

Three Spatial Verification Techniques

Caren Marzban^{1,2}, Scott Sandgathe¹, Hilary Lyons², Nicholas Lederer¹

¹ Applied Physics Laboratory, University of Washington

² Department of Statistics, University of Washington

Abstract

Three spatial verification techniques are applied to two sets of reflectivity forecasts. One set is generated from performing a number of transformations (in space and intensity) to a given reflectivity field. The second set consists of 8 cases/days of 24hr reflectivity forecasts from wrf2caps, wrf4ncar, and wrf4ncep, all from Spring 2005. The main purpose of the study is to better understand various facets of the three verification methodologies.

Data 1: Fake_perturbed

Fake000 = Analysis from wrf2caps_2005053100.g240.f24.txt .

Fake001 = Shift 3 \rightarrow , -5 \uparrow

Fake002 = Shift 6 \rightarrow , -10 \uparrow

Fake003 = Shift 12 \rightarrow , -20 \uparrow

Fake004 = Shift 24 \rightarrow , -40 \uparrow

Fake005 = Shift 48 \rightarrow , -80 \uparrow

Fake006 = Fake003, $\times 1.5$

Fake007 = Fake003, $-0.05 in.$

Data 2: Sp2005 5/13, 5/14, 5/18, 5/19. 5/25, 6/1, 6/3, 6/4

Methods: Cluster Analysis, Variogram, Optical Flow

Cluster Analysis

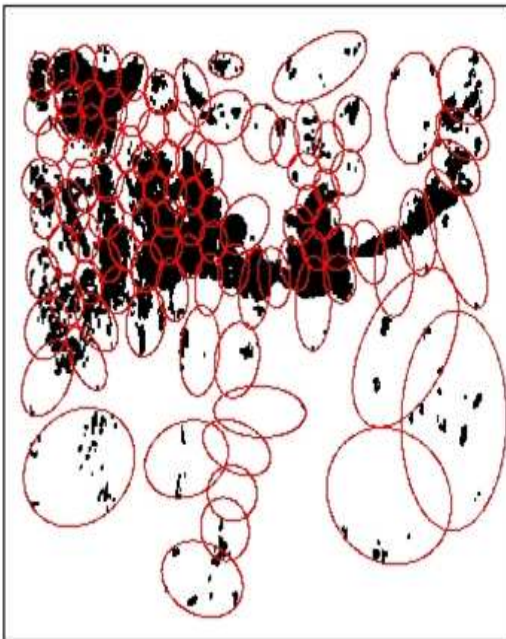
From statistics.

Cluster the *joint* set of a forecast and observation field, in (x,y,z) .

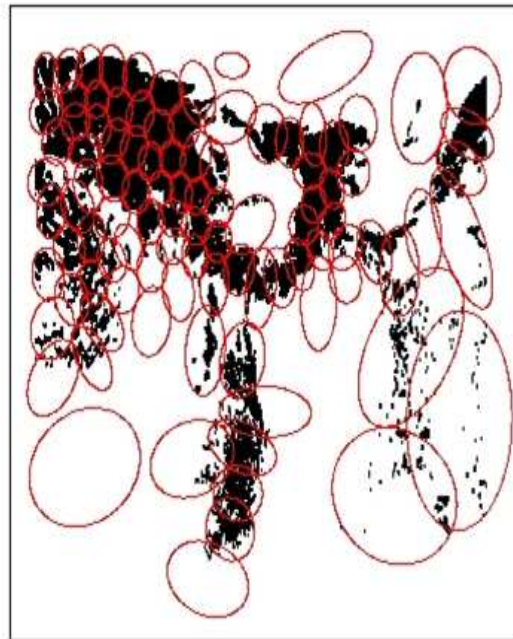
Cluster = object.

“Scale” = Number of clusters.

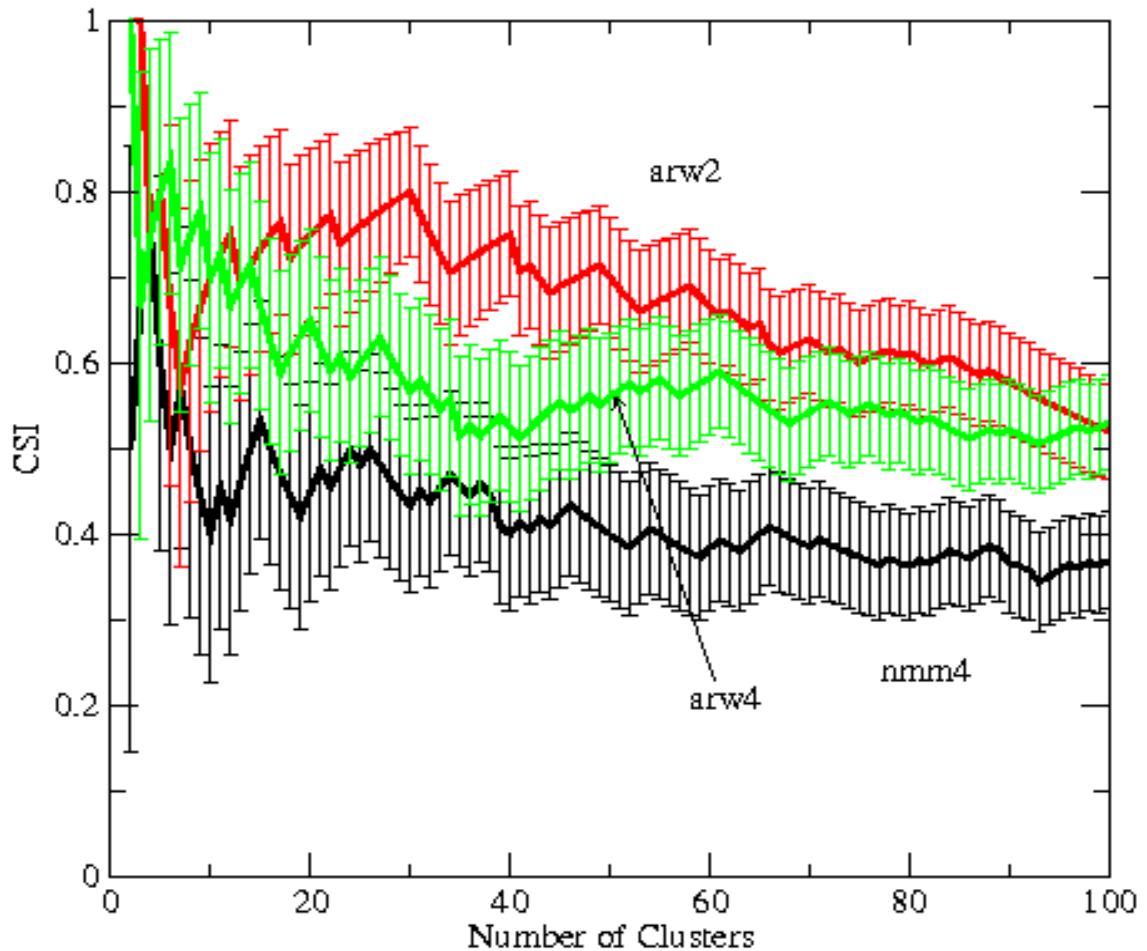
Obs 5/12, with kmeans ellipses



ARW2 5/11 with kmeans ellipses



Main “output”:



E.g., On 5/11 arw2 ([wrf2caps](#)) is better across all scales.

- Marzban, C., S. Sandgathe, and H. Lyons 2008: An Object-oriented Verification of Three NWP Model Formulations via Cluster Analysis: An objective and a subjective analysis. Conditionally accepted at Monthly Weather Review.

- Marzban, C., S. Sandgathe, 2007: Cluster Analysis for Object-Oriented Verification of Fields: A Variation. Accepted by Monthly Weather Review.

- Marzban, C., S. Sandgathe 2006: Cluster analysis for verification of precipitation fields. Wea. Forecasting, Vol. 21, No. 5, 824-838.

