



# A Nested Tracking Approach for Reducing the Slow Speed Bias in Atmospheric Motion Vectors (AMVs)

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# Topics

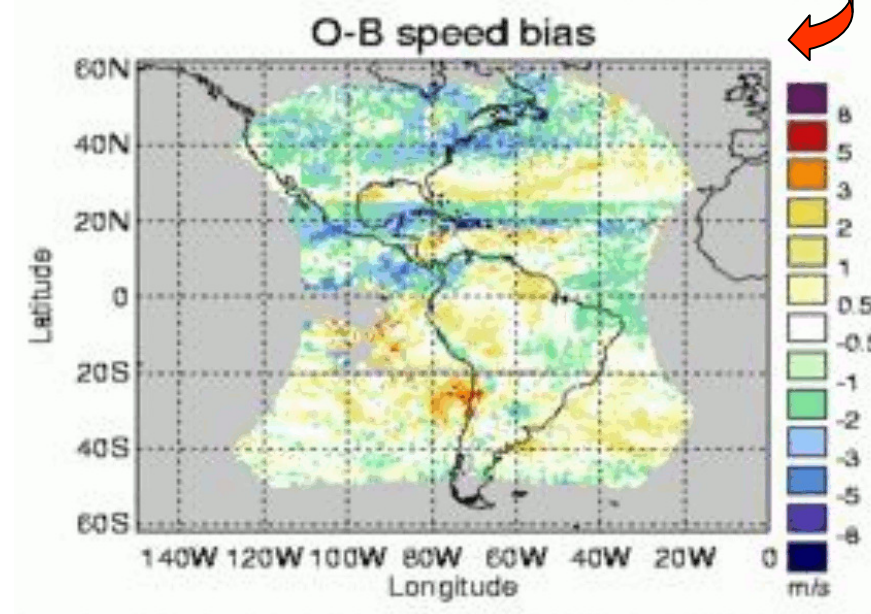
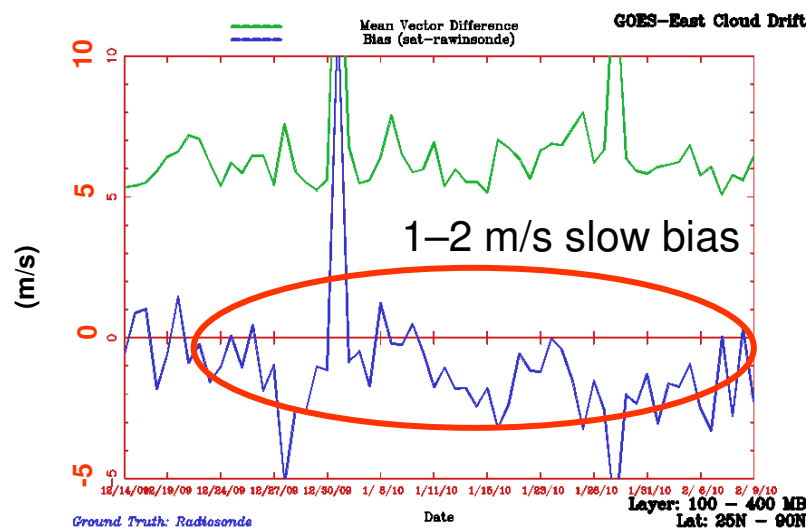


- **Description of Problem**
  - Slow speed bias at mid and upper levels – most pronounced in extratropics during the winter season
- **Impact of box size and time interval on magnitude of bias**
  - Influences height assignment and AMV speed
- **Nested tracking approach for reducing slow speed bias**
  - Replace an average or multi-layer motion with a local motion
  - Links tracking to height assignment
  - Addresses both issues
- **Results from Testing**
- **Summary, Future Plans, and Opportunities**

*Note: This work is part of AMV algorithm development for the GOES-R ABI instrument*

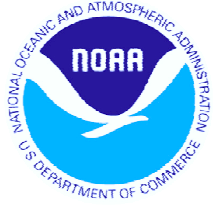
# Description of Problem

- Numerous studies have highlighted the slow speed bias problem
  - See for example the NWP SAF web page maintained by the Met Office
  - ([http://www.metoffice.gov.uk/research/interproj/nwpsaf/satwind\\_report/analysis.html](http://www.metoffice.gov.uk/research/interproj/nwpsaf/satwind_report/analysis.html))



- Two leading causes include:

- Bad height (too high)
- Derived motion is an average of motion at multiple levels and/or different scales



