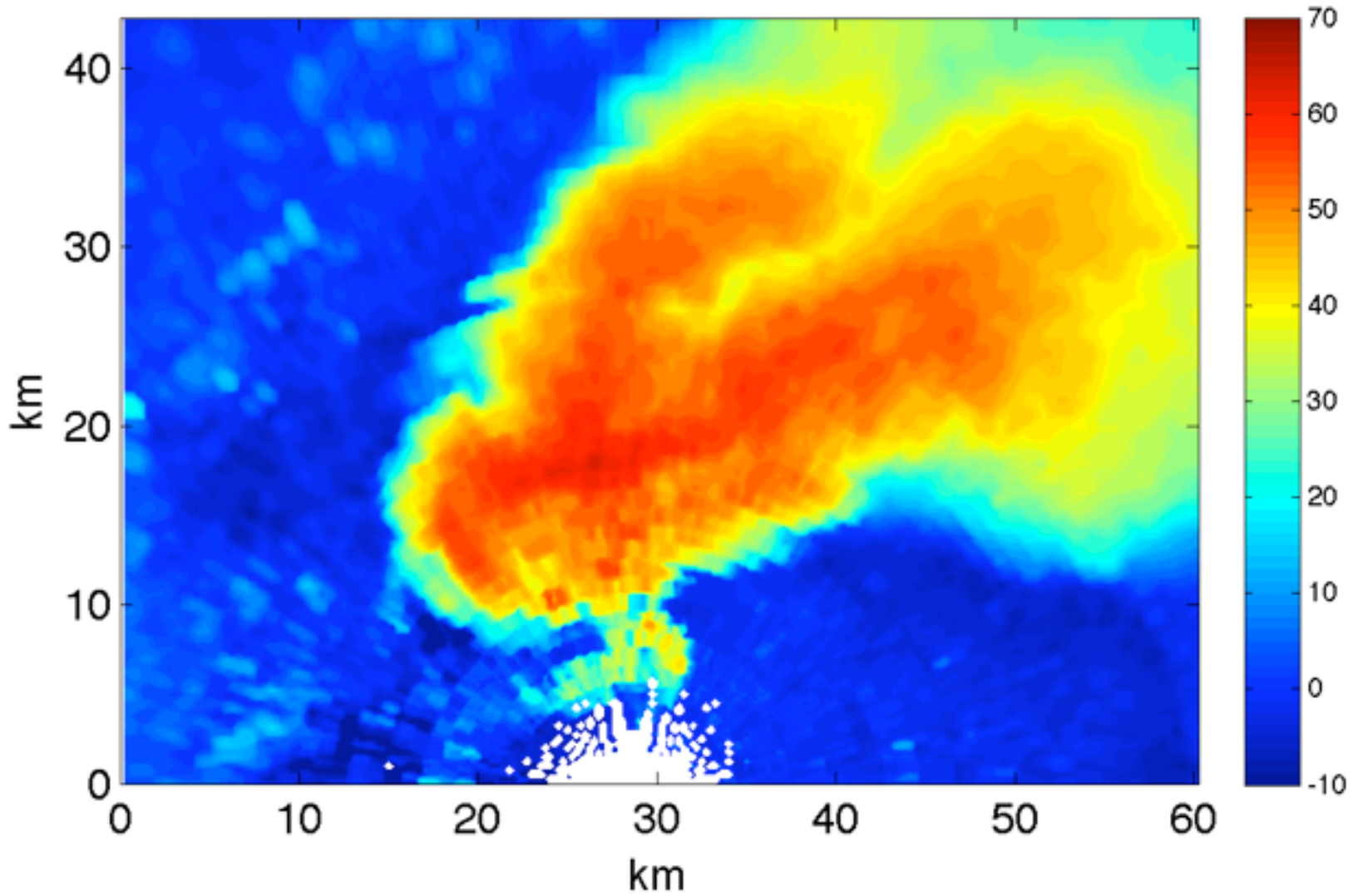
KTLX reflectivity (dBZ) 8 May 2003 22:26:10 UTC 600m AMSL



Advected KTLX reflectivity (dBZ) 22:28:55 UTC 600m AMSL

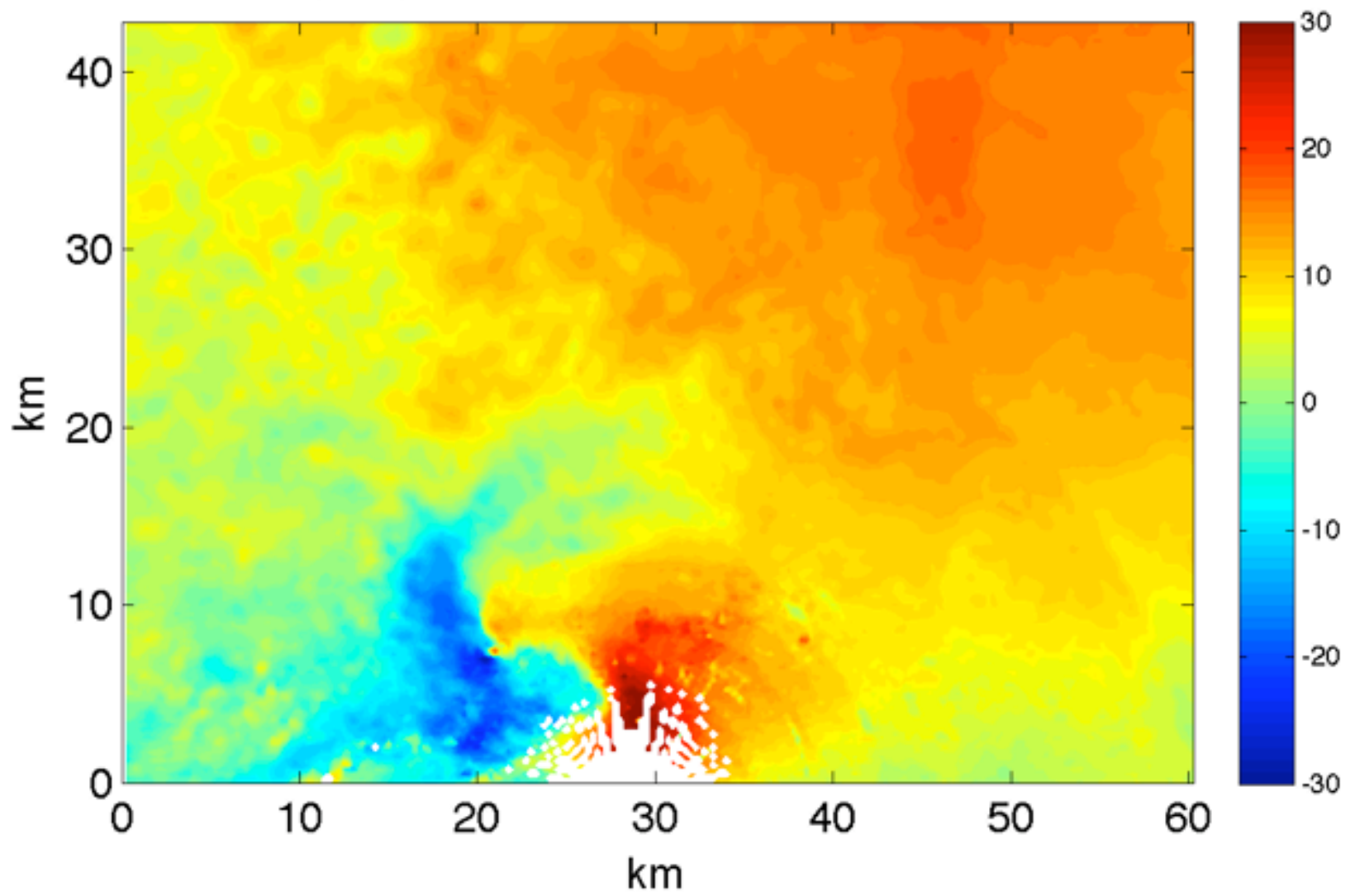


KTLX reflectivity (dBZ) 8 May 2003 22:31:07 UTC 600m AMSL

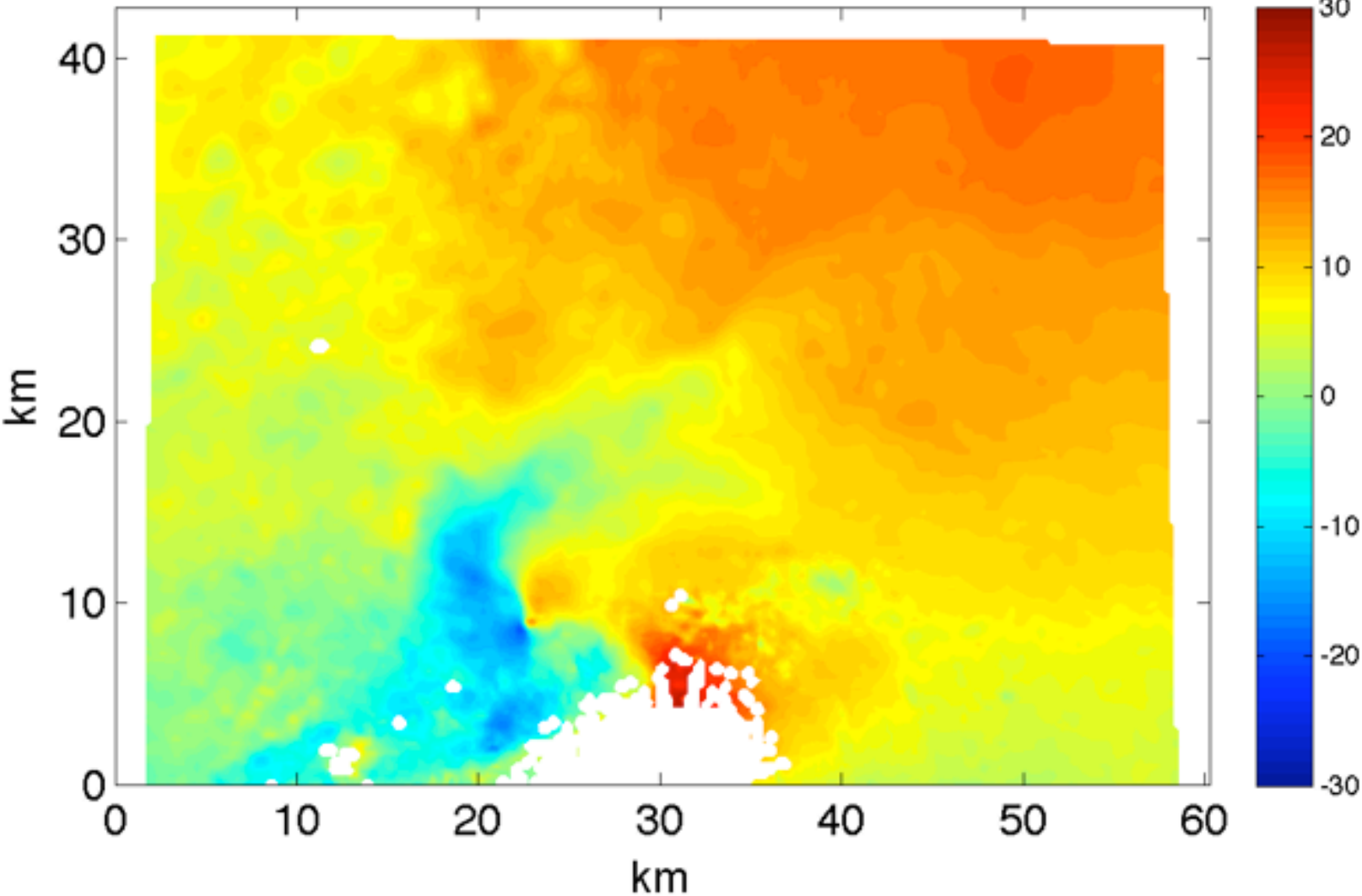




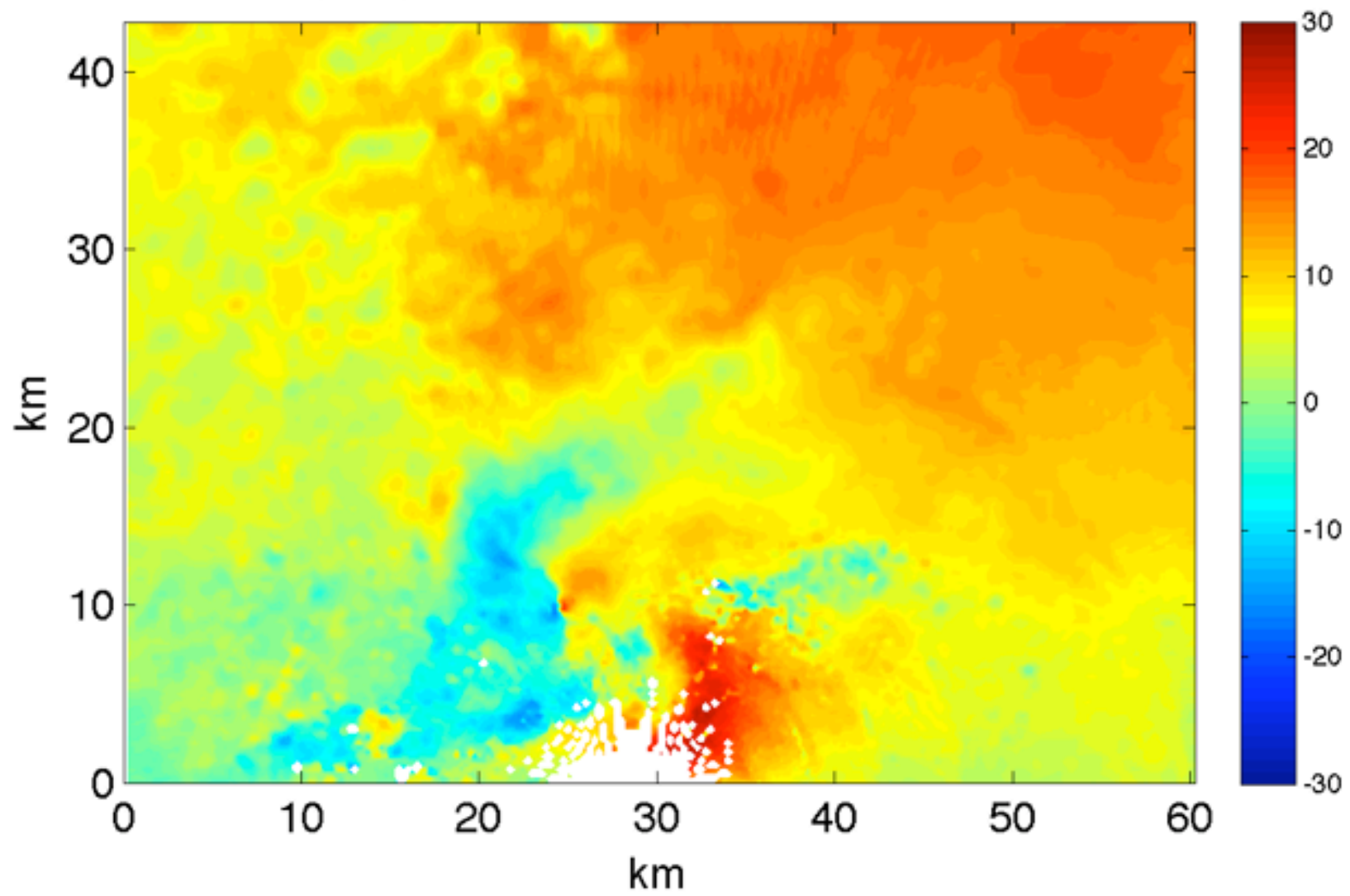
KTLX vr (m/s) 8 May 2003 22:26:10 UTC 600m AMSL



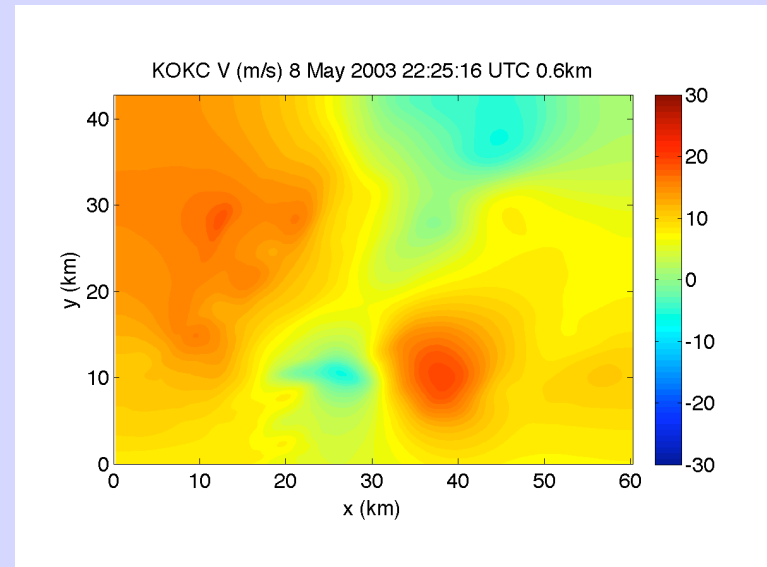
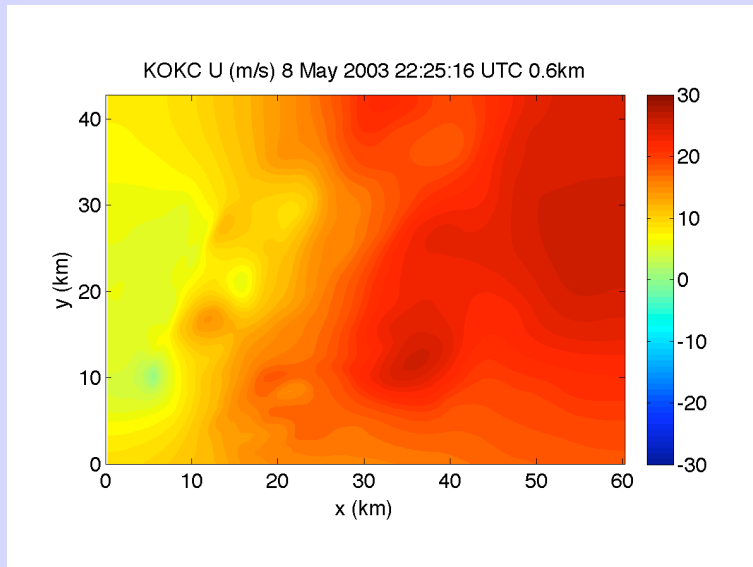
Advected KTLX vr (m/s) 22:28:55 UTC 600m AMSL