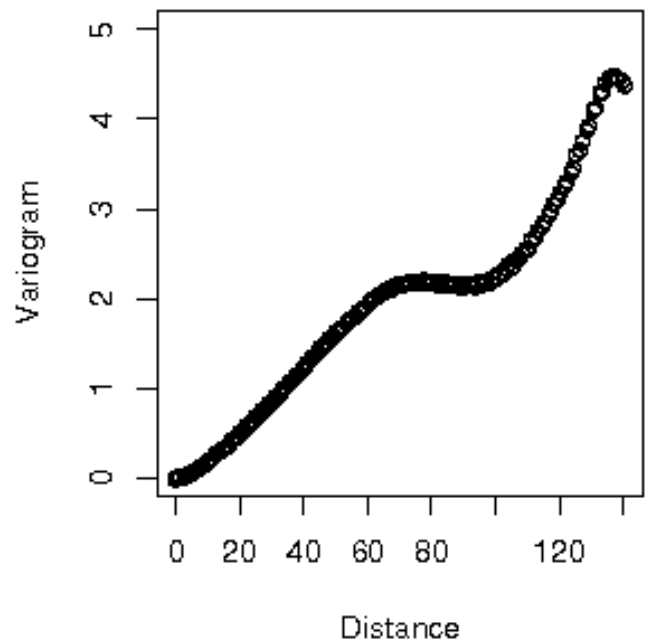
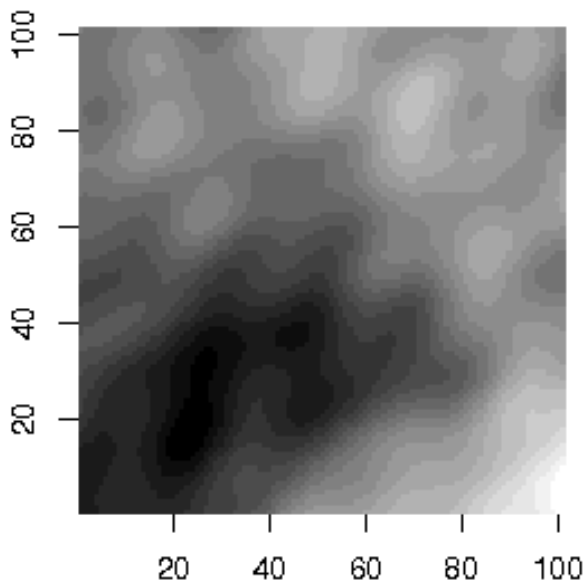
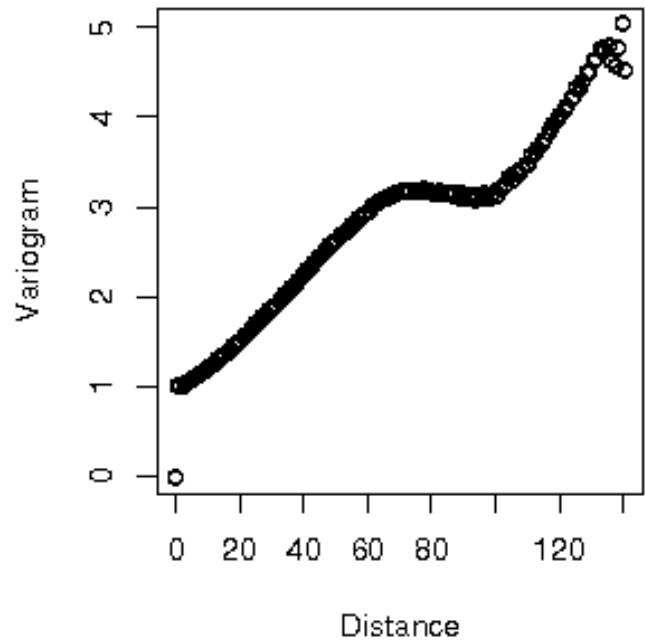
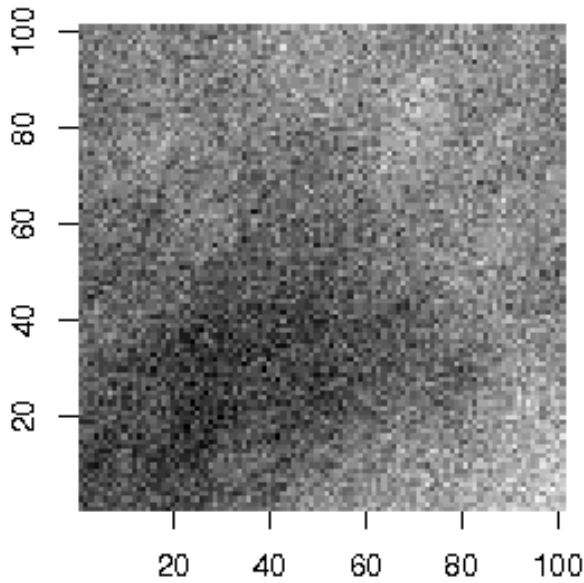
Variogram

From spatial statistics.

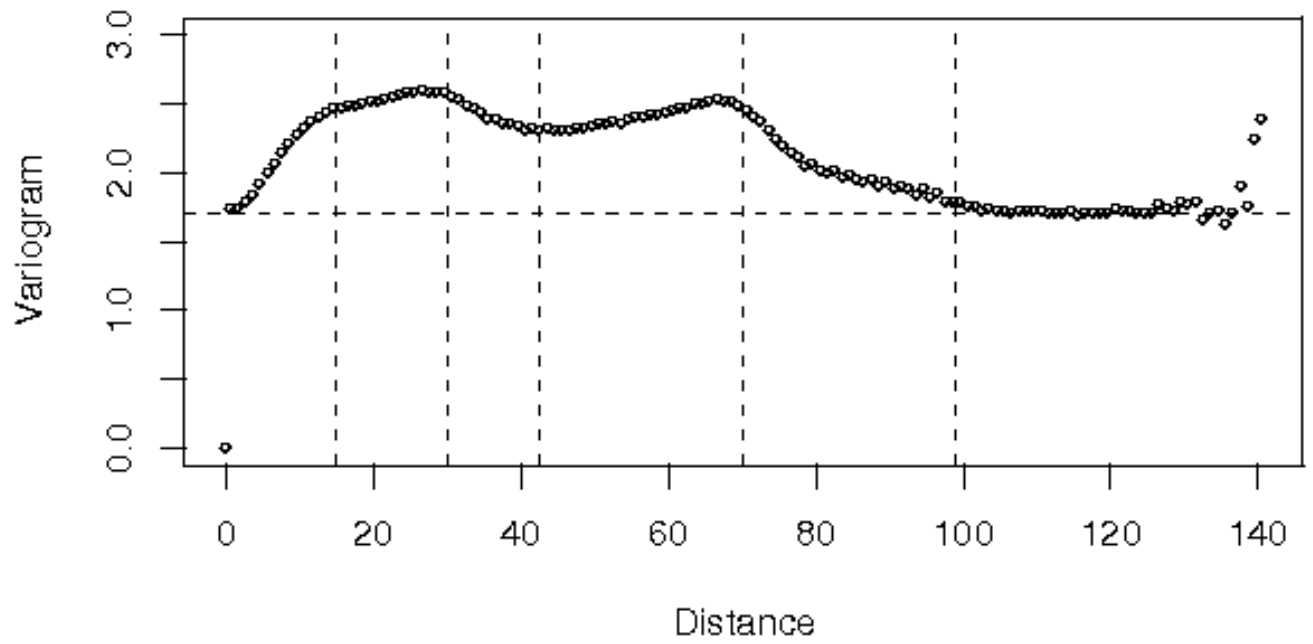
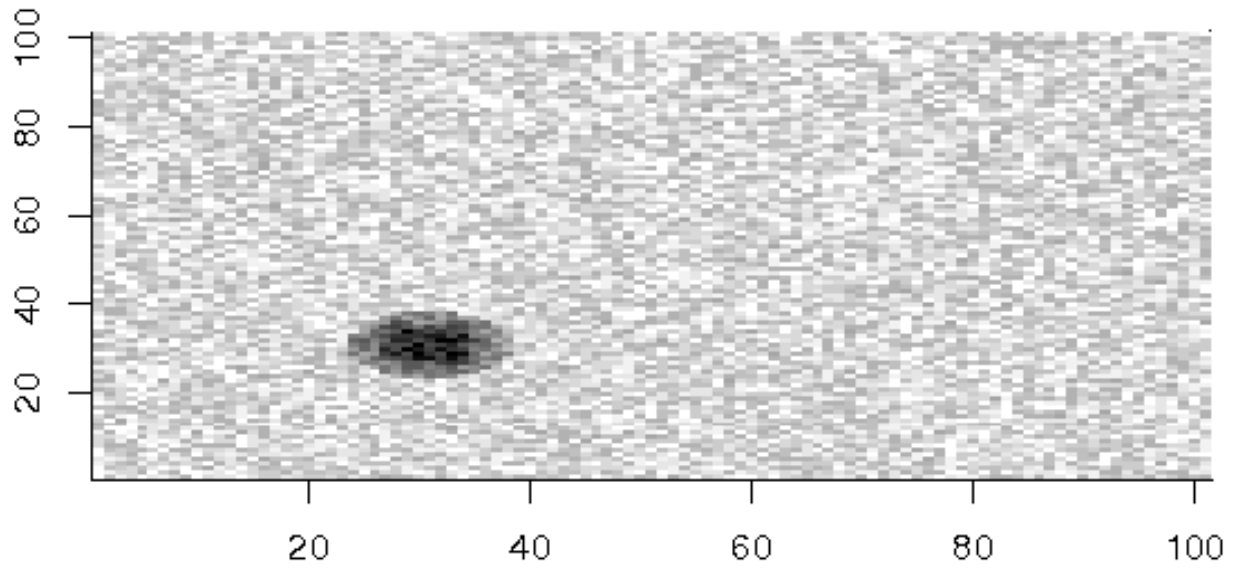
Measures texture.