# Impact of Box Size and Time Interval on Magnitude of Speed Bias

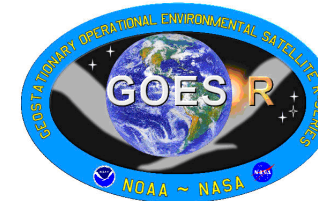


- Earlier studies by Sohn and Borde (2008) have shown a link between box size and magnitude of slow bias. Their results showed:
  1. A smaller box produces faster winds
  2. A smaller box produces lower heights

Both factors reduce the slow bias!
- Above work was extended by present authors to include varying time intervals (5-, 10-, 15- and 30-minute intervals)

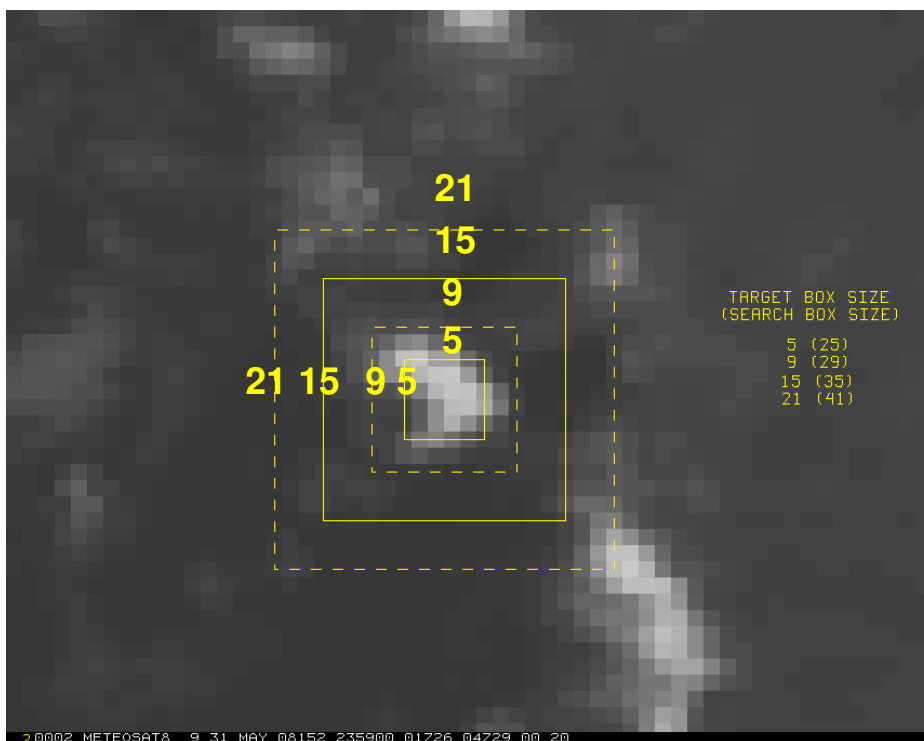


# Impact of Box Size and Time Interval on Magnitude of Speed Bias



## Setup of Study

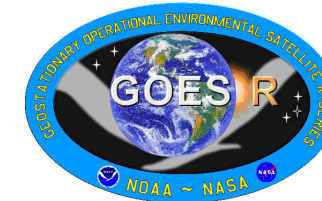
- Winds were generated using Meteosat-8 rapid scan imagery for the period June 1 – 8, 2008.
- Target locations were fixed while box size and time interval varied.



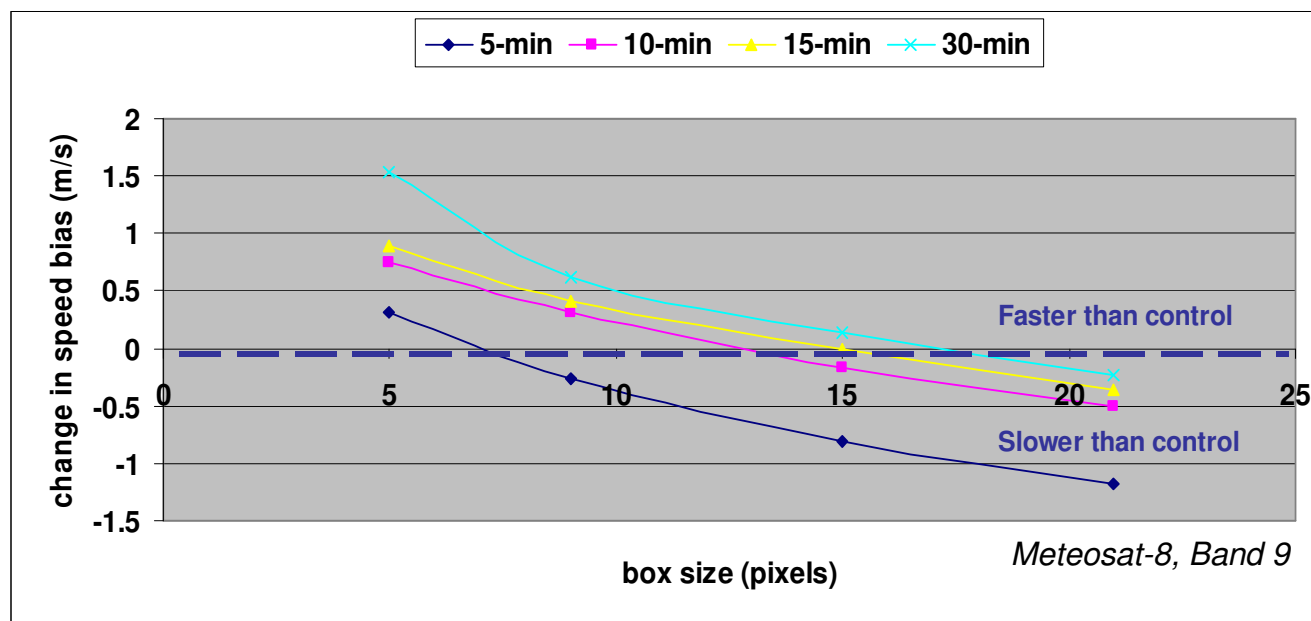
- **Target Box Size**
  - 5x5, 7x7, 9x9, 15x15, 21x21
- **Time Intervals:**
  - 5, 10, 15, 30 minutes