KTLX vr (m/s) 8 May 2003 22:31:07 UTC 600m AMSL



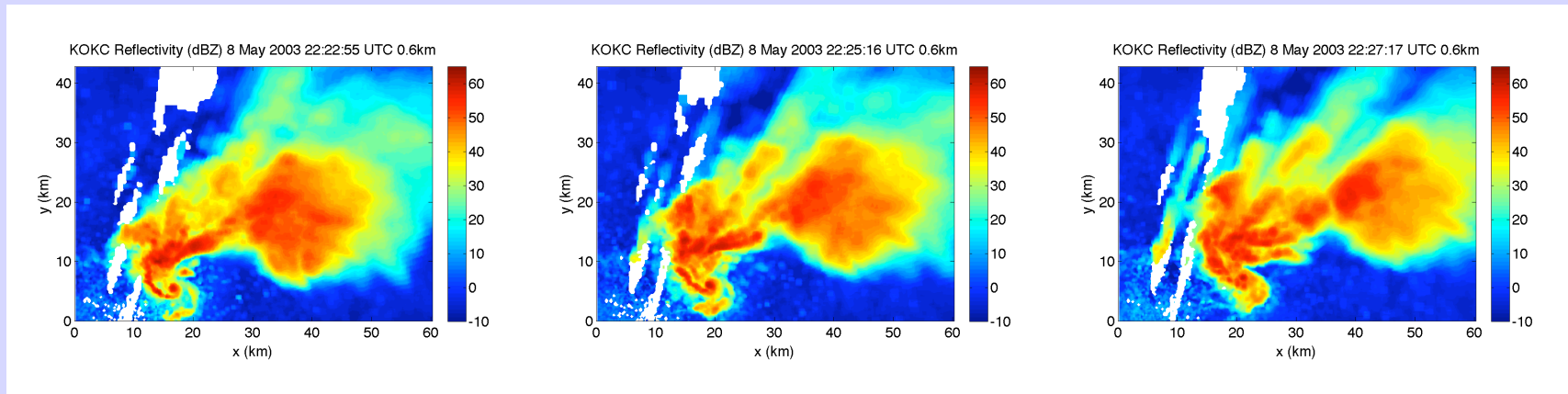
# Advection-Correction Results



Spatially-variable pattern-translation components U,V for the following example scans

- Variability from about -8 to 25 m/s

# Advection-Correction Results

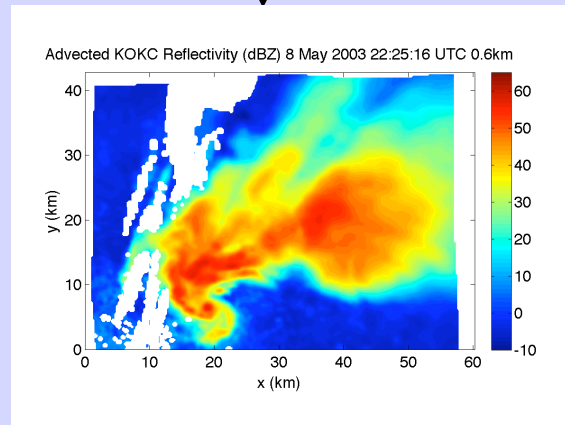


reflectivity 22:22:55

observed 22:25:16

adverted 22:25:16

reflectivity 22:27:17



## Advection Parameters

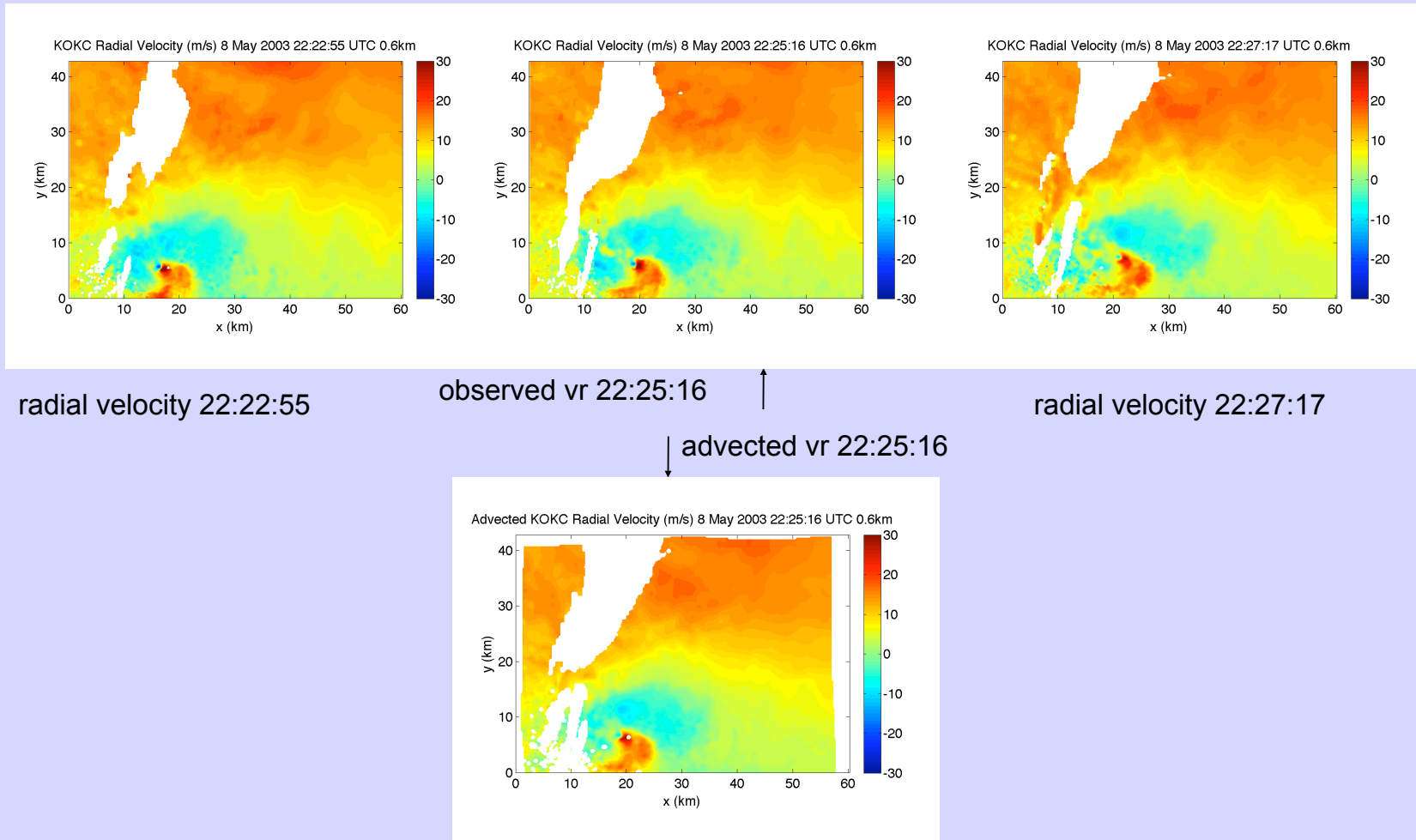
T=262s

TE=141s

nt=16

b=100

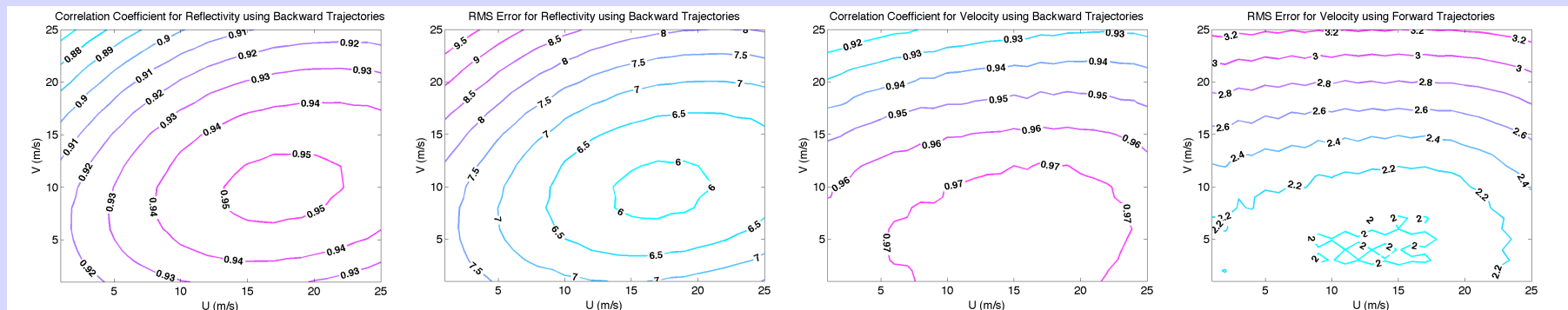
# Advection-Correction Results



# Advection-Correction Results

The advection correction using spatially-variable pattern-translation components for this case is an improvement over any constant pattern-translation.

	Reflectivity Correlation	Radial Velocity Correlation	Reflectivity RMS Error	Radial Velocity RMS Error
Spatially Variable $U, V$	0.9764	0.9839	4.2307	1.4233
Constant $U, V$ using Backward Trajectories	0.9528	0.9784	5.8740	1.7218
Constant $U, V$ using Forward Trajectories	0.9330	0.9706	6.9547	1.9684





# Dual-Doppler Wind Analysis

- Simple, traditional dual-Doppler method intended for low elevation angles ( $< 10^\circ$ )

$$u = \frac{(y - y_2)r_1v_{r1} - (y - y_1)r_2v_{r2}}{(x - x_1)(y - y_2) - (x - x_2)(y - y_1)}$$

$$v = \frac{(x - x_2)r_1v_{r1} - (x - x_1)r_2v_{r2}}{(x - x_2)(y - y_1) - (x - x_1)(y - y_2)}$$

- $x$  and  $y$  are Cartesian coordinates for the analysis point,  
 $(x_1, y_1)$ ,  $(x_2, y_2)$  are locations of radars 1 and 2,  
 $r_1$ ,  $r_2$  are distances of the analysis point from radars 1 and 2,  
 $v_{r1}$ ,  $v_{r2}$  are the radial velocities

# Dual-Doppler Vertical Velocity Analysis

- Vertical velocity is calculated from mass conservation  
(Brandes 1977)

$$w = -e^{-kz} \int_{z_0}^z \delta e^{-kz'} dz'$$

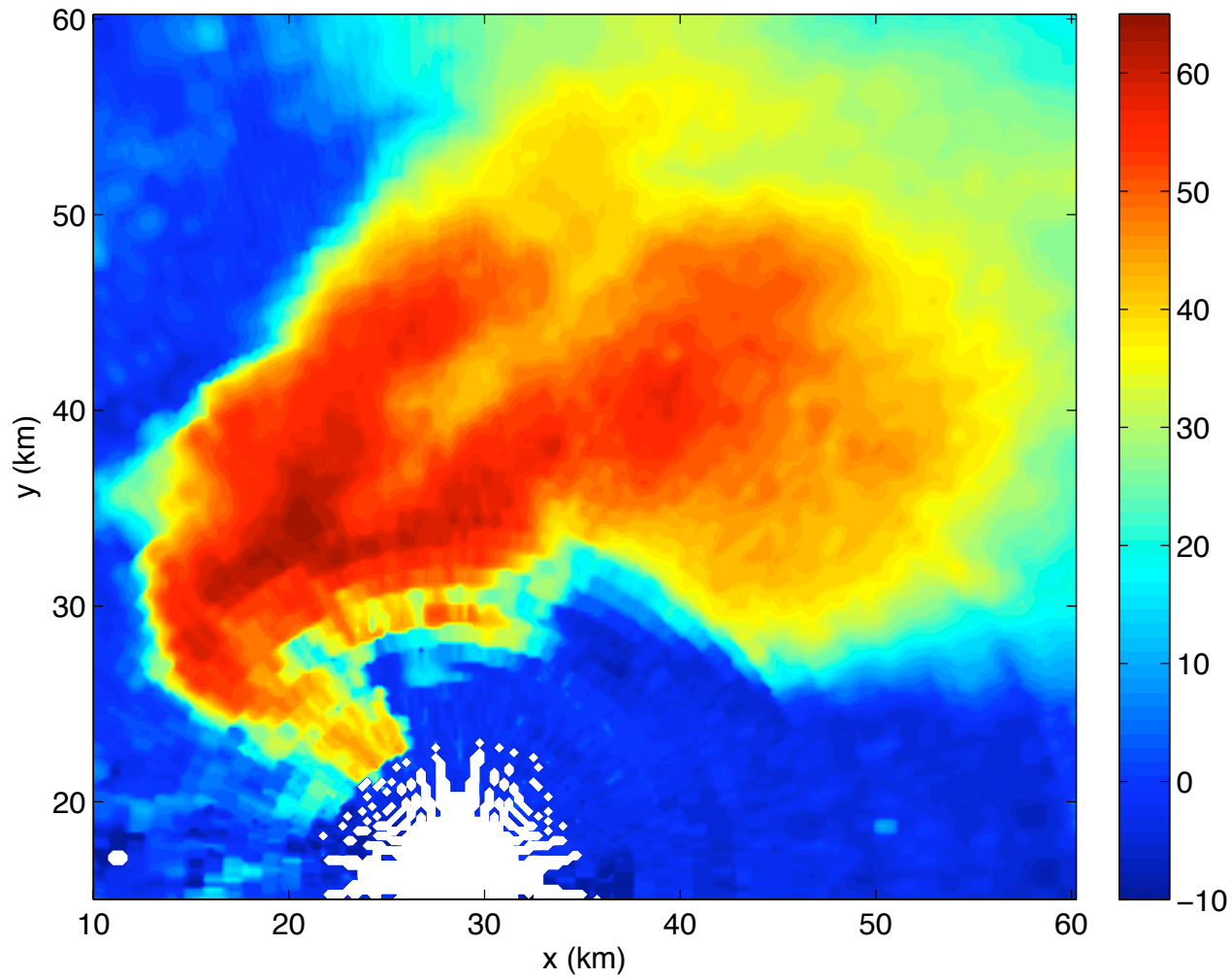
where  $\delta = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y}$  and  $k = -\frac{\partial}{\partial z} \ln \rho = \frac{1}{H}$

Scale height H is set to 10km.