Scale = Distance between points.

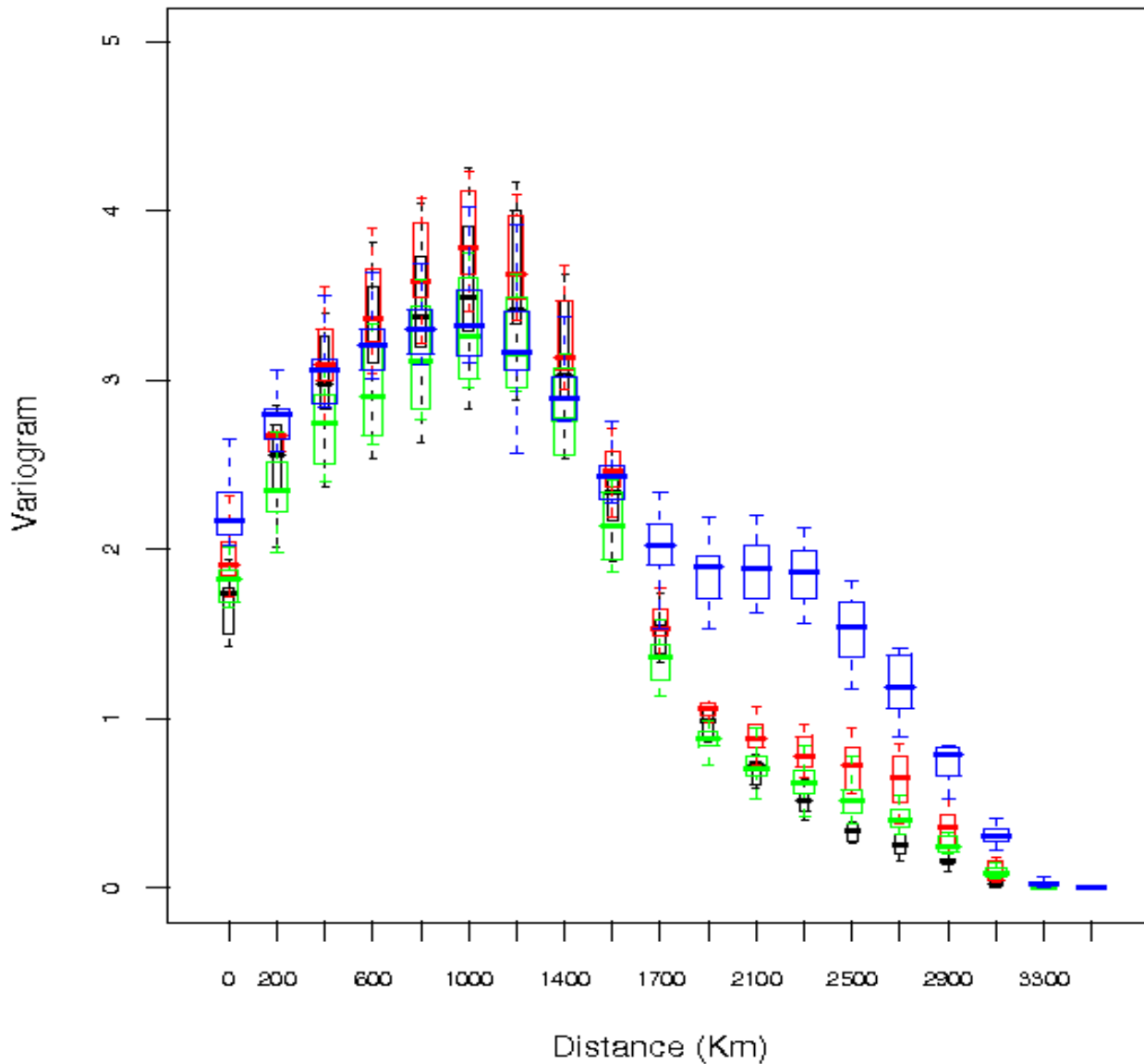
$$\gamma(\text{Distance}) = \frac{1}{2N} \sum_{\{i,j\}_{\text{Distance}}}^N (\mathbf{x}_i - \mathbf{x}_j)^2,$$



The effect of an object and boundary on variogram:



Main “output”:



5/13/2005: observed, wrf2caps, wrf4ncar, wrf4ncep

E.g., On 5/13 wrf4ncep is worse, on larger scales.

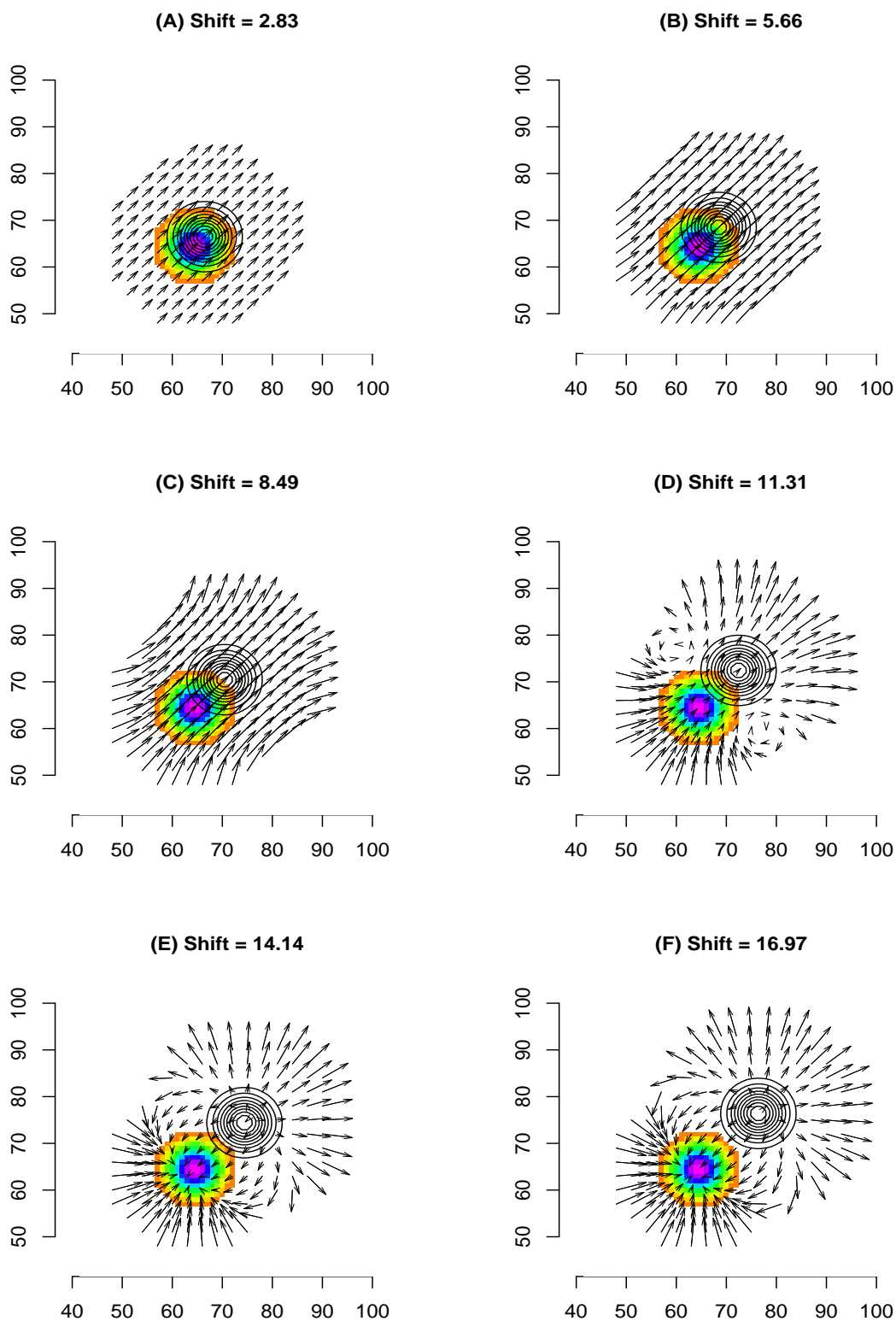
- Marzban, C. and S. Sandgathe 2008: Verification with variograms. Conditionally accepted by Wea. Forecasting.