# Impact of Box Size and Time Interval on Magnitude of the Speed Bias



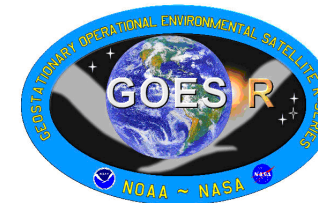
**Results** – *relative to control run (15x15 box, 15-minute loop interval)*



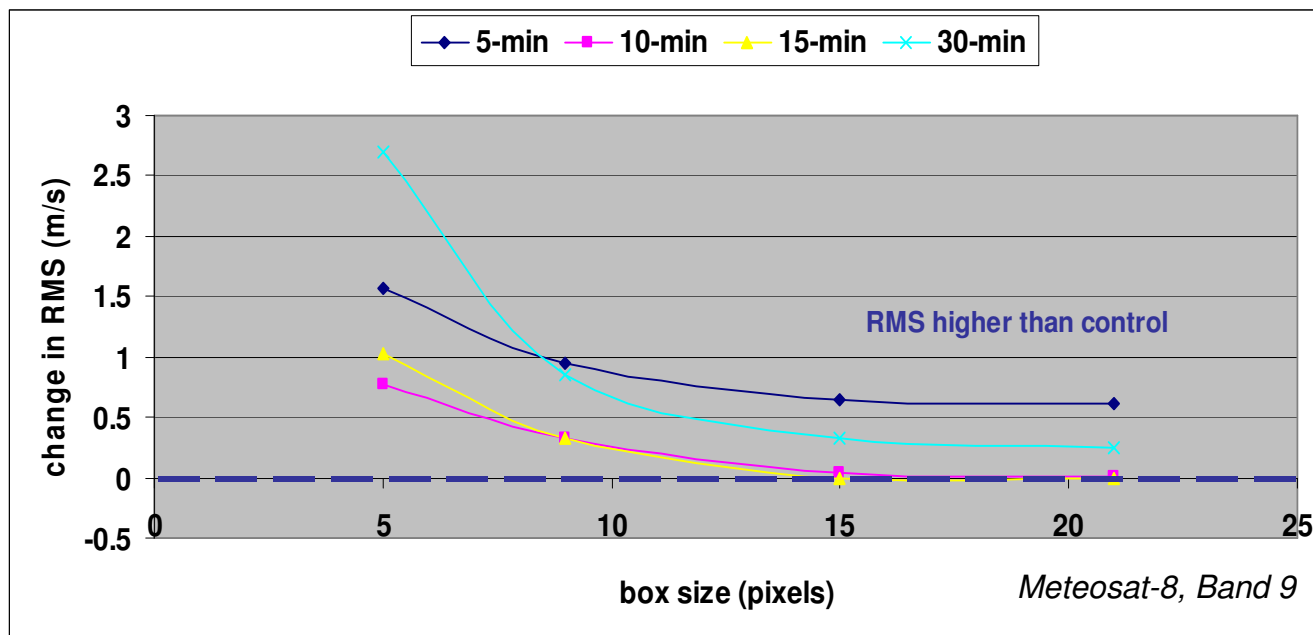
- A larger box yields a larger slow bias – consistent with Sohn and Borde (2008)
  - Argues for small box to reduce speed bias
- Larger time interval also reduces slow bias – new result