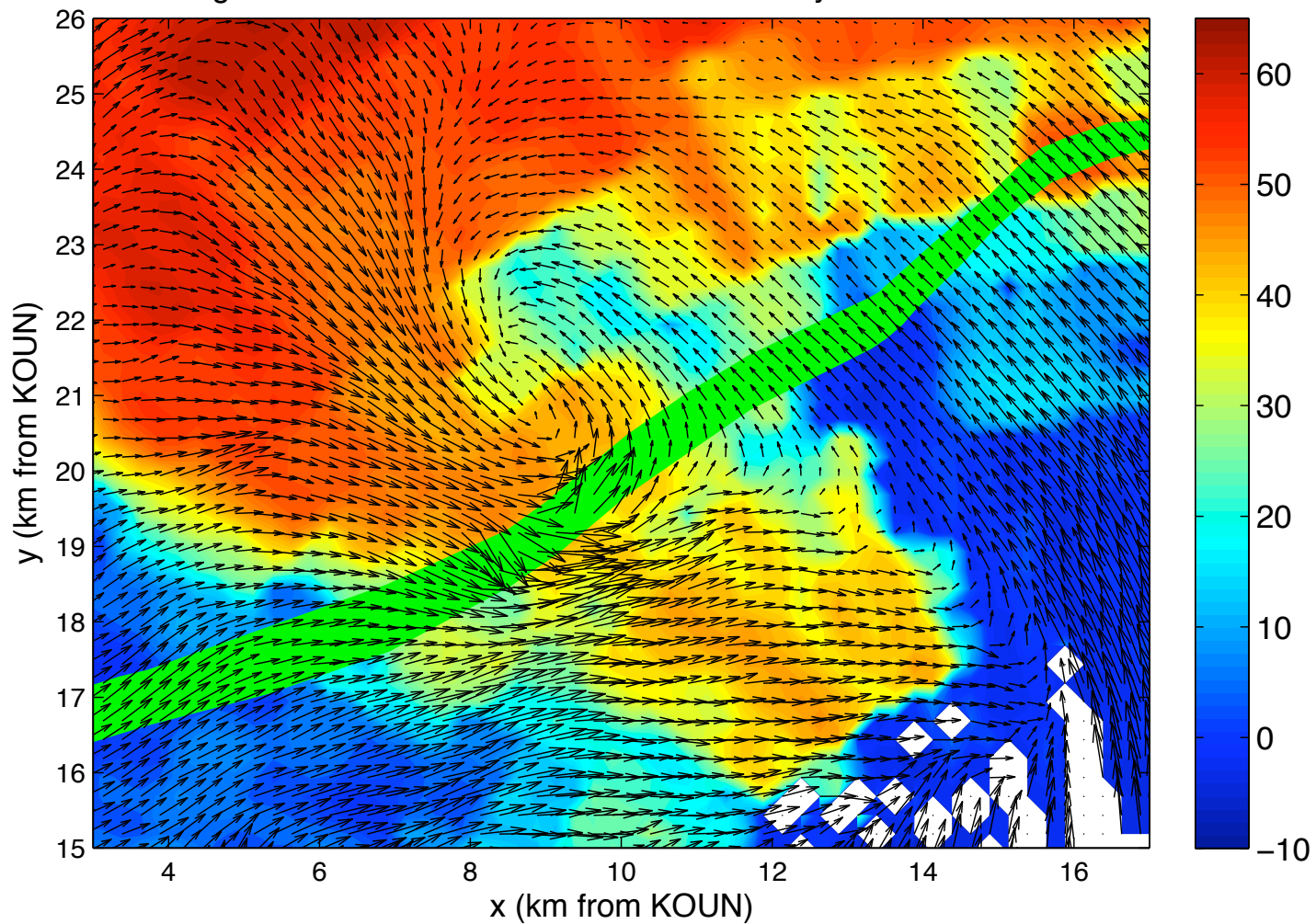
# Dual-Doppler Results

**8 May 2003**  
**22:26**

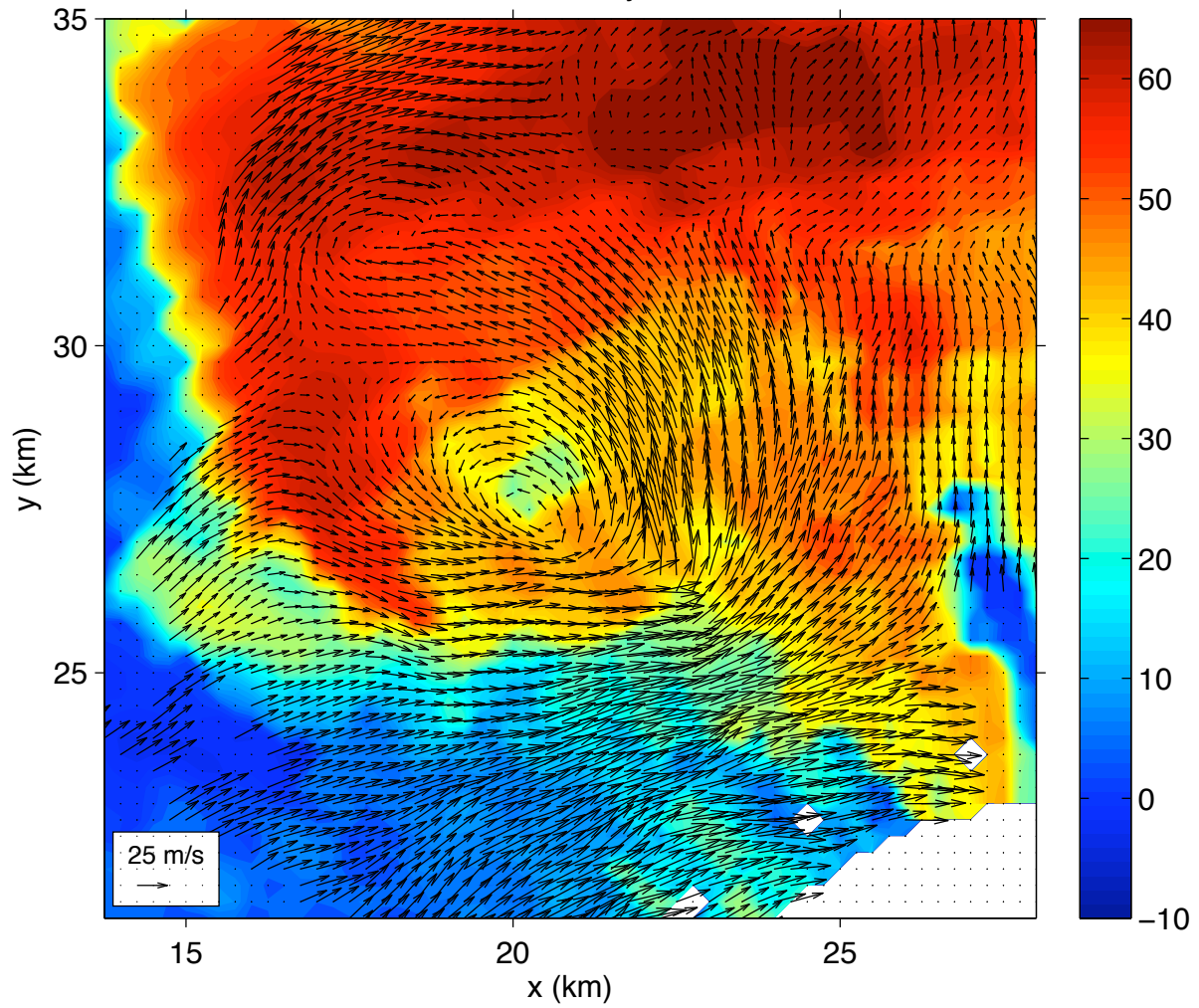
KTLX Reflectivity (dBZ) 8 May 2003 22:26:10 UTC 0.6km