Optical Flow

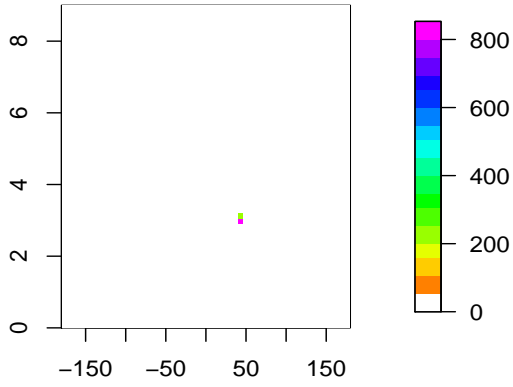
From machine vision/ motion estimation.

Math: 2 images \rightarrow vector field mapping one to the other.

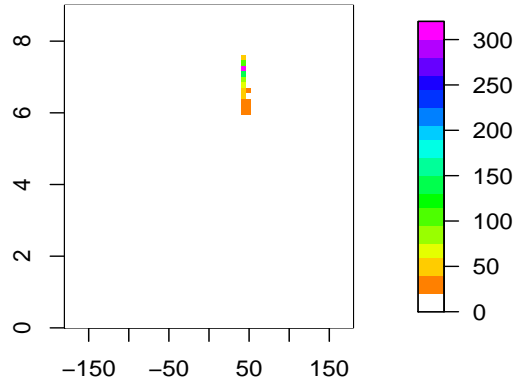
Scale = size of window = W .