# Impact of Box Size and Time Interval on the RMS



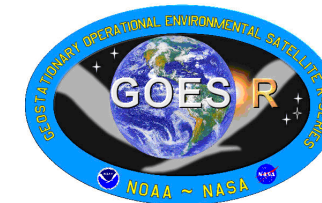
**Results** – relative to control run (15x15 box, 15-minute loop interval)



- A larger box reduces the RMS – largest box tested was 21x21 pixels
  - Argues against using a small box



# Nested Tracking Approach for Reducing Slow Speed Bias

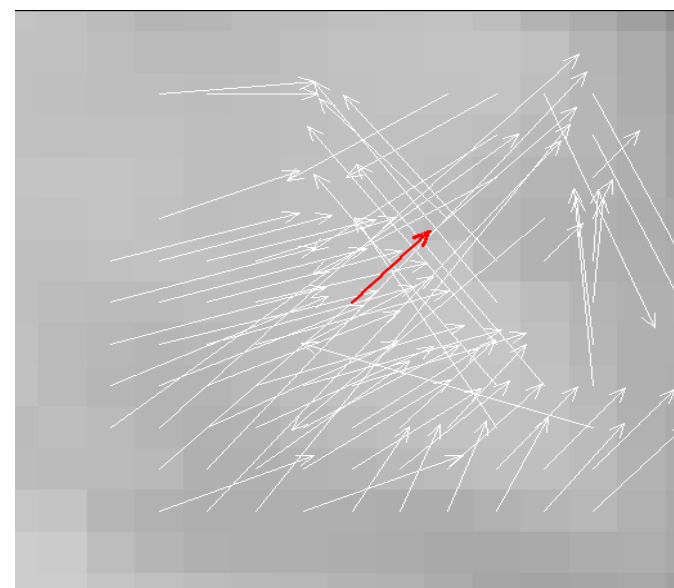
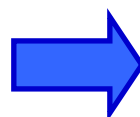
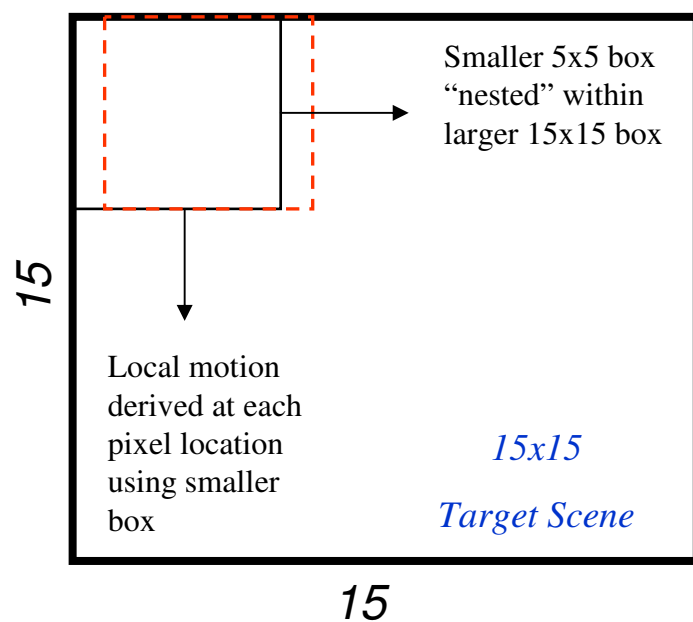