Damage Path and Horizontal Winds 0.6km 8 May 2003 22:26:10 UTC

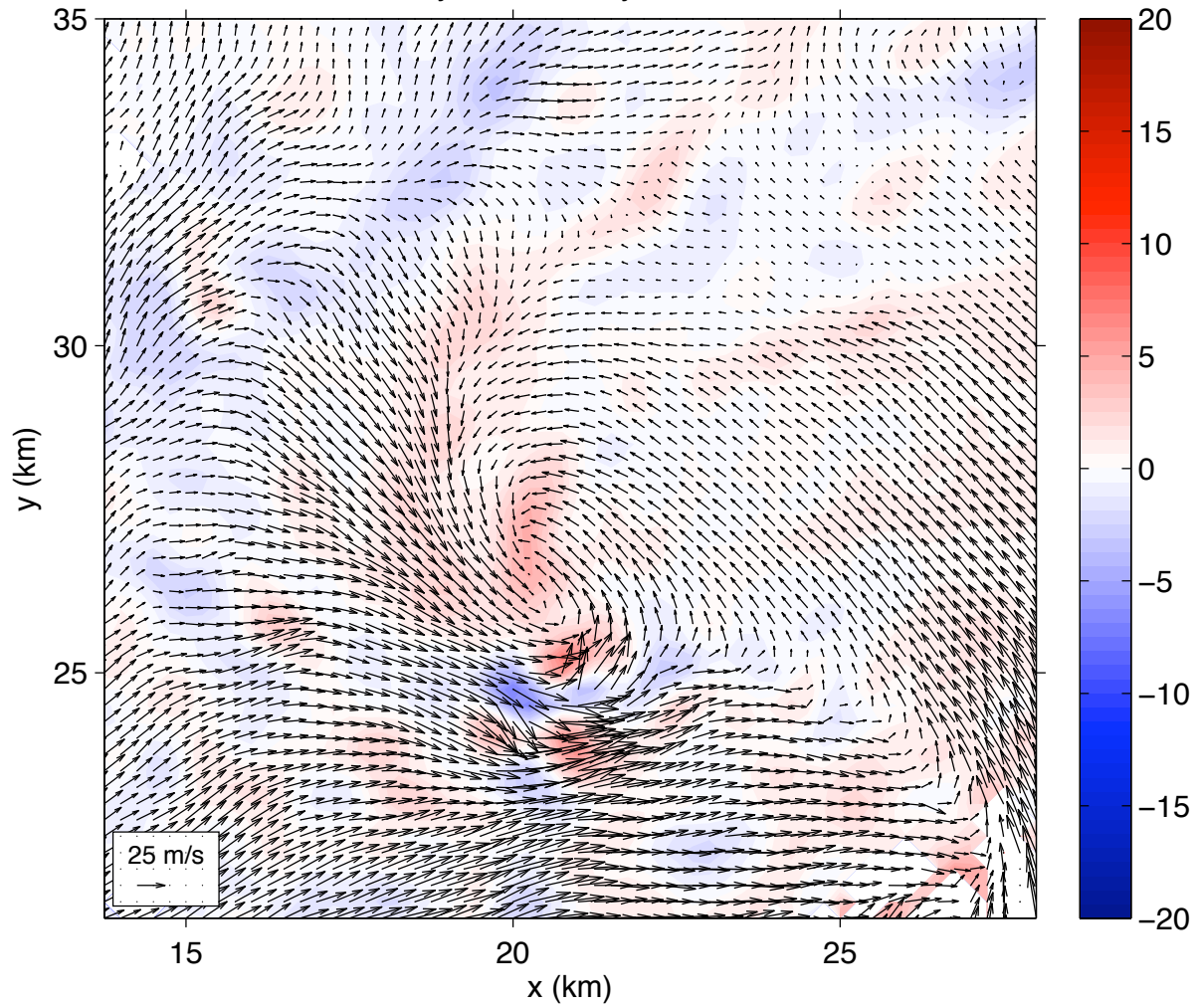


Horizontal Winds 1.6km 8 May 2003 22:27:54 UTC

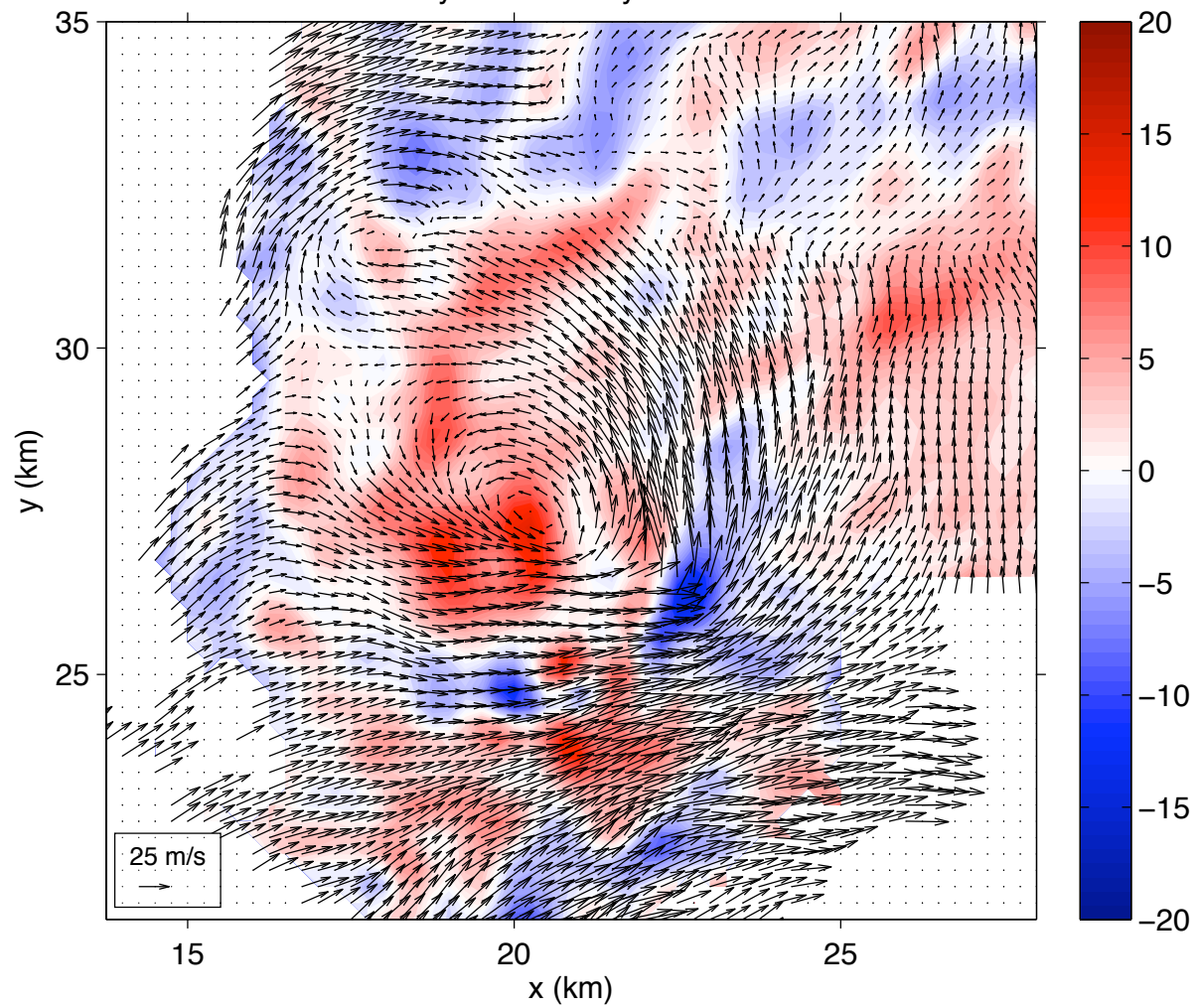




Vertical Velocity 0.6km 8 May 2003 22:26:10 UTC

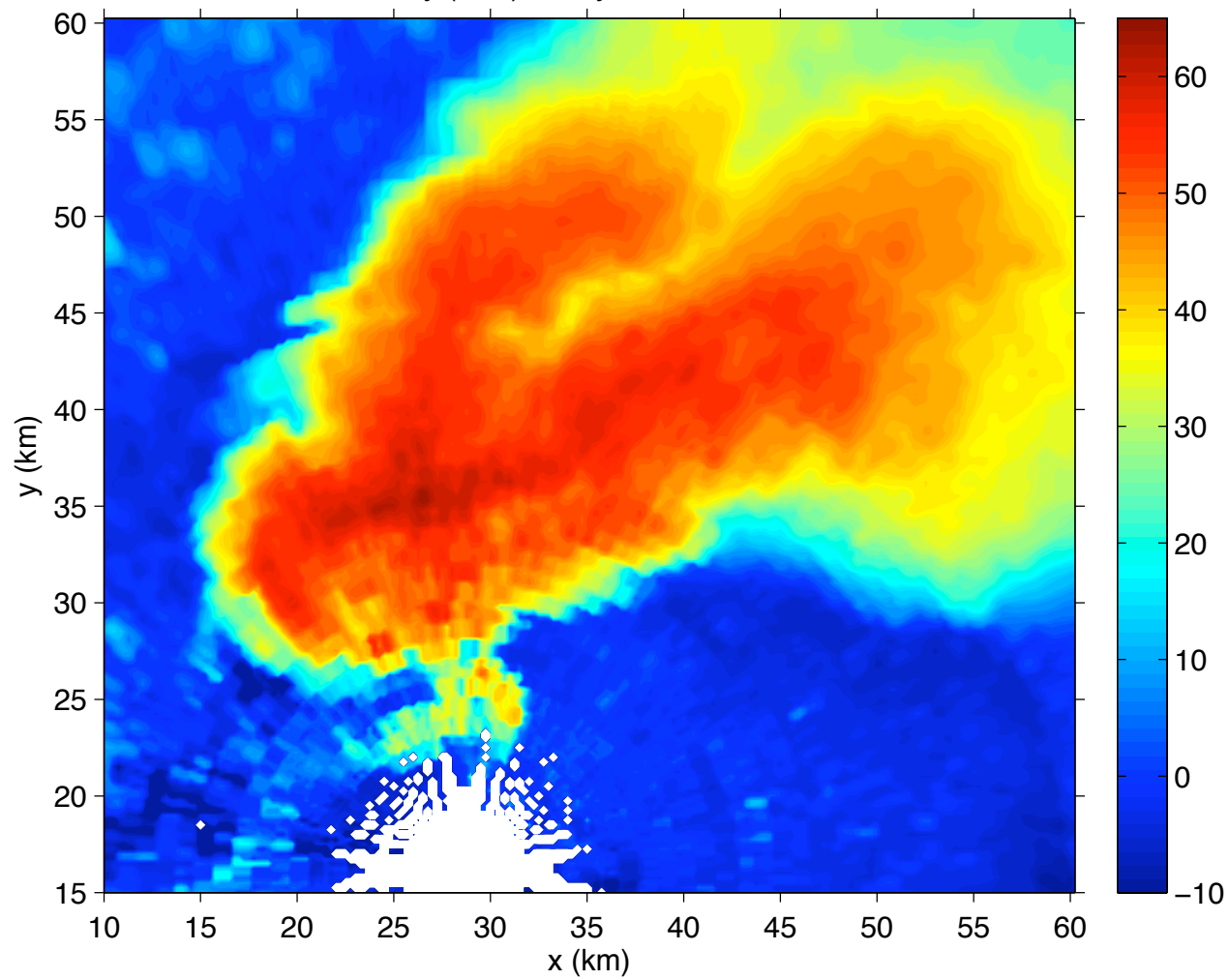


Vertical Velocity 1.6km 8 May 2003 22:27:54 UTC

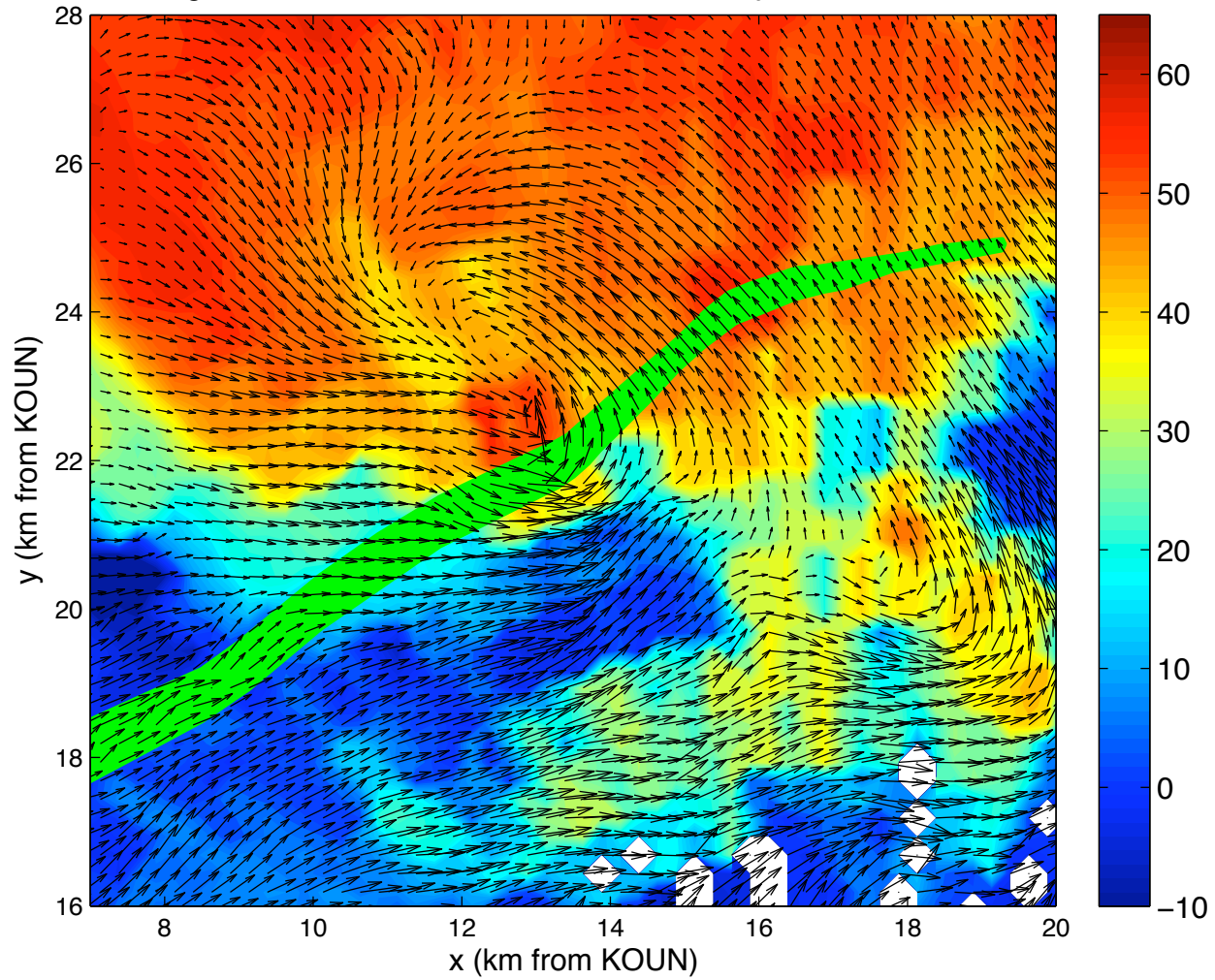


**8 May 2003**  
**22:31**

KTLX Reflectivity (dBZ) 8 May 2003 22:31:07 UTC 0.6km

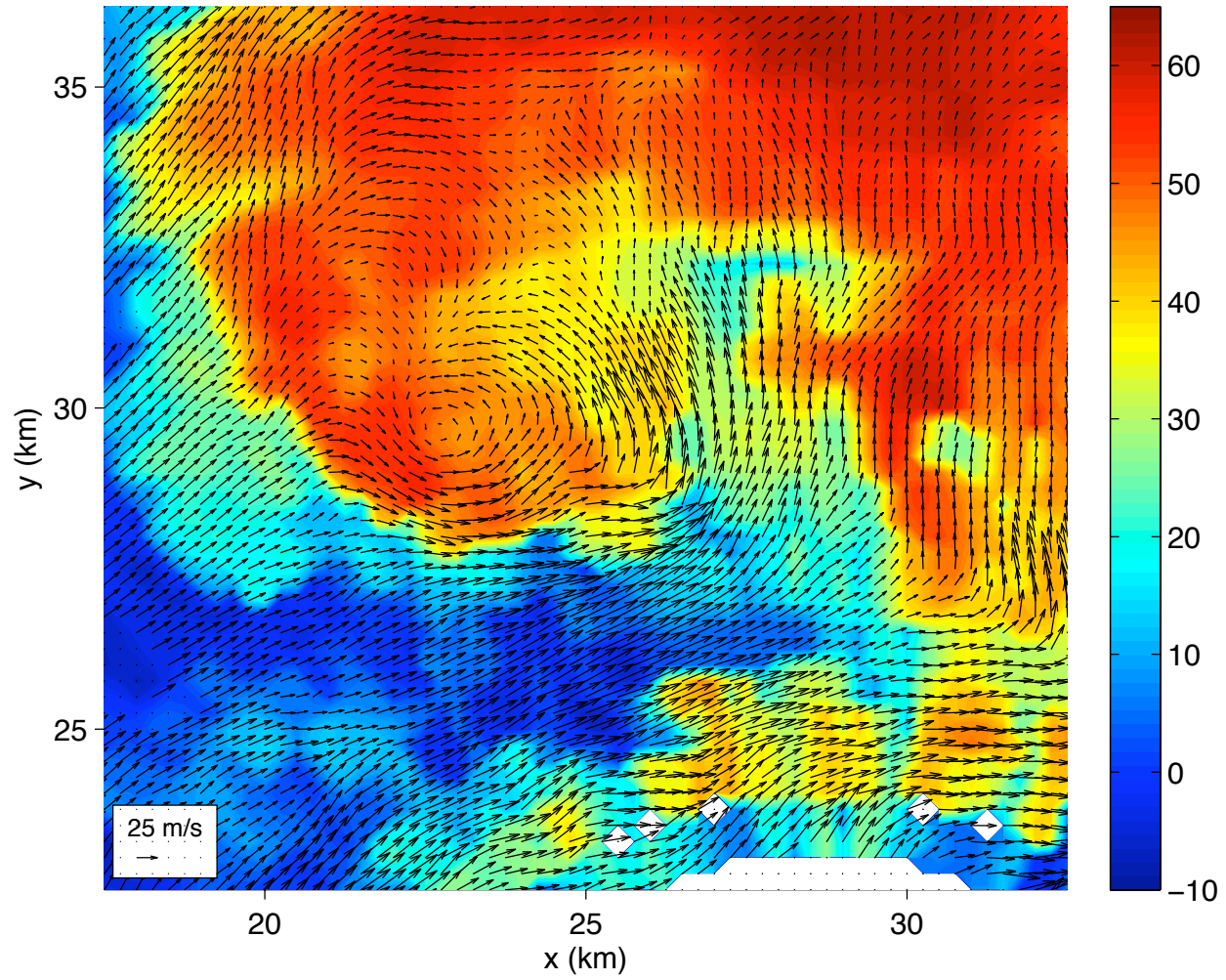