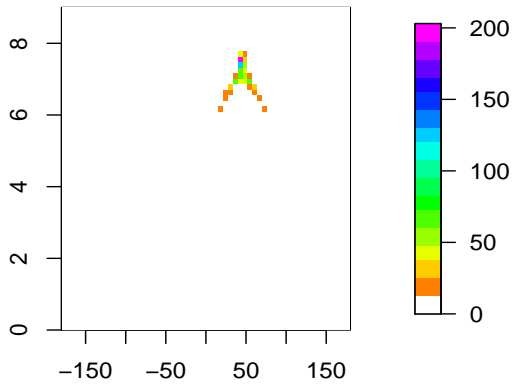
(A) Shift = 2.83



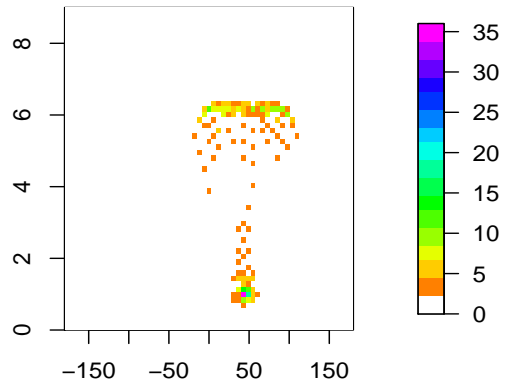
(B) Shift = 5.66



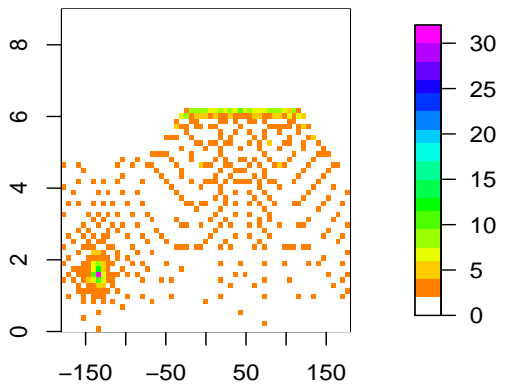
(C) Shift = 8.49



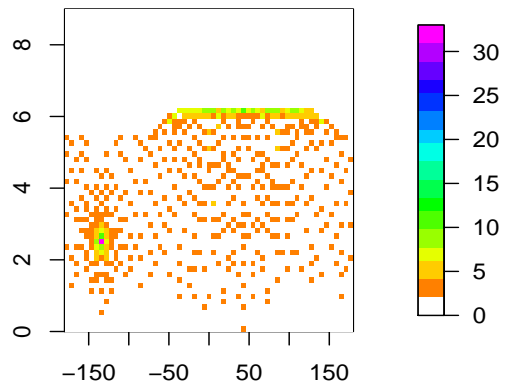
(D) Shift = 11.31



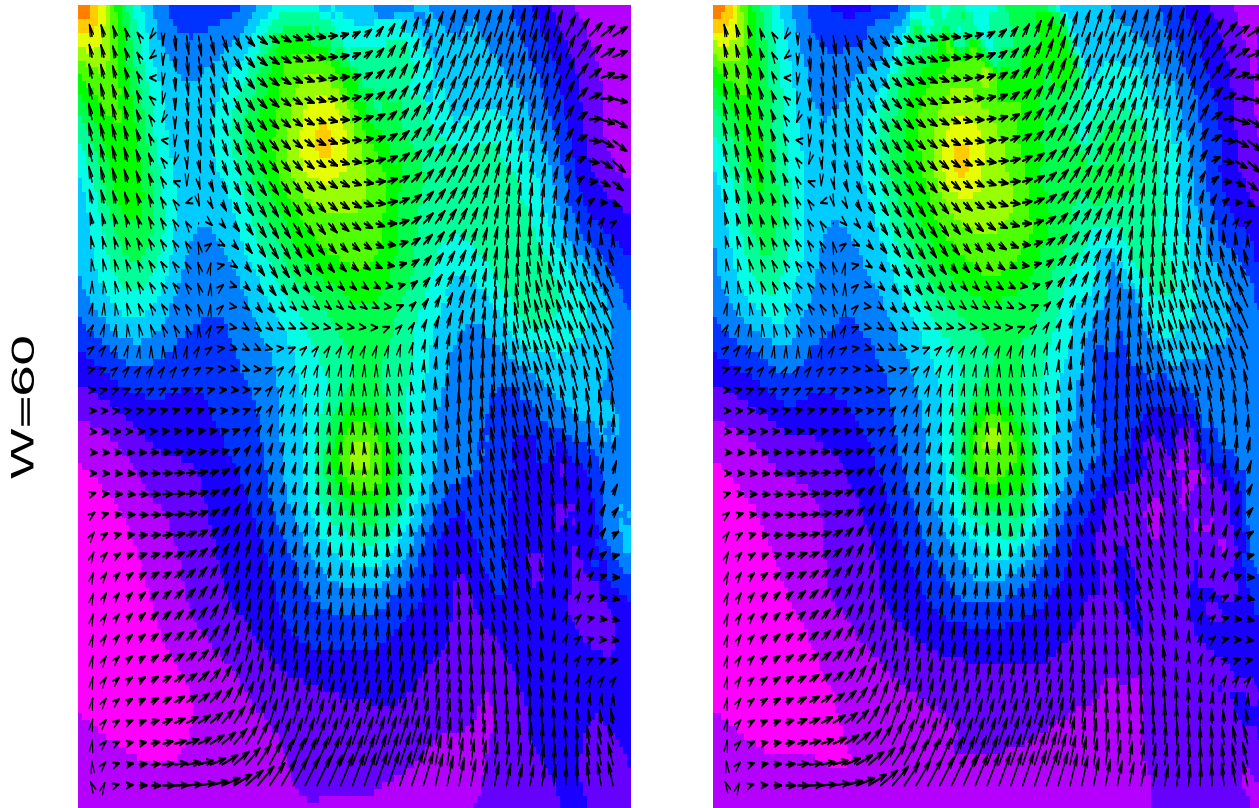
(E) Shift = 14.14



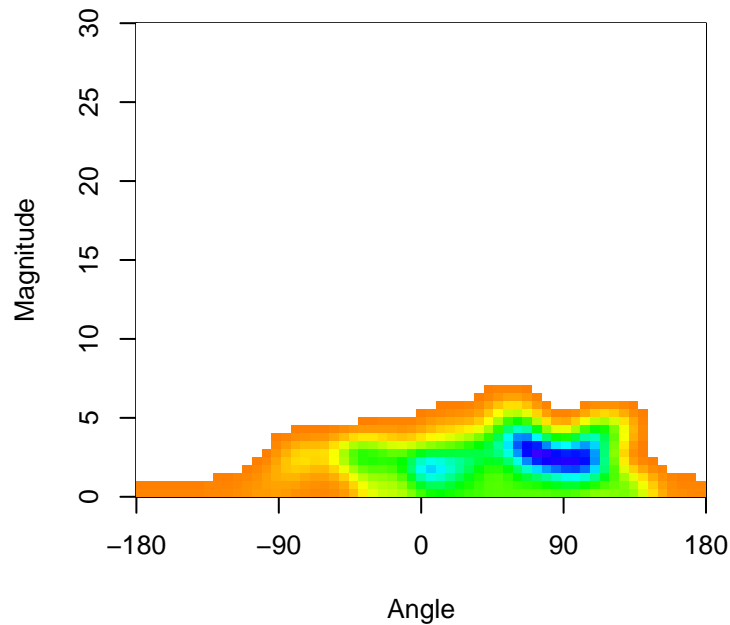
(F) Shift = 16.97



Main “output”:

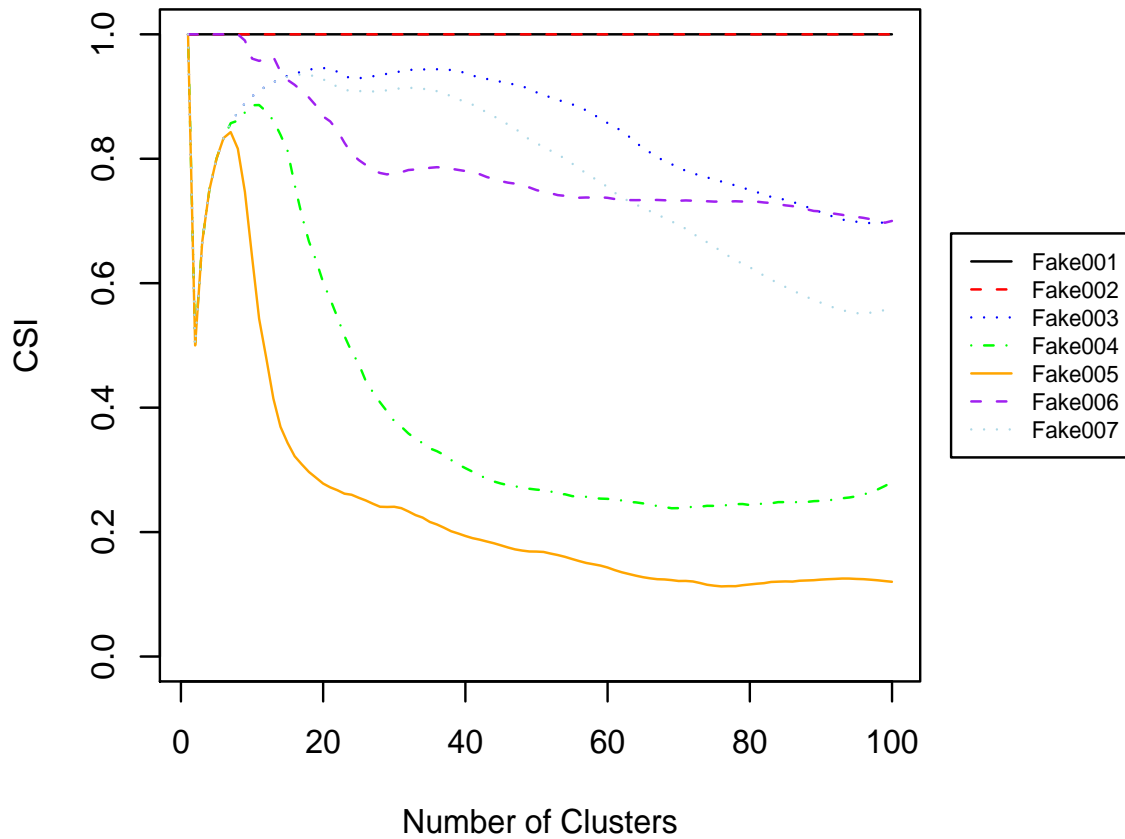


(2) W = 60



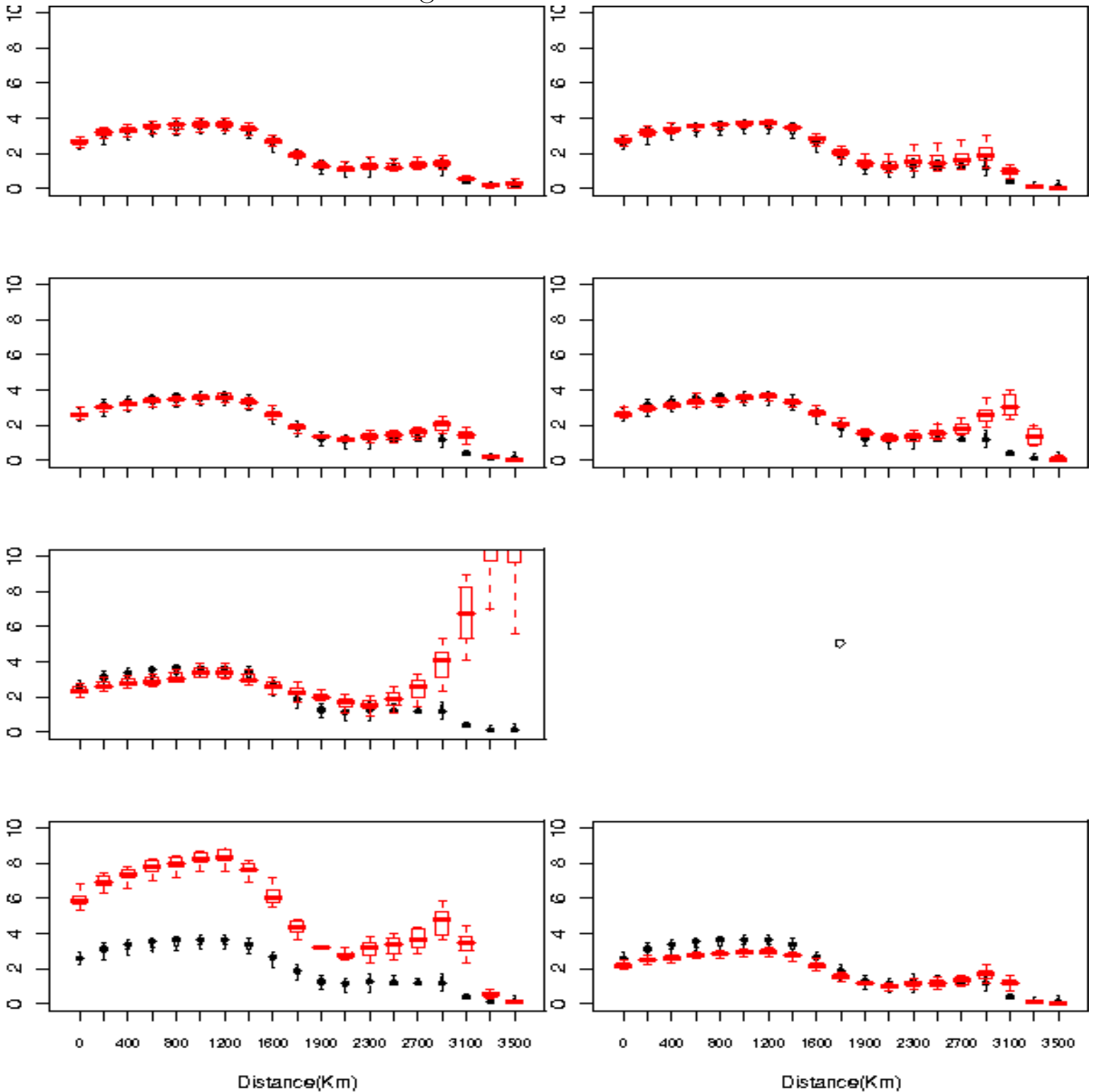
E.g., There is a preponderance of vectors in the north direction (direction error), about 3-4 grid points in length (displacement error).