## Challenge:

Use smallest box possible to retain fast wind speeds without increasing the RMS

## Solution:

Use a small 5x5 box “nested” within larger box



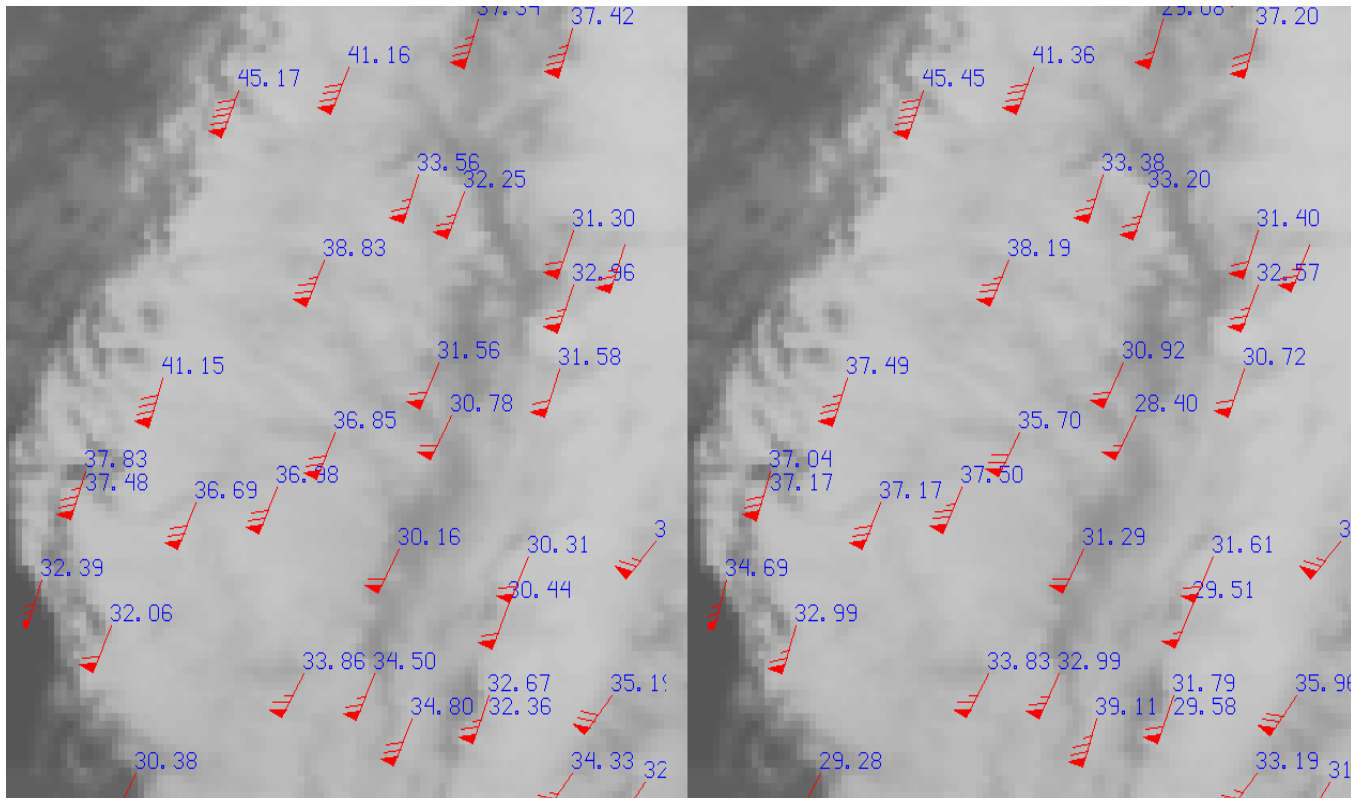




# Nested Tracking Approach for Reducing Slow Speed Bias



How does the average motion of all the 5x5 AMV solutions compare to a single AMV solution derived from a 15x15 box?



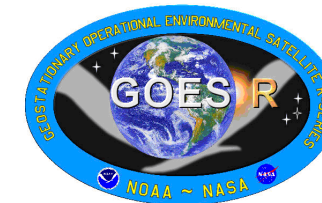
- Note close agreement between the two vector fields.
- Confirms that estimate from larger box is an average of local motion
  - From different levels
  - From different scales