Damage Path and Horizontal Winds 0.6km 8 May 2003 22:31:07 UTC

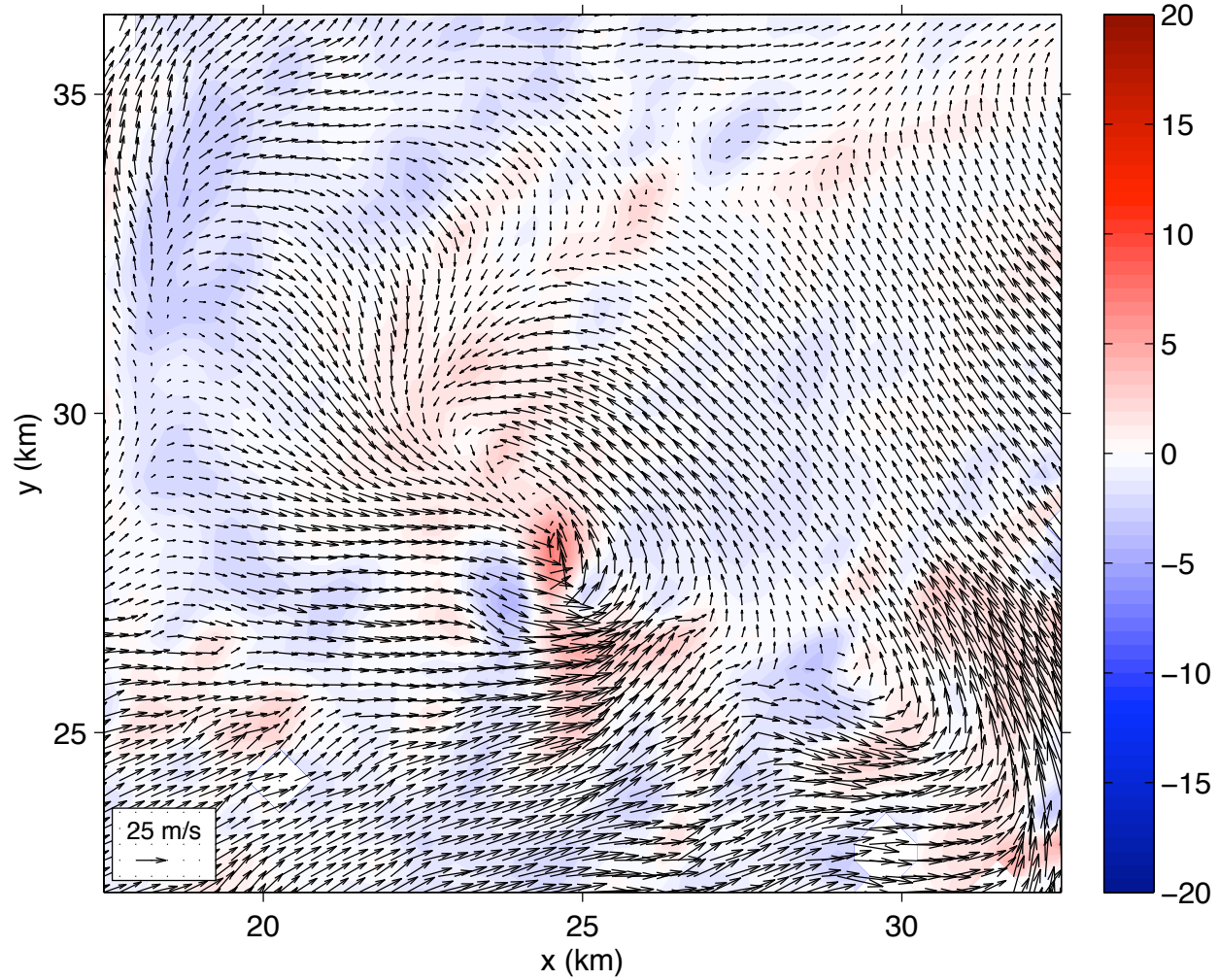




Horizontal Winds 1.6km 8 May 2003 22:32:51 UTC

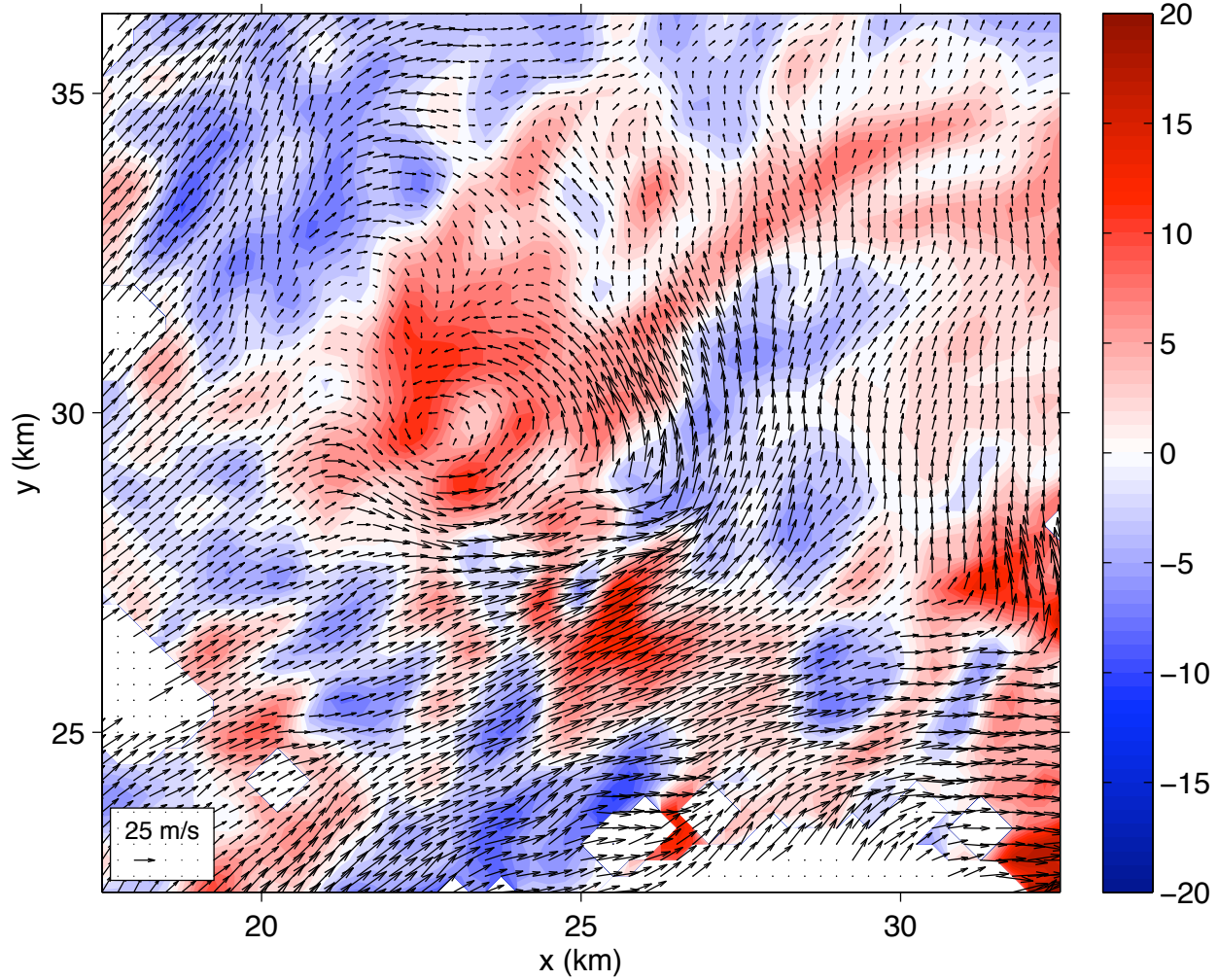


Vertical Velocity 0.6km 8 May 2003 22:31:07 UTC



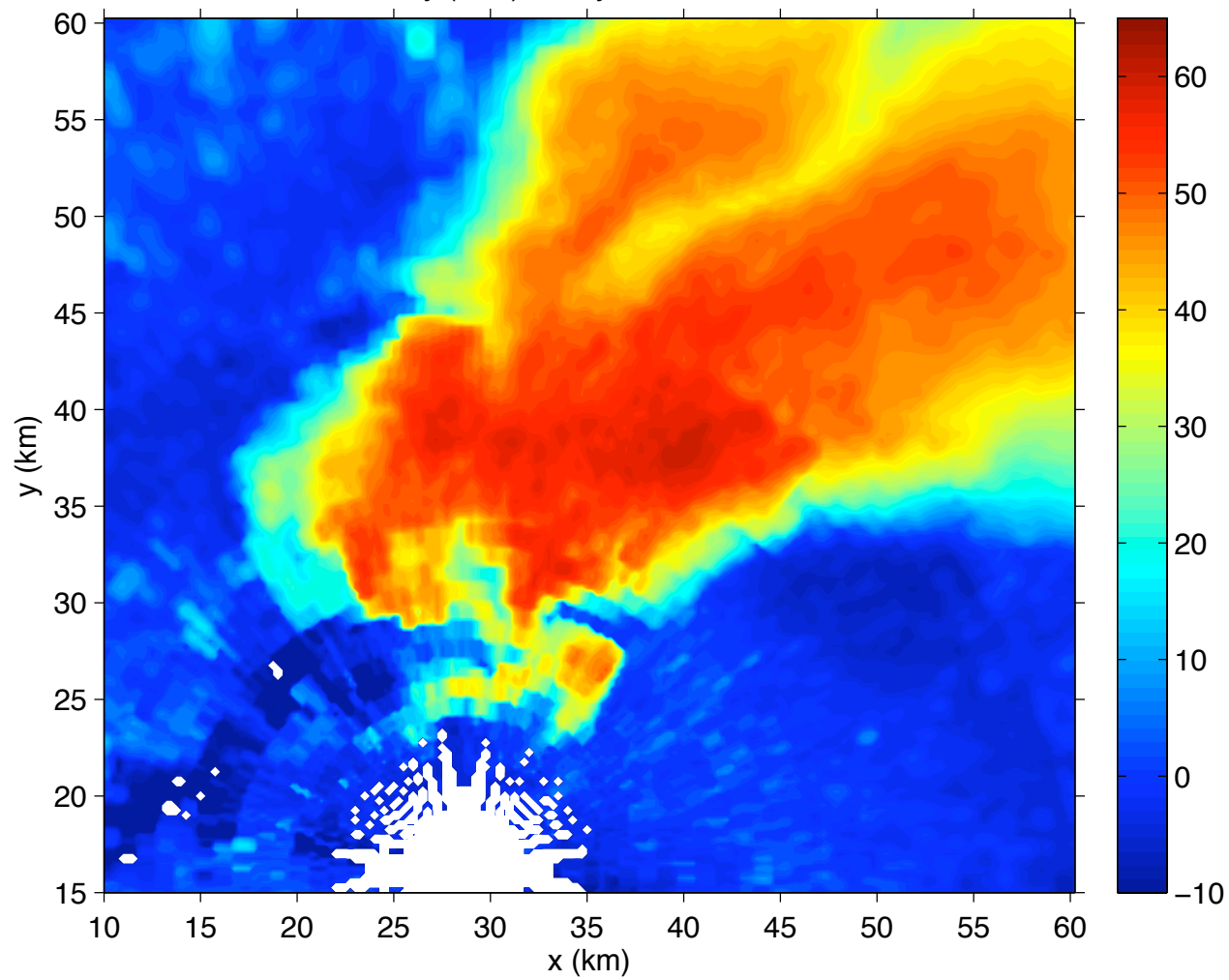


Vertical Velocity 1.6km 8 May 2003 22:32:51 UTC

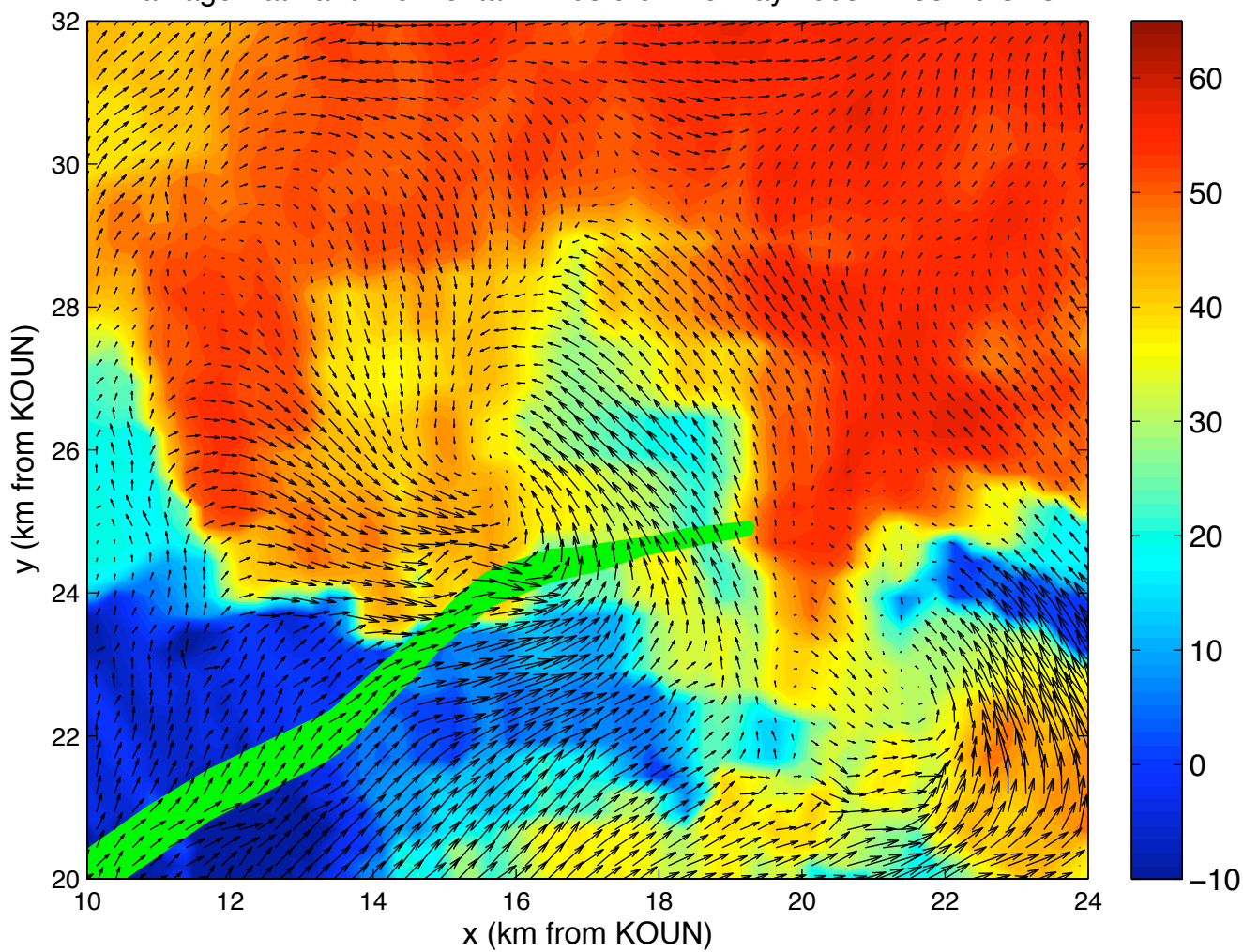


**8 May 2003**  
**22:35**

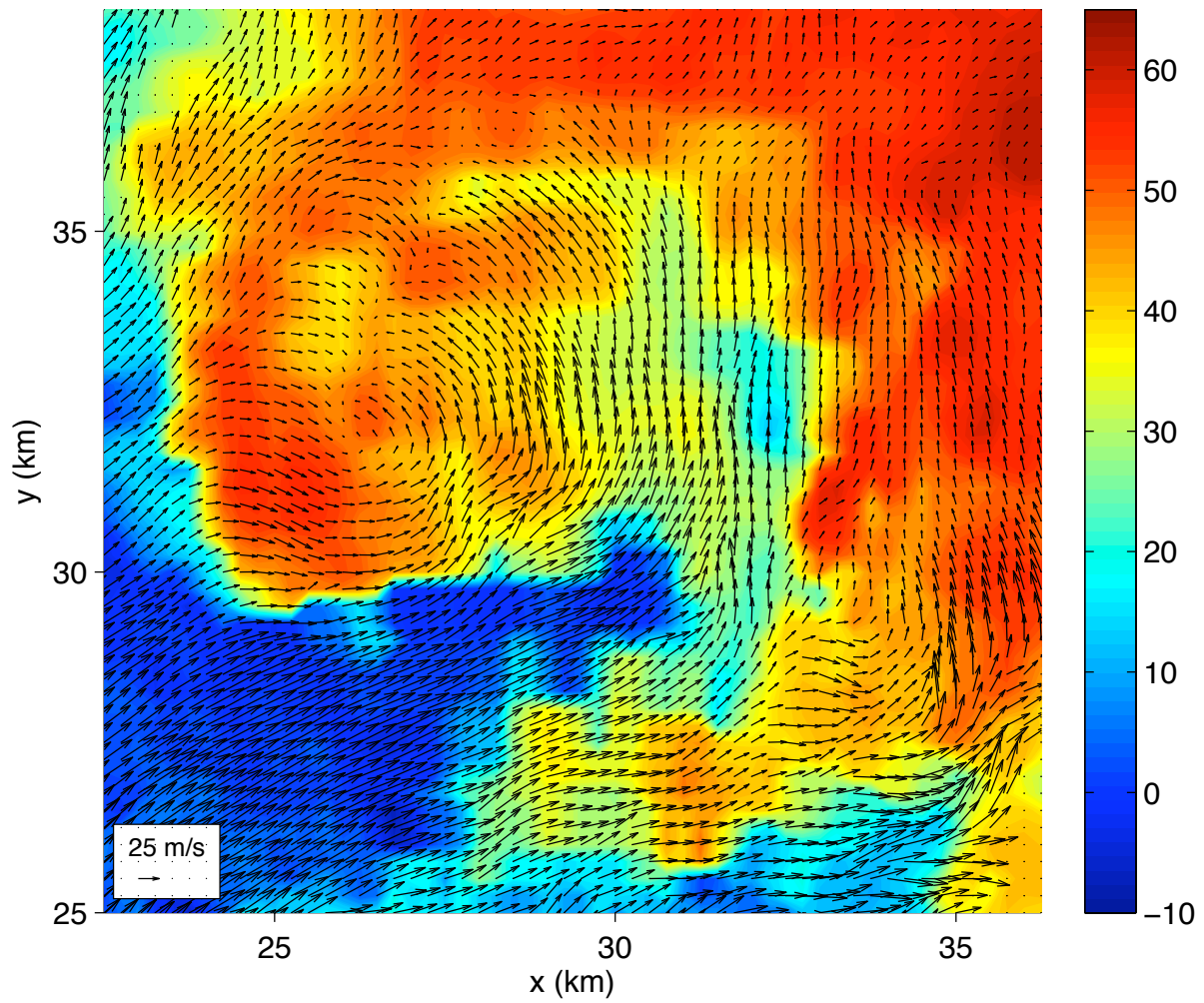
KTLX Reflectivity (dBZ) 8 May 2003 22:35:26 UTC 0.6km