Cluster Analysis for Fake Perturbed



- CSI falls (bad) with larger shifts; more so on larger scales (left) than on smaller scales (right).
- Similarly, for additive error in intensity.
- For multiplicative error in intensity, CSI falls but differently.

Variogram for Fake Perturbed

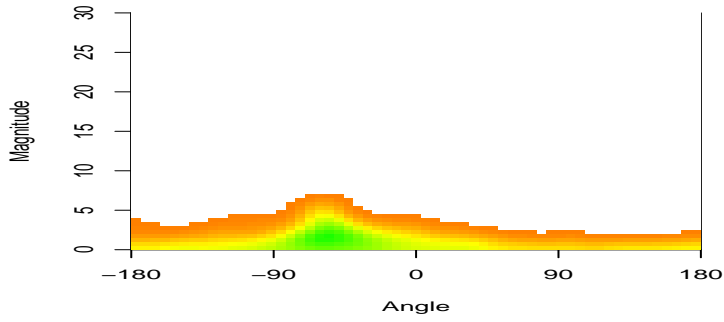


- Variogram is unaffected by shifts (except on large scales - edge effect)
- It increases (bad) with multiplicative error in intensity.
- Mostly unaffected by additive error in intensity.

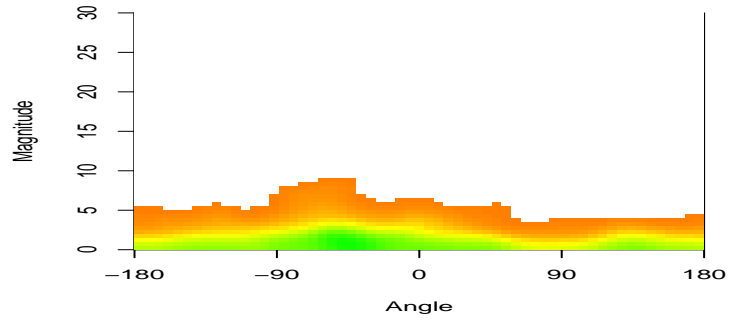
Optical Flow for Fake Perturbed

(3 →, 5 ↓ ⇒ $\theta = -59^\circ$, magnitude = 5.8)

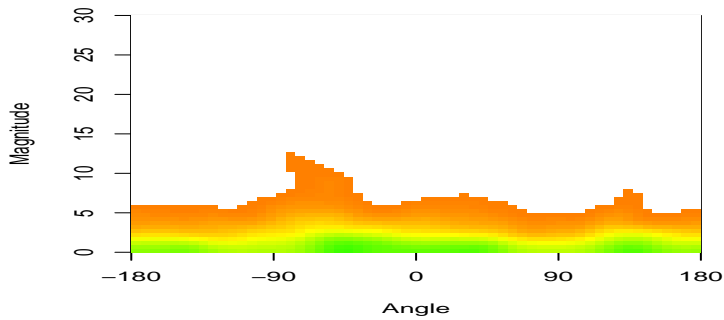
(1) $W = 20$



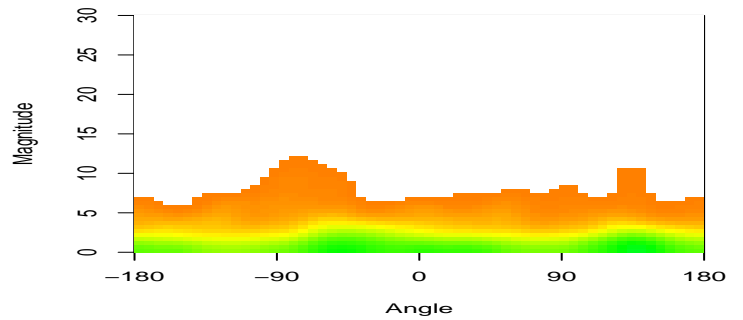
(2) $W = 20$



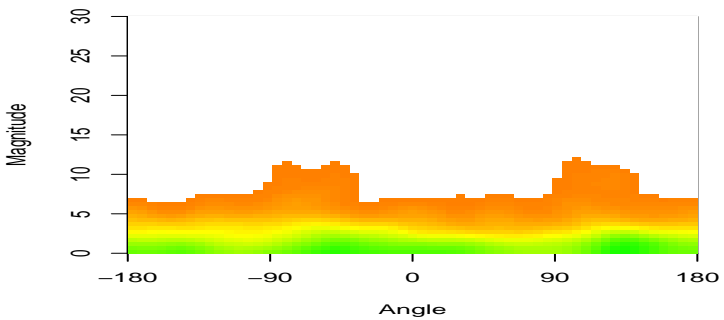
(3) $W = 20$



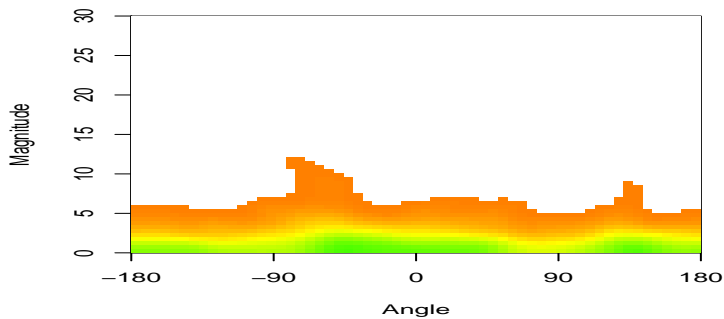
(4) $W = 20$



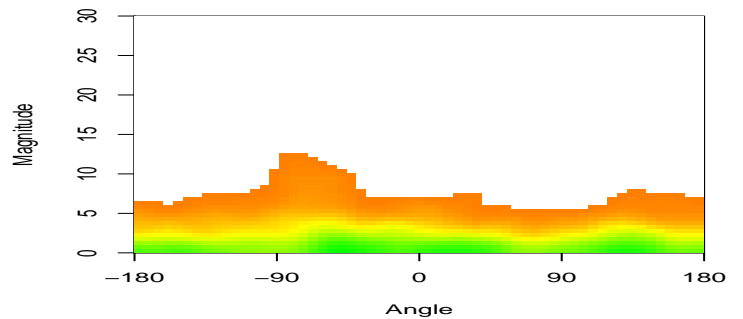
(5) $W = 20$



(6) $W = 20$



(7) $W = 20$



- There is a preponderance of vectors in the south-south-east direction.
- Magnitude of OF vectors is unaffected by multiplicative error in intensity.
- but increases (bad) with additive error.