00Z June 1, 2008

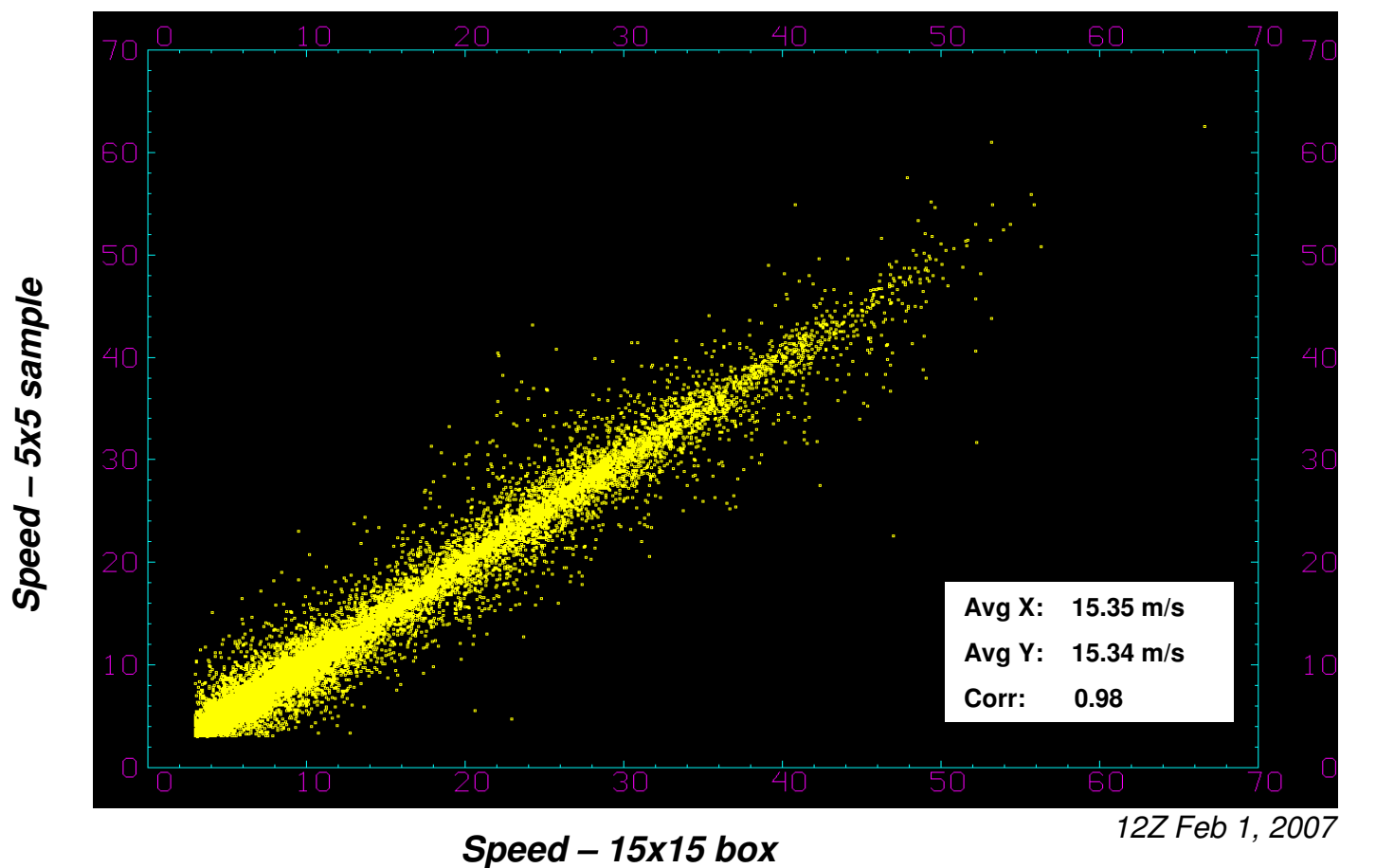
Meteosat-8, Band 9



# Nested Tracking Approach for Reducing Slow Speed Bias



How does average speed of all the 5x5 AMV solutions compare to a single AMV speed derived from a 15x15 box?



12Z Feb 1, 2007

Meteosat-8, Band 9



# Nested Tracking Approach for Reducing Slow Speed Bias



## How can we use local motion vector field?

- Need to be able to separate noise from dominant motion
- Want to link pixels driving the tracking solution with the height assignment
  - Same goal as Borde and Oyama (2008), but different approach

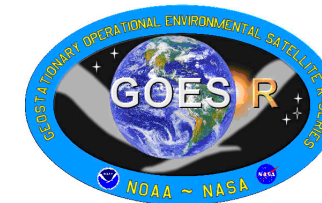
## Cluster analysis of displacements is one way

- Use density-based cluster analysis called DBSCAN\*\*
  - Locates regions of high density that are separated from one another by regions of low density
  - Very effective at identifying “noise”