Damage Path and Horizontal Winds 0.6km 8 May 2003 22:35:26 UTC

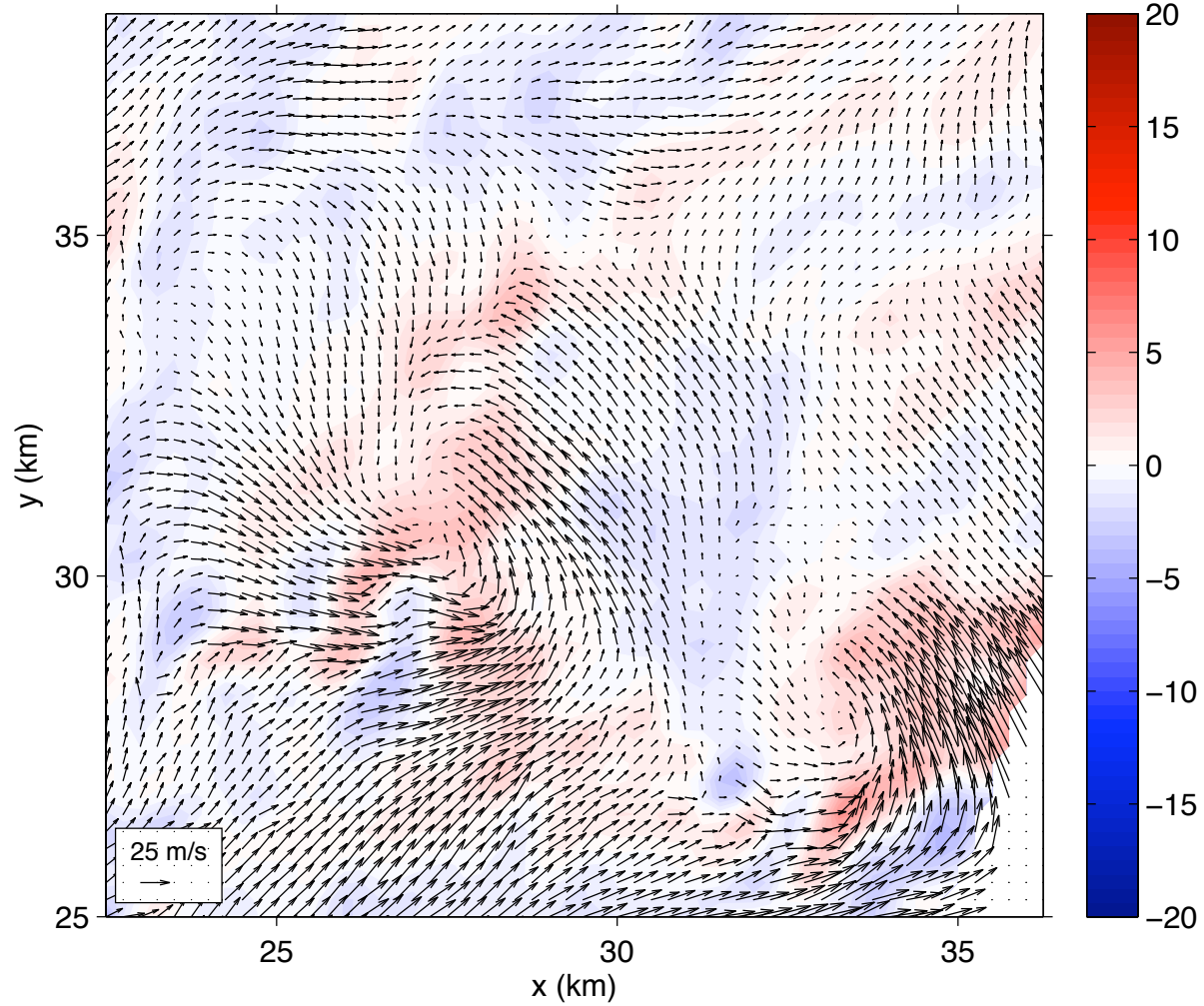


Horizontal Winds 1.6km 8 May 2003 22:37:49 UTC

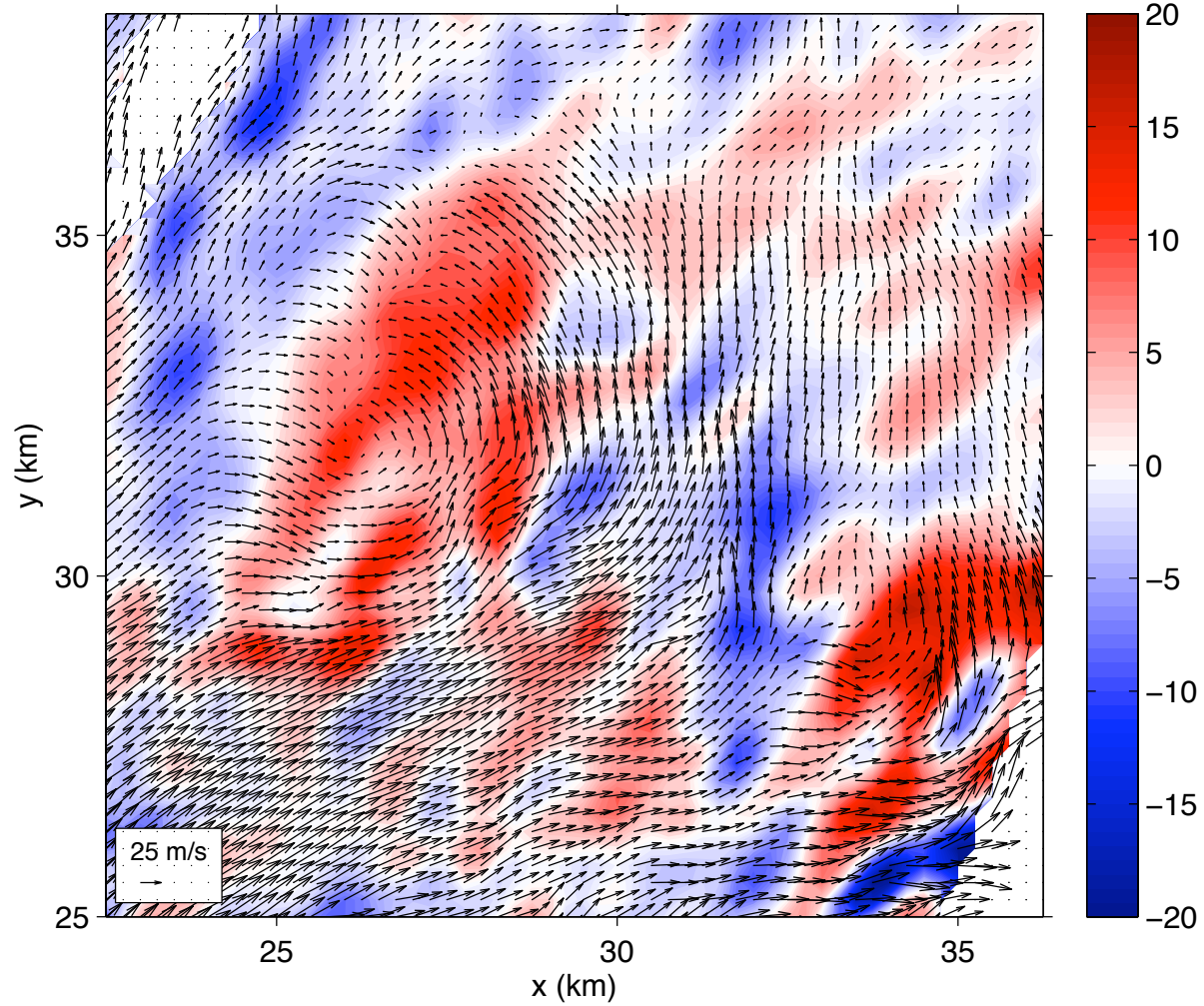




Vertical Velocity 0.6km 8 May 2003 22:35:26 UTC



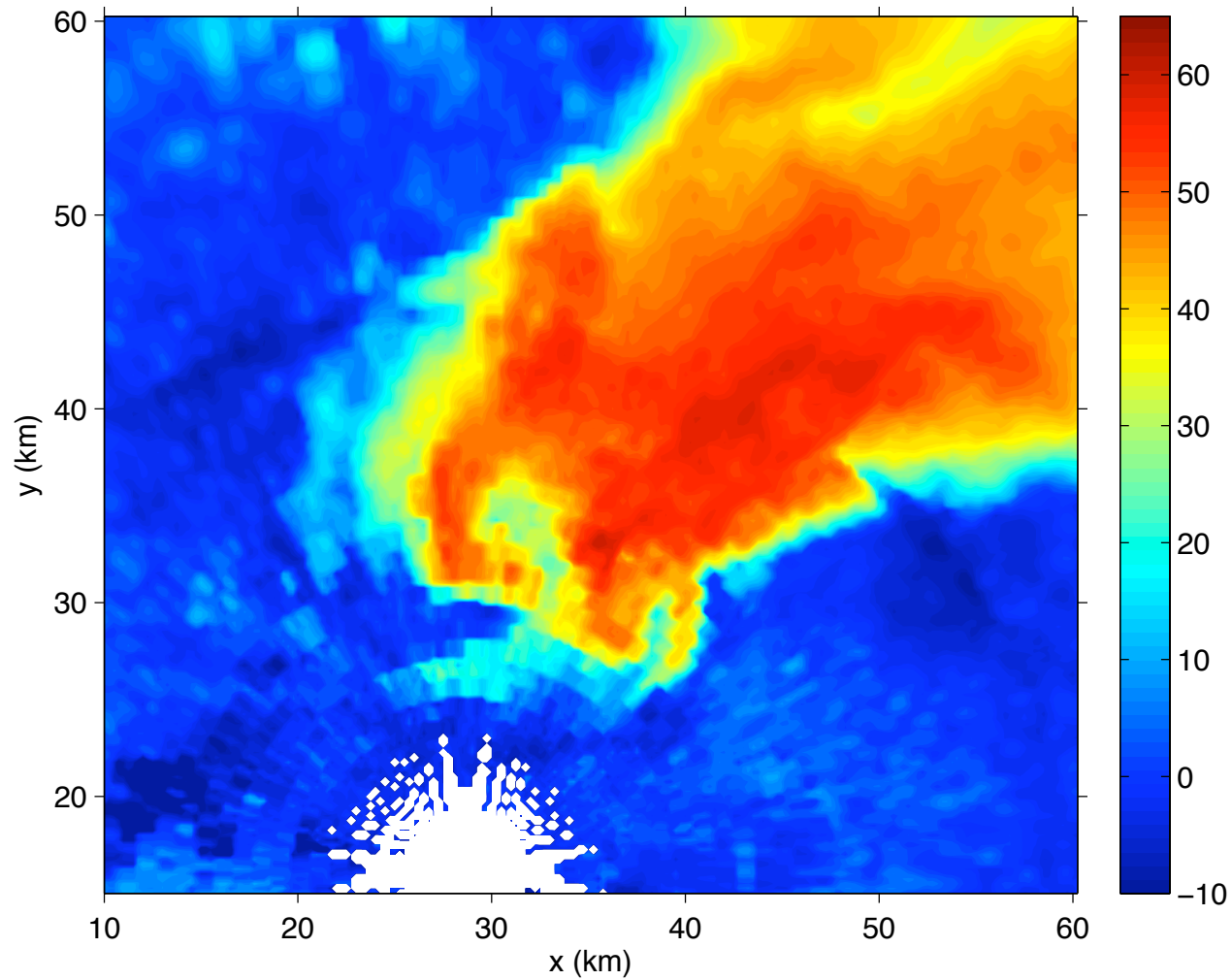
Vertical Velocity 1.6km 8 May 2003 22:37:49 UTC



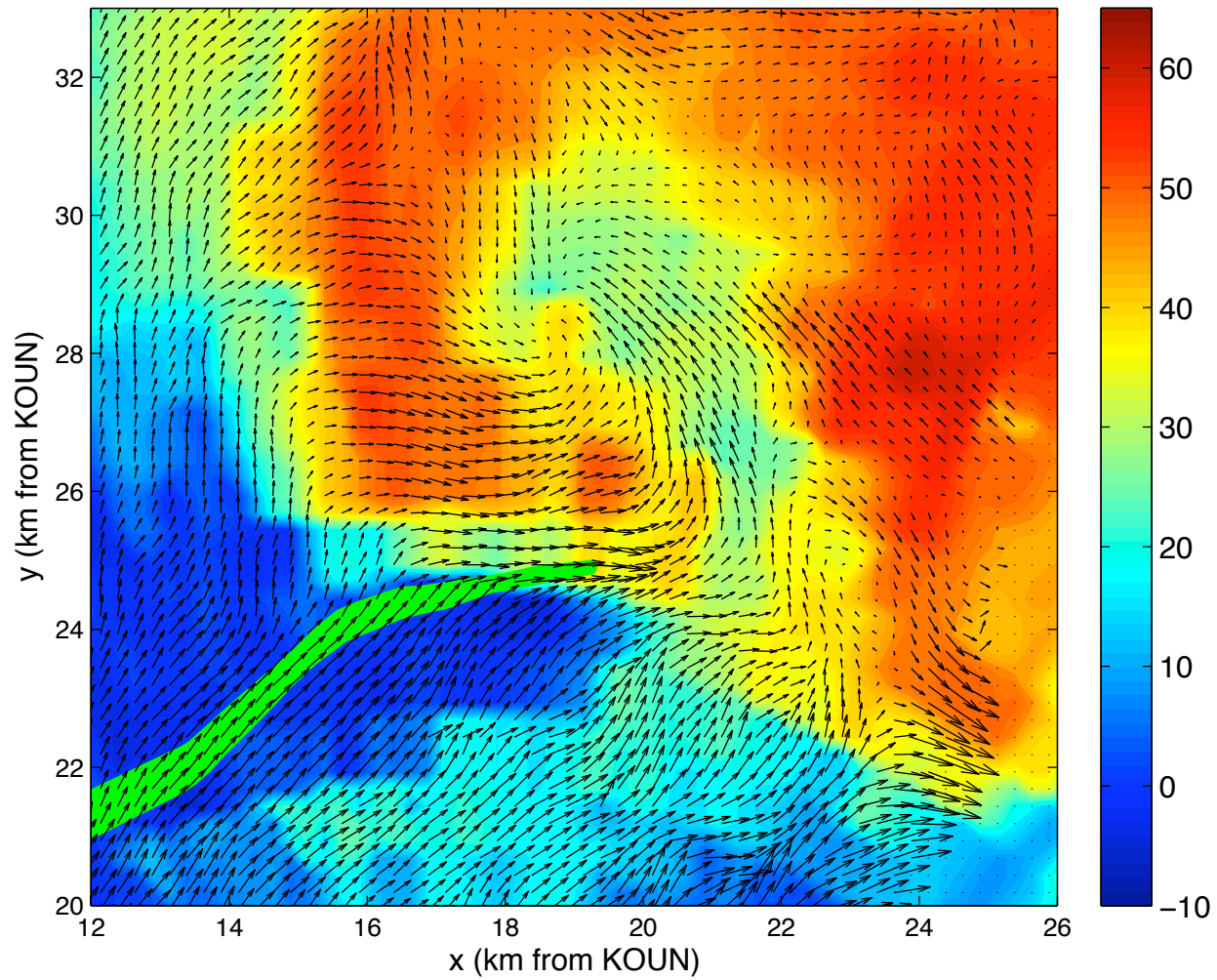


**8 May 2003**  
**22:40**

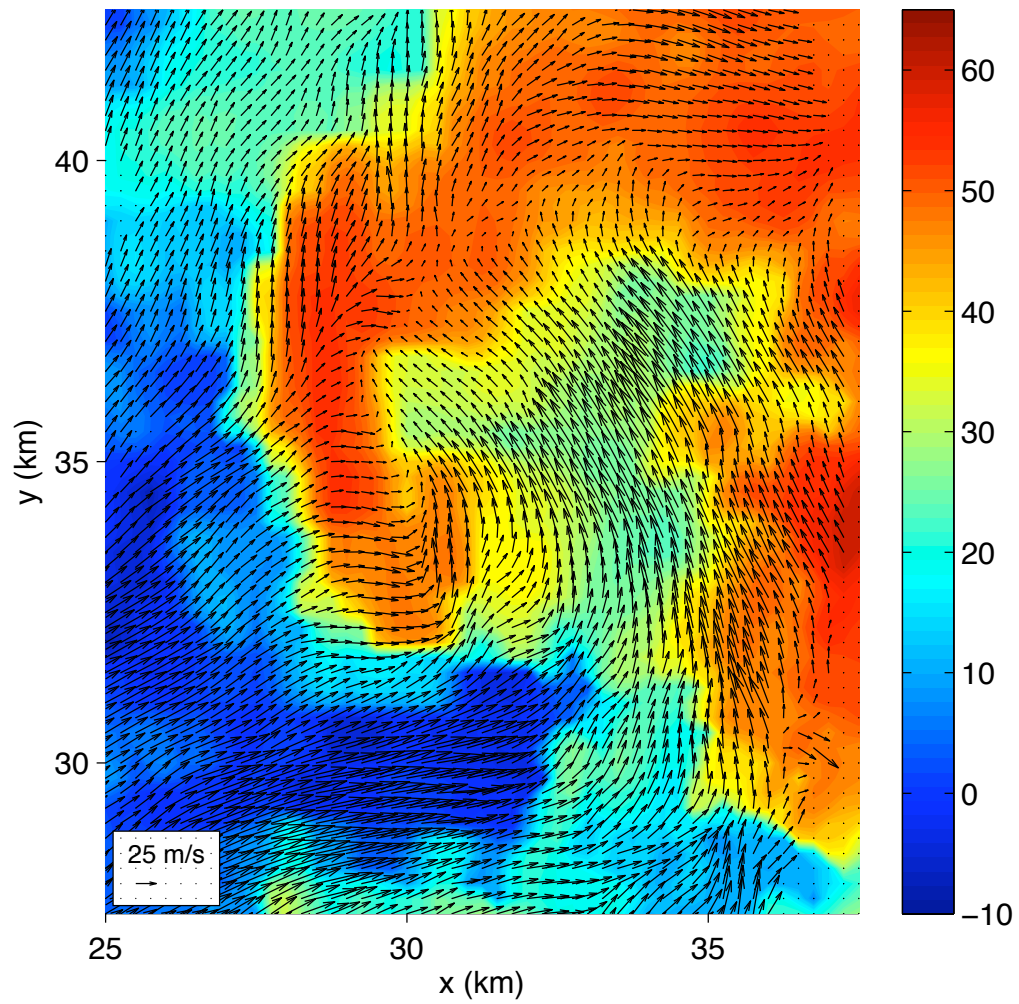
KTLX Reflectivity (dBZ) 8 May 2003 22:40:22 UTC 0.6km



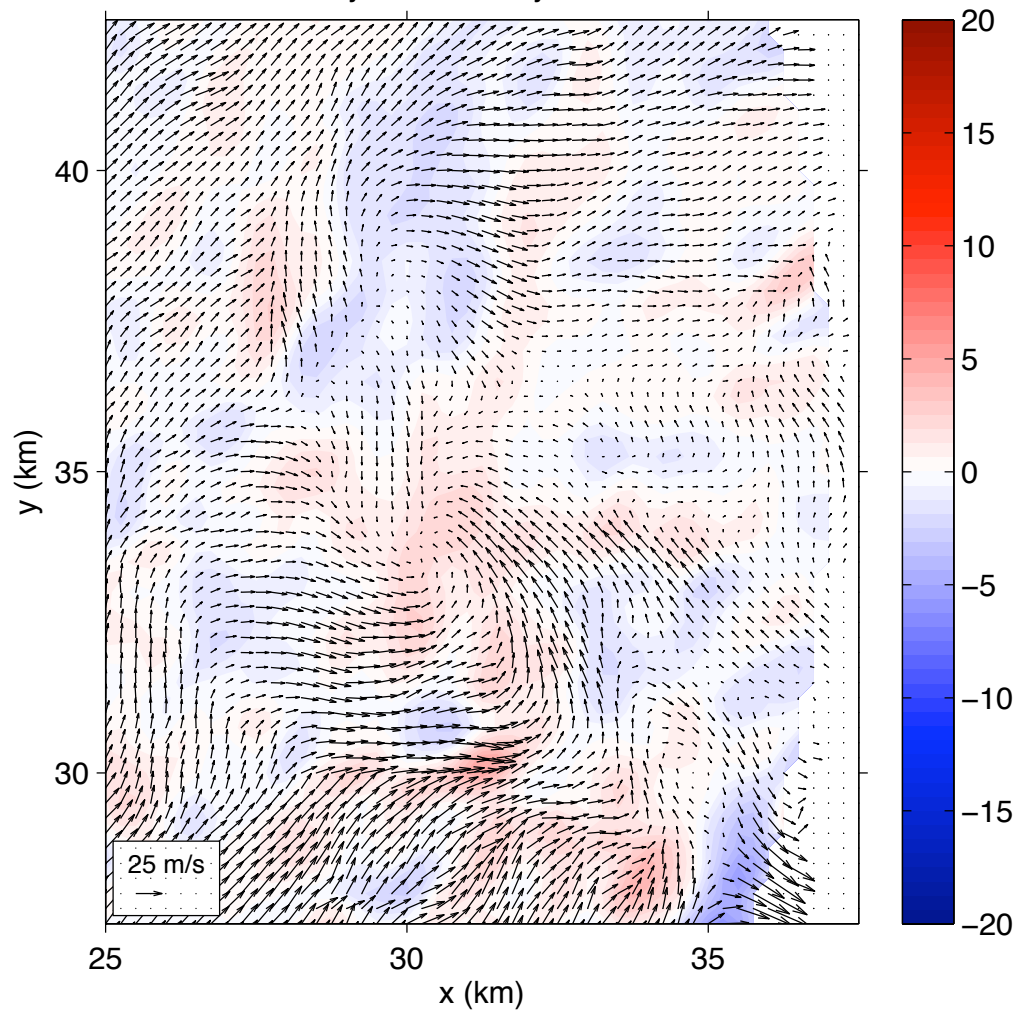
Damage Path and Horizontal Winds 0.6km 8 May 2003 22:40:22 UTC