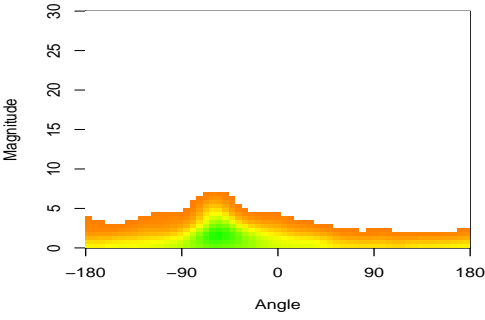
Shift (and Intensity error) versus Scale

Small Scale

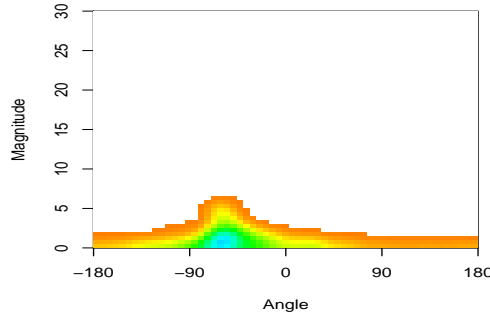
Medium Scale

Large Scale

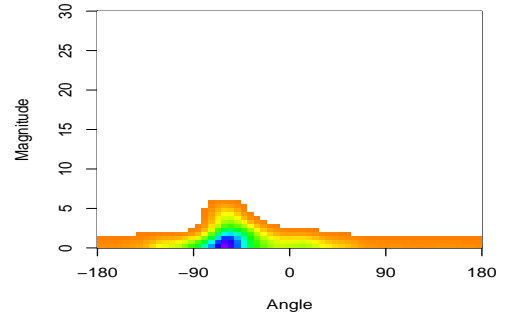
(1) $W = 20$



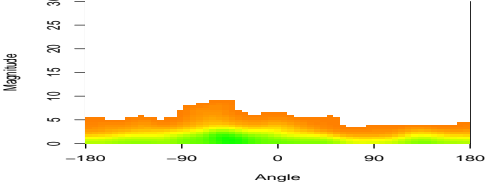
(1) $W = 40$



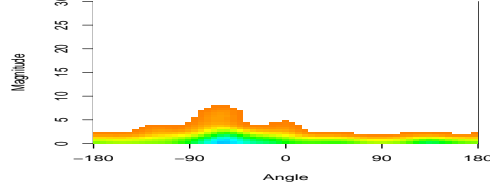
(1) $W = 60$



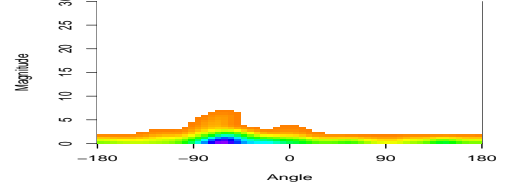
(2) $W = 20$



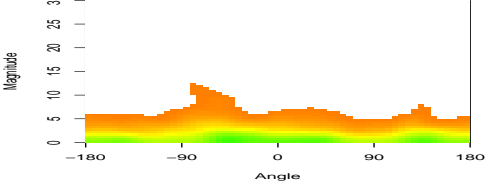
(2) $W = 40$



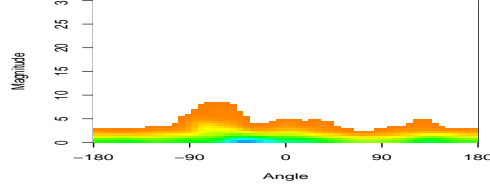
(2) $W = 60$



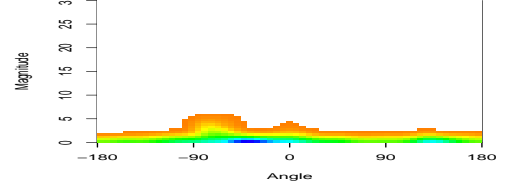
(3) $W = 20$



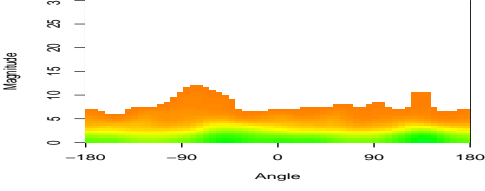
(3) $W = 40$



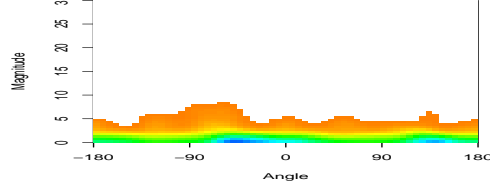
(3) $W = 60$



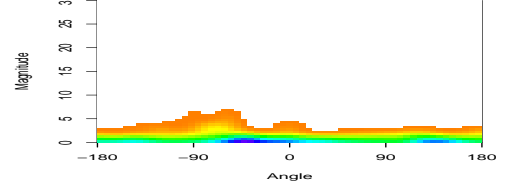
(4) $W = 20$



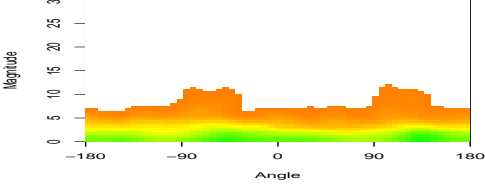
(4) $W = 40$



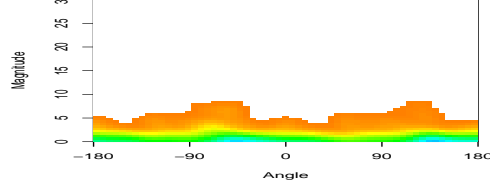
(4) $W = 60$



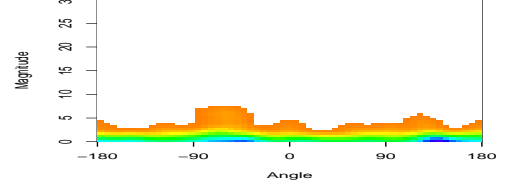
(5) $W = 20$



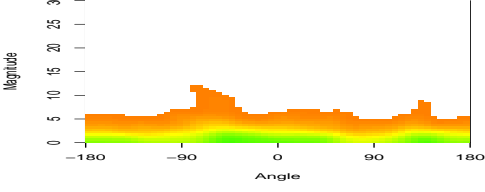
(5) $W = 40$



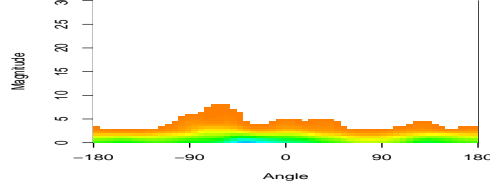
(5) $W = 60$



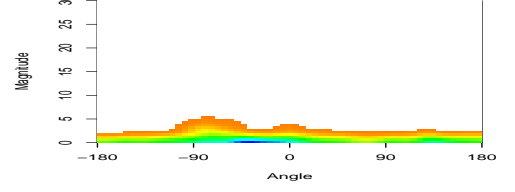
(6) $W = 20$



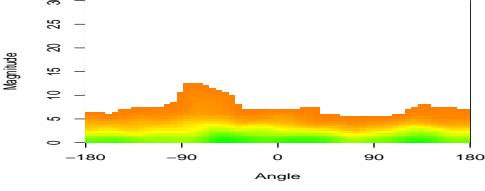