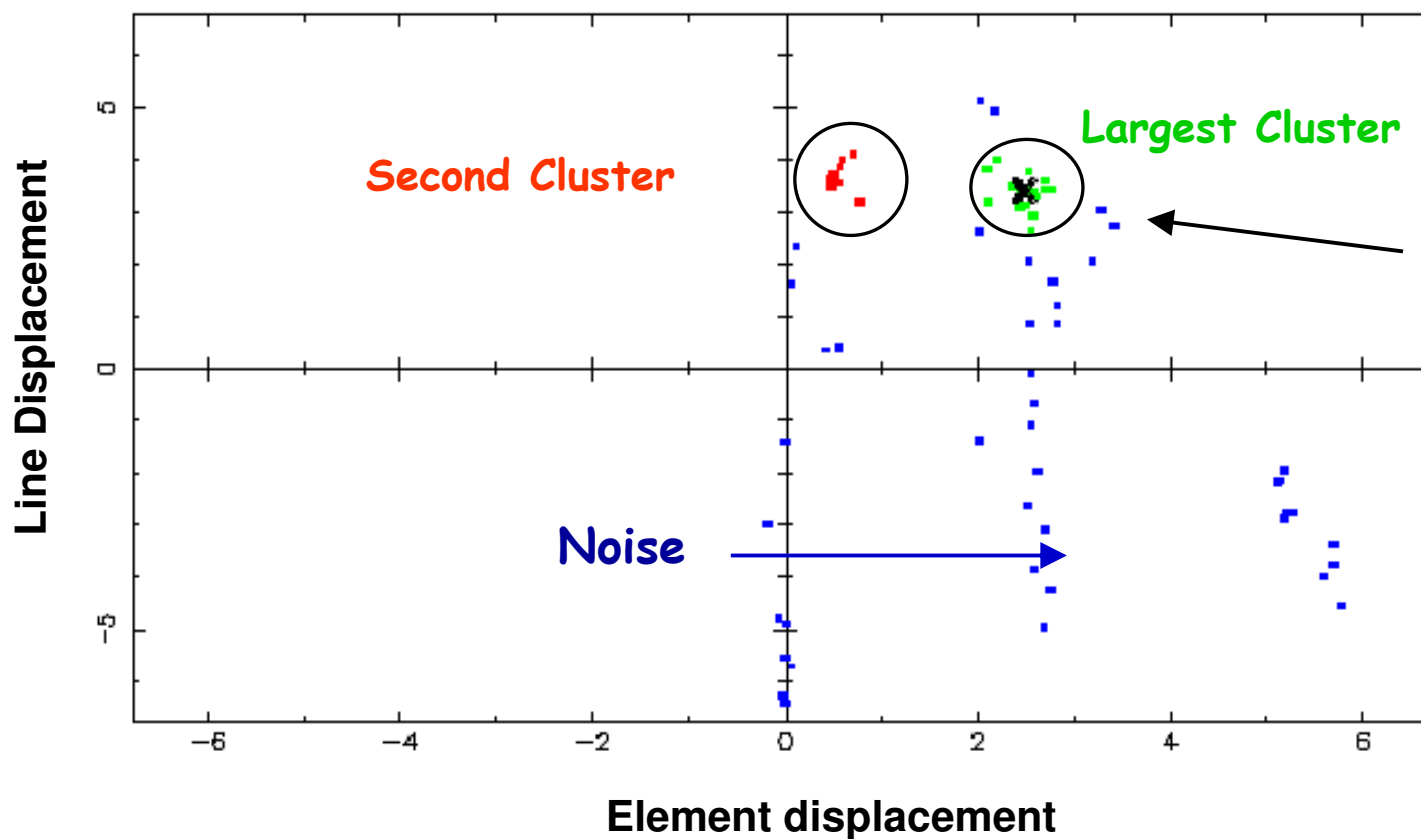
\*\*Ester, M., H.-P. Kriegel, J. Sander and X. Xu (1996): A Density-Based Algorithm for Discovering Clusters in Large Spatial Databases with Noise. In Proceedings of 2nd International Conference on Knowledge Discovery and Data Mining (KDD-96), Portland, Oregon, USA, 226-231