Horizontal Winds 1.6km 8 May 2003 22:42:23 UTC

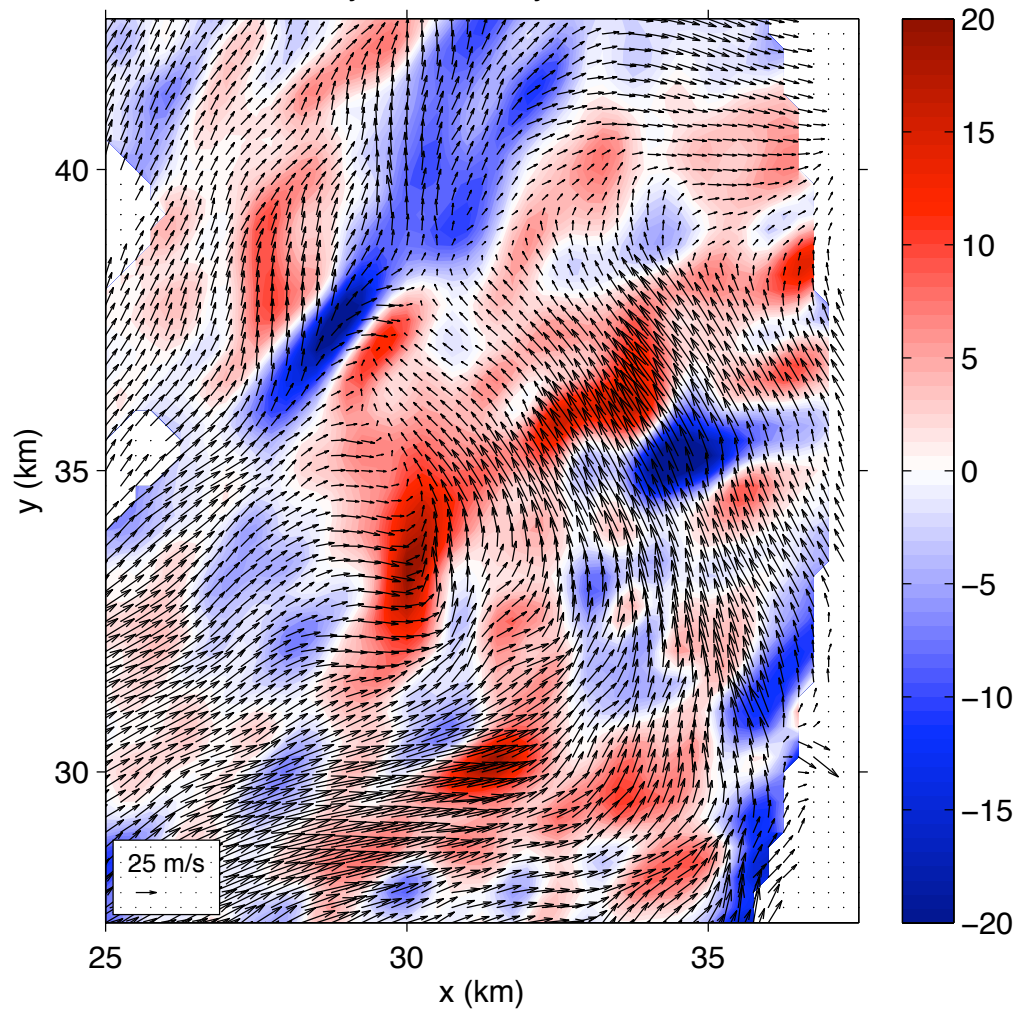


Vertical Velocity 0.6km 8 May 2003 22:40:22 UTC





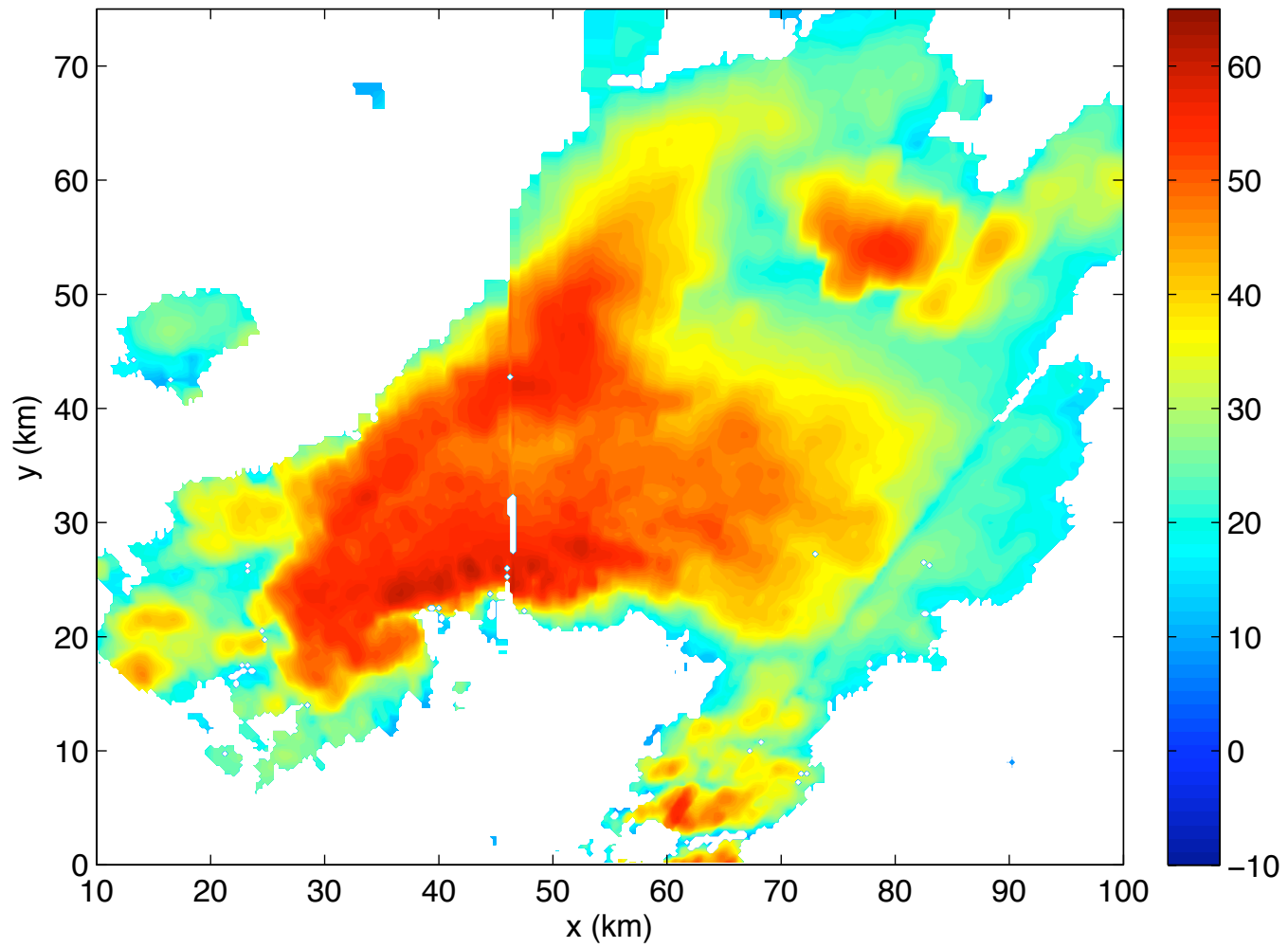
Vertical Velocity 1.6km 8 May 2003 22:42:23 UTC



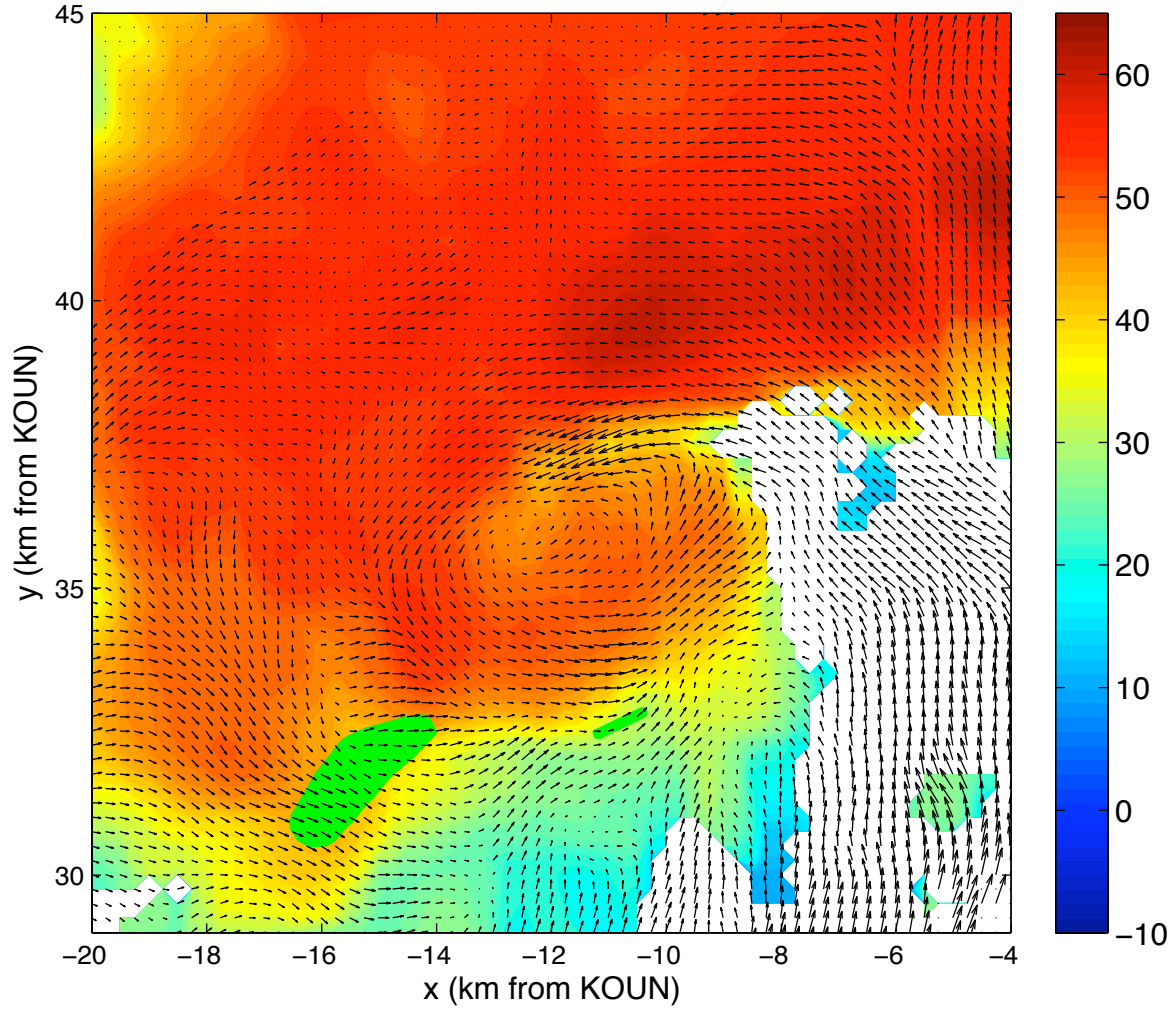
**10 May 2003**  
**03:19**



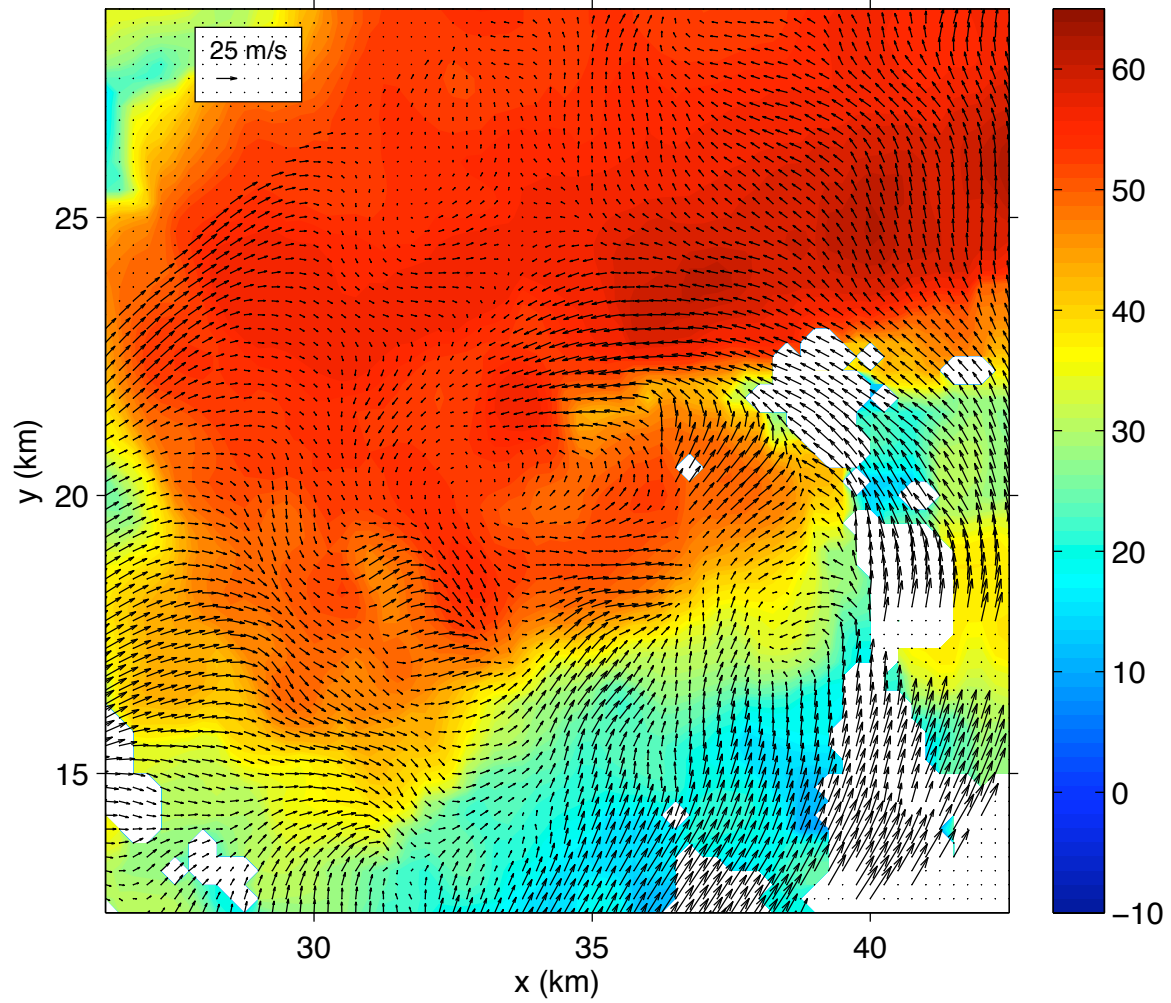
KOUN Reflectivity (dBZ) 10 May 2003 03:19:21 UTC 0.8km



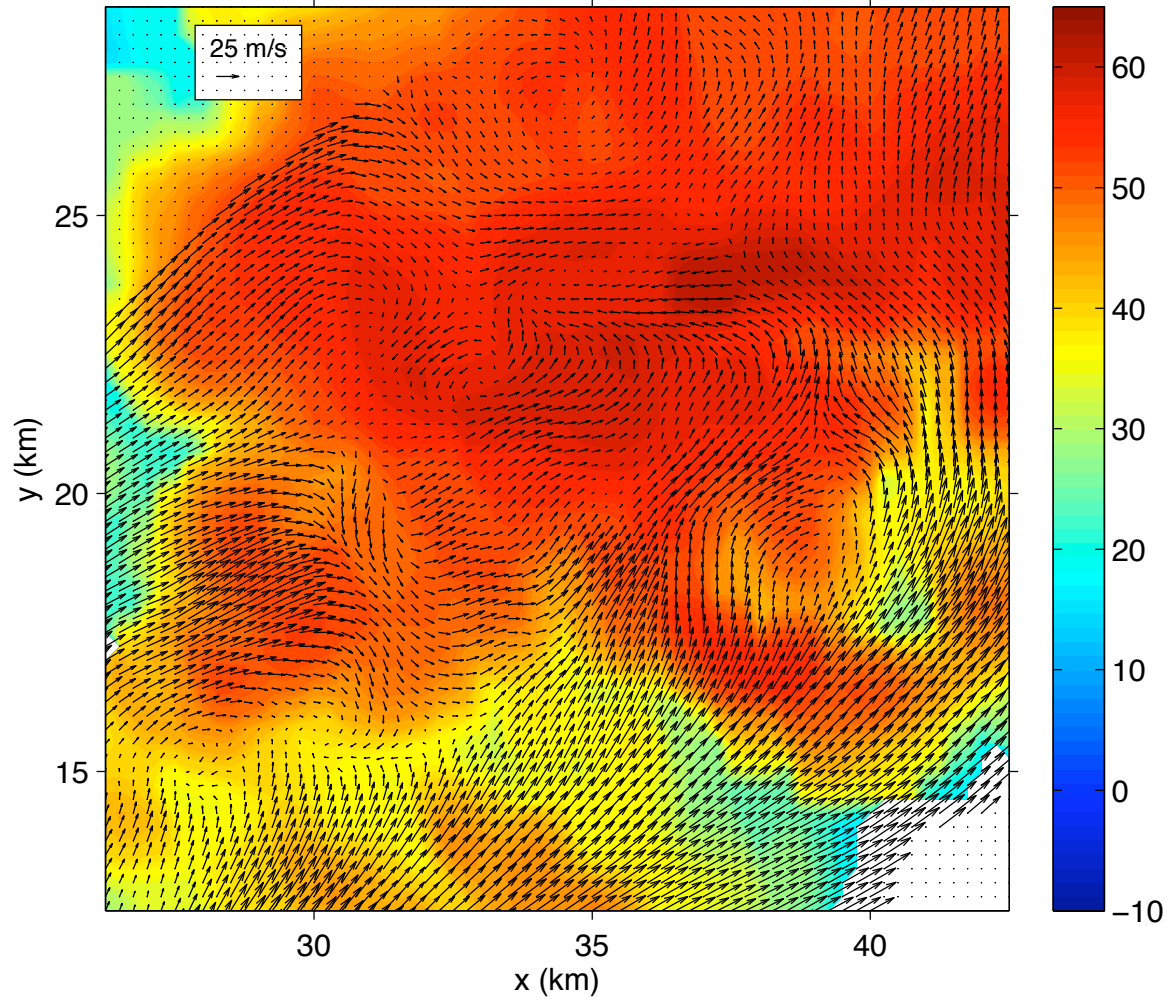
Damage Path and Horizontal Winds 0.8km 10 May 2003 03:19:21 UTC



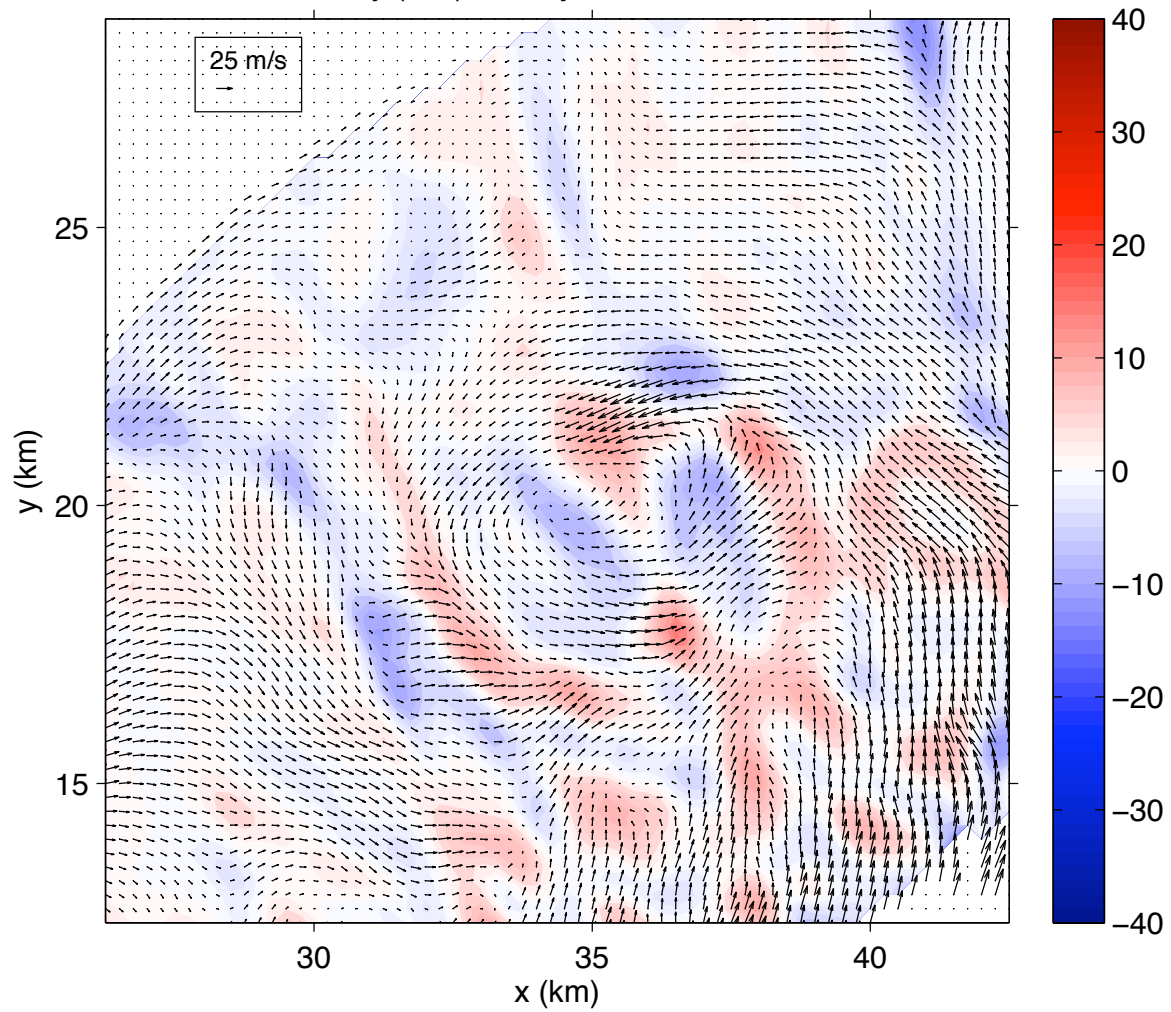
Horizontal Winds 10 May 2003 03:19:39 UTC 1.3km