(6) $W = 40$



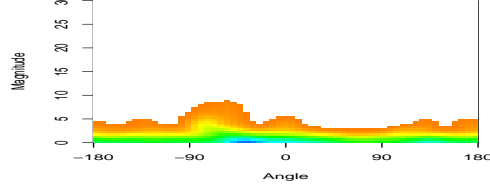
(6) $W = 60$



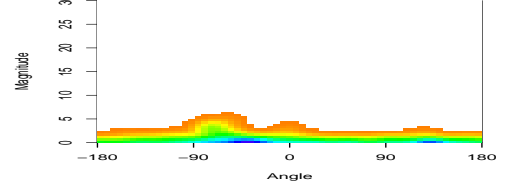
(7) $W = 20$



(7) $W = 40$

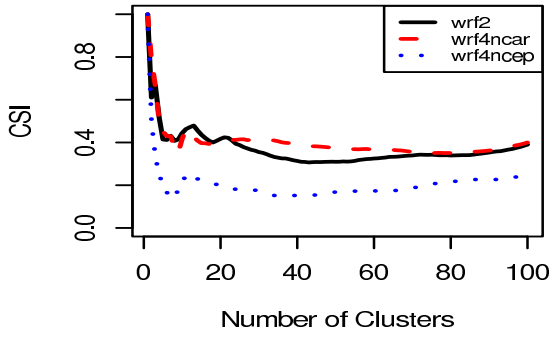


(7) $W = 60$

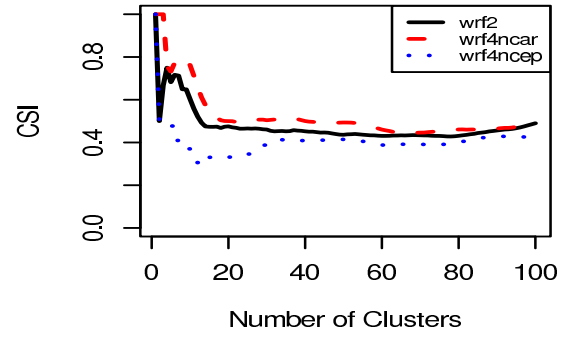


Cluster Analysis for sp2005

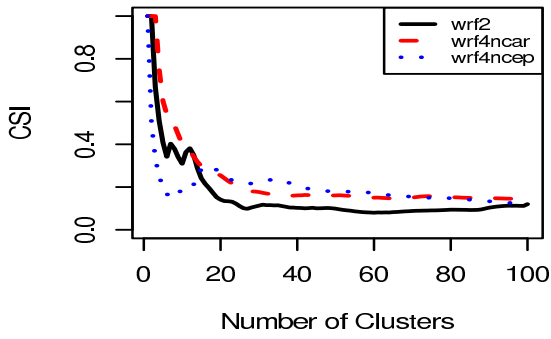
Obs 20050513



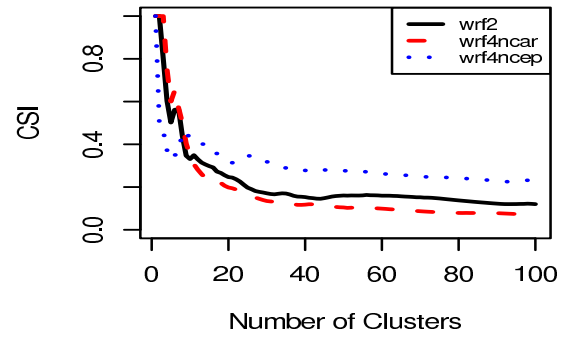
Obs 20050514



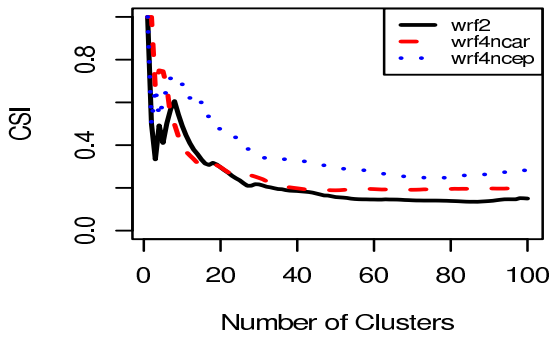
Obs 20050518



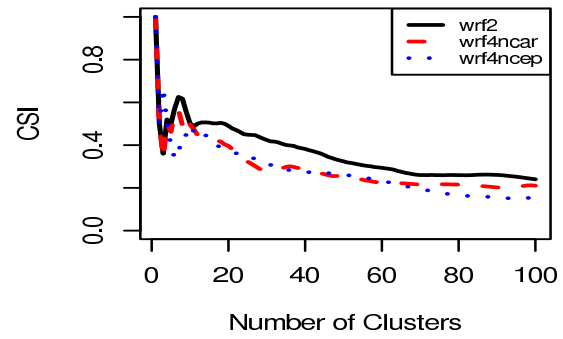
Obs 20050519



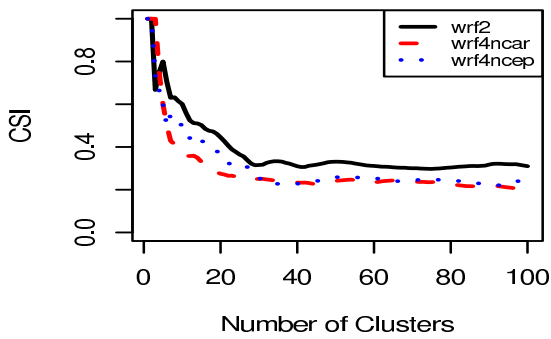
Obs 20050525



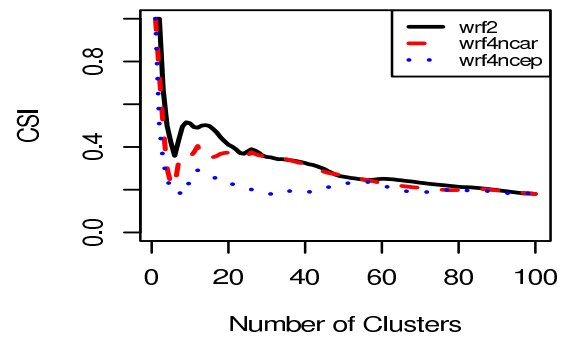
Obs 20050601



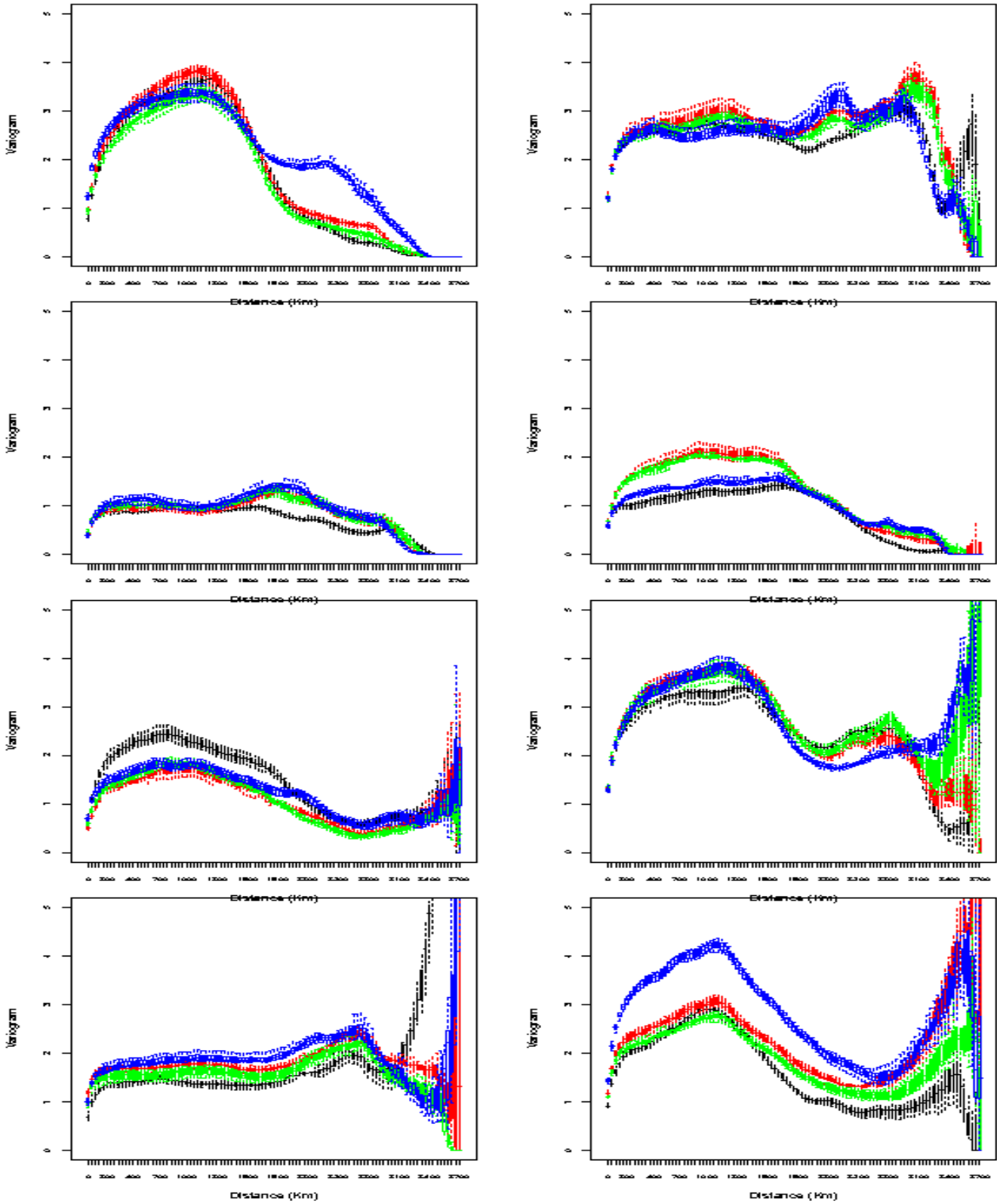
Obs 20050603



Obs 20050604



Variogram for sp2005



observed, wrf2caps, wrf4ncar, wrf4ncep

Conclusion

Based on Fake_perturbed data:

- Cluster Analysis properly captures displacement and intensity errors on different spatial scales.
- Variogram measures mostly multiplicative error in intensity.
- Optical flow measures mostly displacement error, for now.

Based on sp2005 data:

- Too complex to summarize.
- But, all is good!