Horizontal Winds 10 May 2003 03:20:14 UTC 2.8km

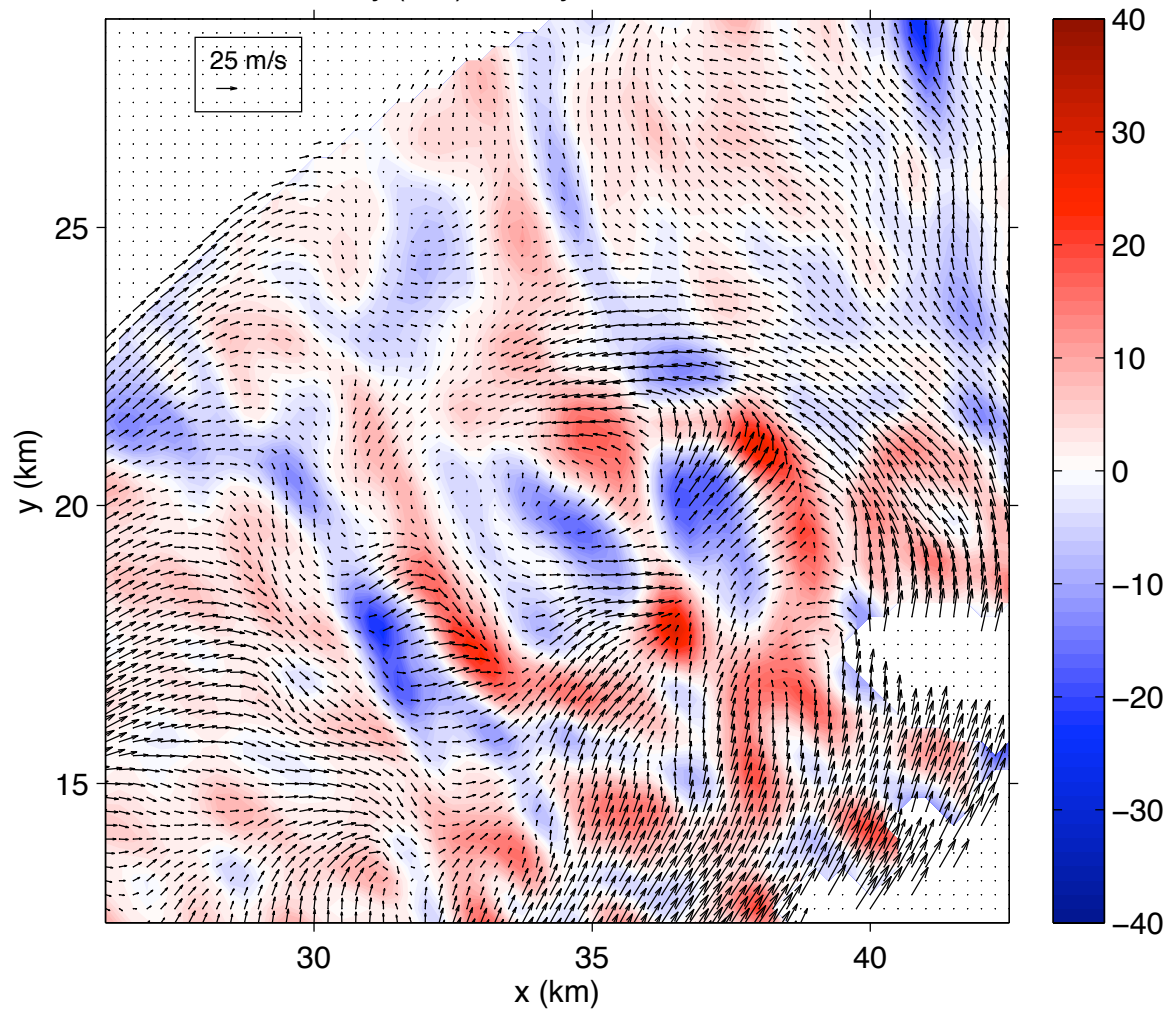


Vertical Velocity (m/s) 10 May 2003 03:19:21 UTC 0.8 km

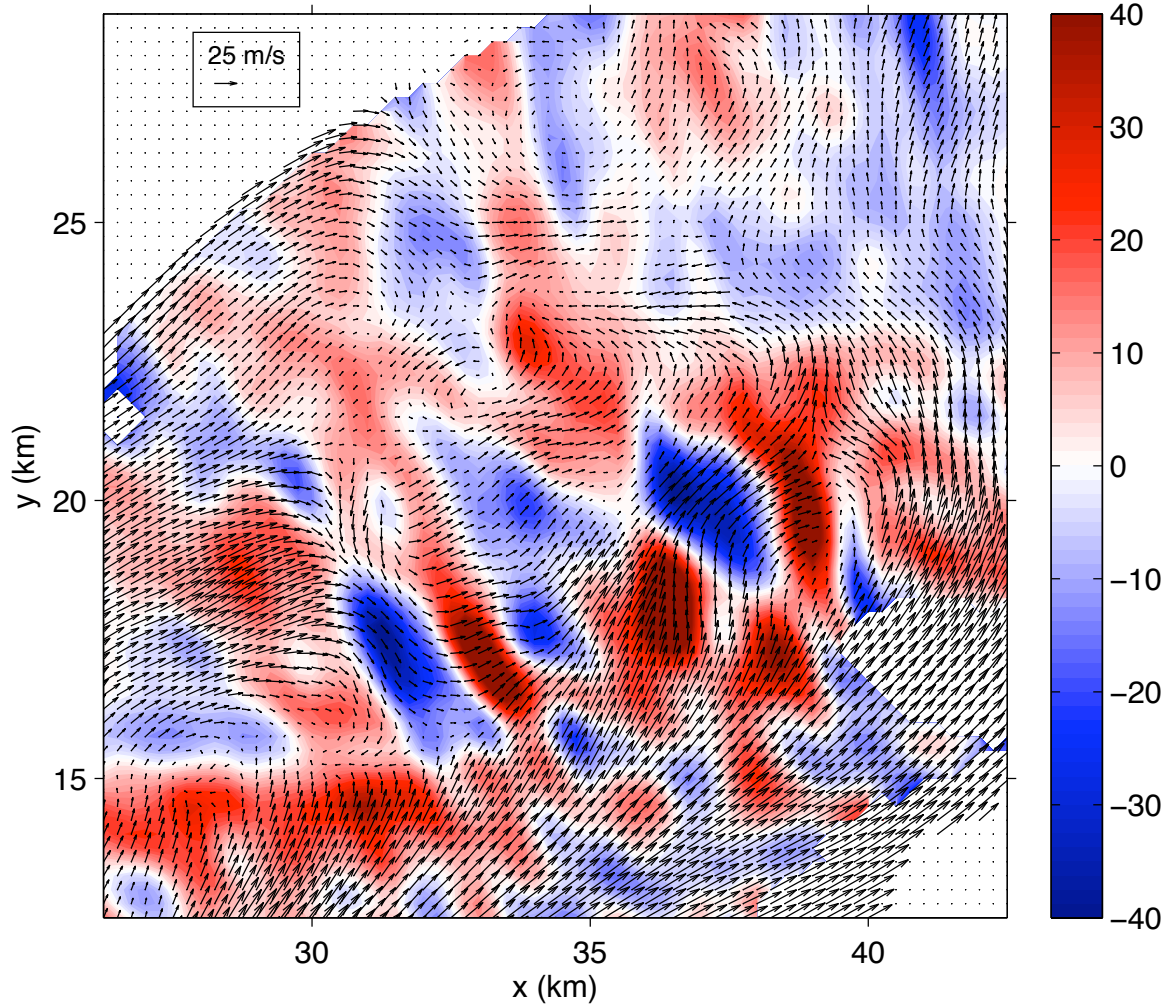




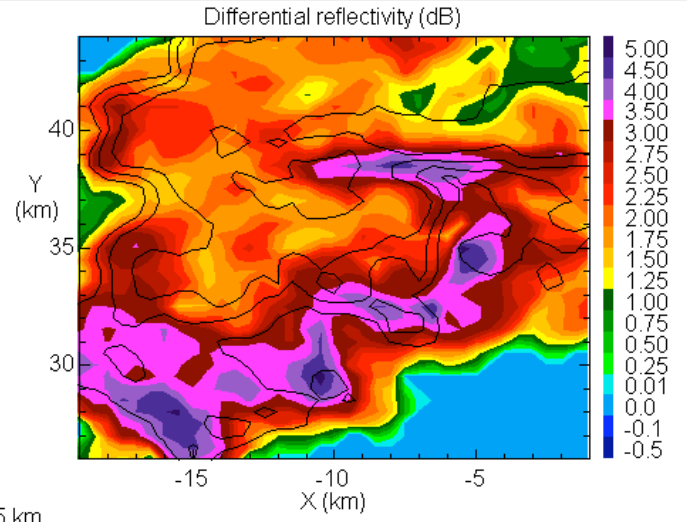
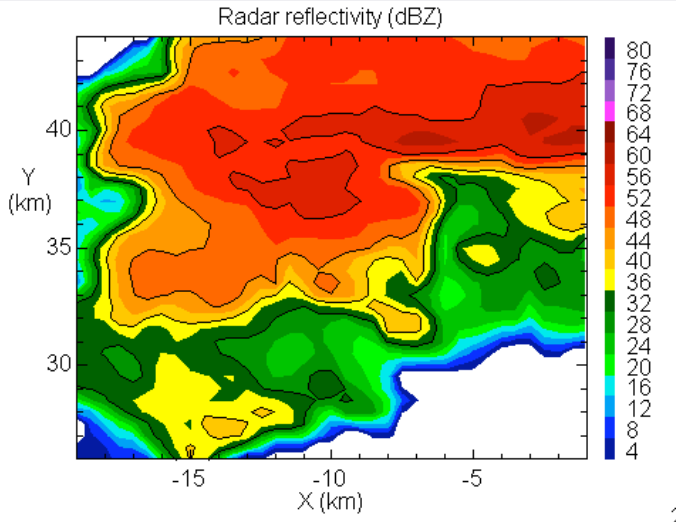
Vertical Velocity (m/s) 10 May 2003 03:19:39 UTC 1.3 km



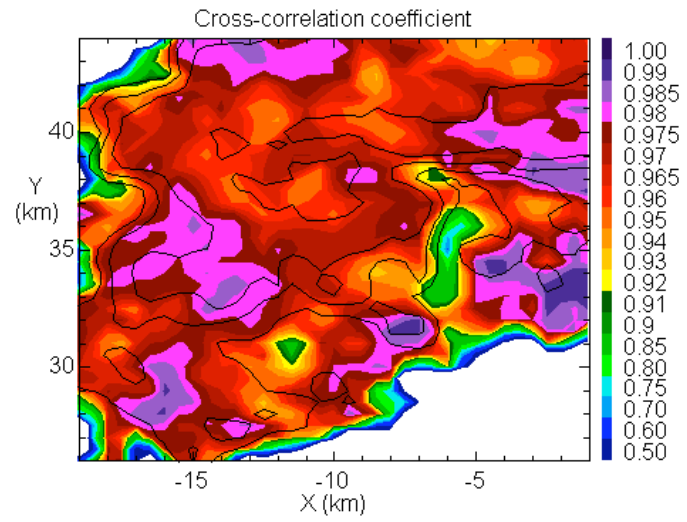
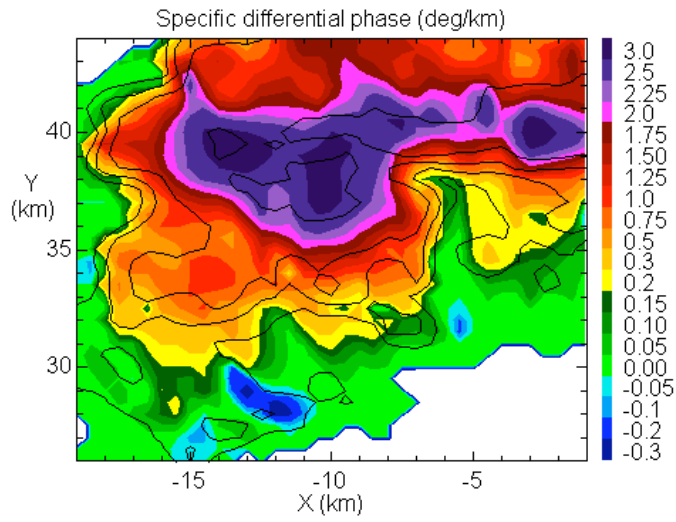
Vertical Velocity (m/s) 10 May 2003 03:20:14 UTC 2.8 km



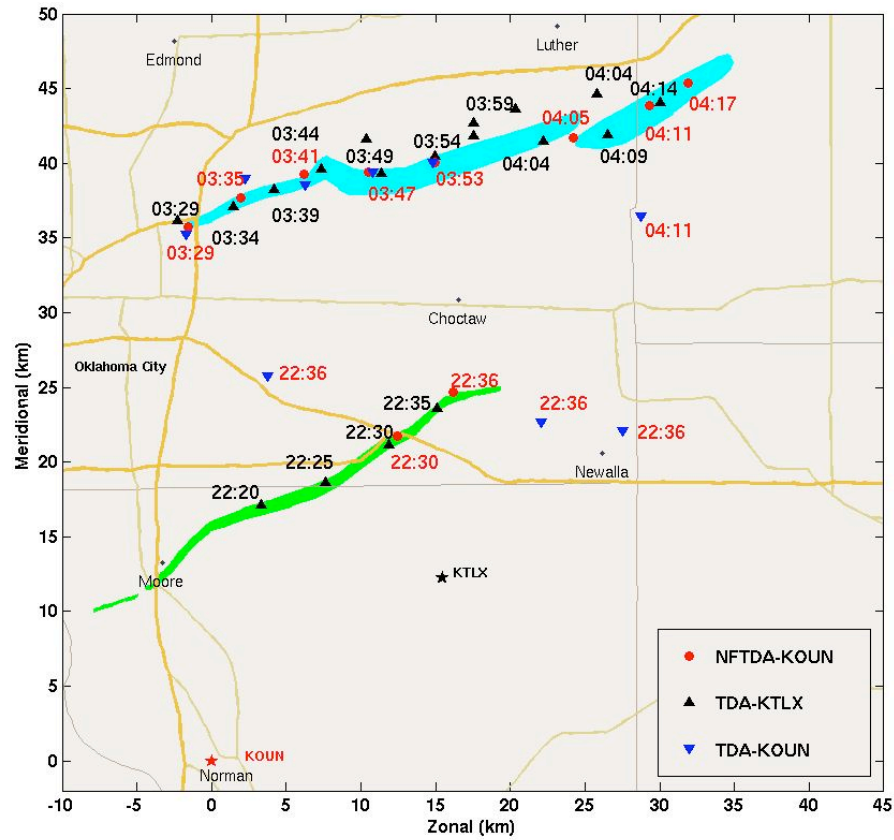




2.75 km



# NFTDA Detections



Wang et. al. submitted

# Conclusions

- Quantitative verification of advection-correction using spatially-variable pattern-translation components in this case is an improvement on any constant pattern-translation.
- The tornado shear anomaly present in dual-Doppler horizontal winds consistent is with the damage path.
- The NFTDA detections were consistent with the damage path
  - The NFTDA did not detect the secondary, non-tornadic mesocyclone circulation 8 May 22:35
  - For this case and for the data analyzed, the NFTDA performed better than the TDA.
- Vertical velocity 10 May 03:19 shows arc shaped updraft
  - The arc shape is consistent with Differential Reflectivity from KOUN, indicating a precipitating flanking line.
  - Evaporational cooling from precipitation could have reinforced the RFD from the storm that led to enhanced convergence before the tornado

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# Questions?