# Nested Tracking Approach for Reducing Slow Speed Bias



**DBSCAN example:**



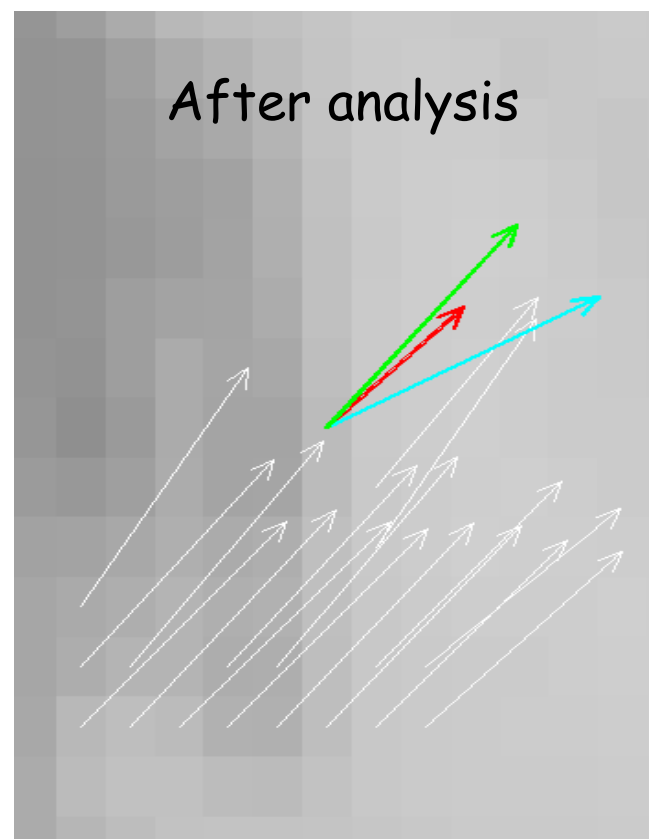
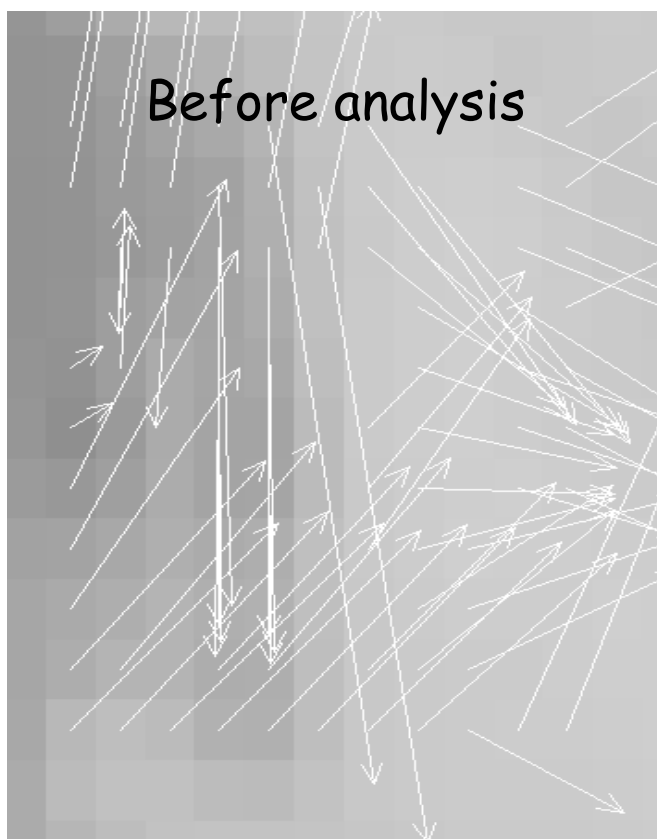
**X** – Average displacement of points in cluster



# Nested Tracking Approach for Reducing Slow Speed Bias



## Resulting vector field:



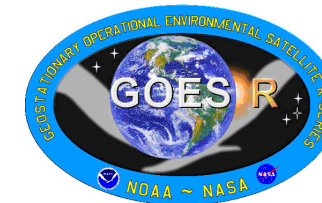
**Motion of whole box**  
**SPD: 25.0**

**Average of largest cluster**  
**SPD: 39.8**

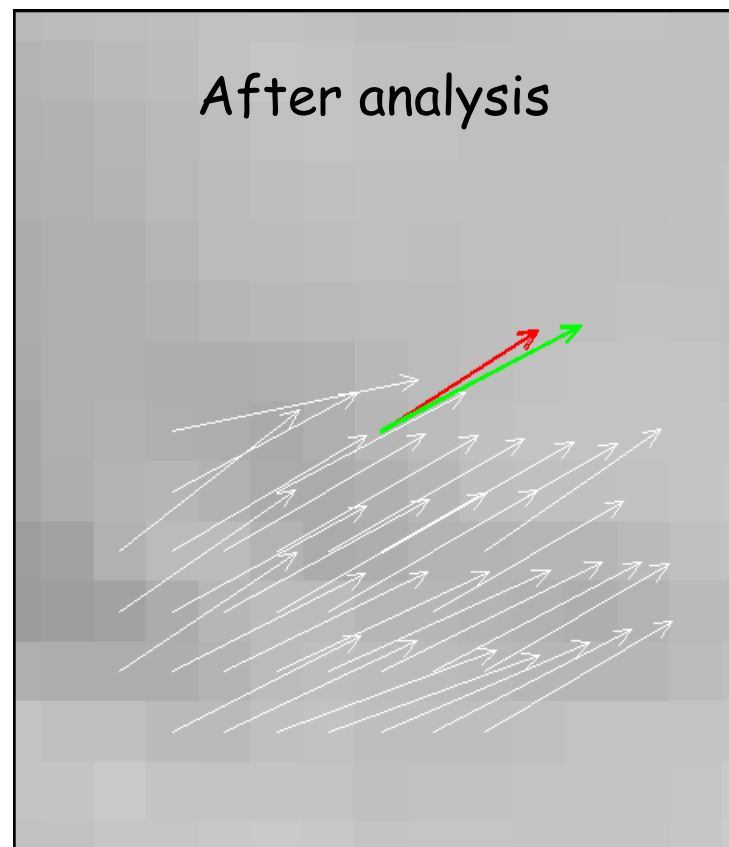
**Forecast**  
**SPD: 38.9**



# Nested Tracking Approach for Reducing Slow Speed Bias



## Resulting vector field:



**Motion of whole box**  
**SPD: 22.3**

**Average of largest cluster**  
**SPD: 27.6**

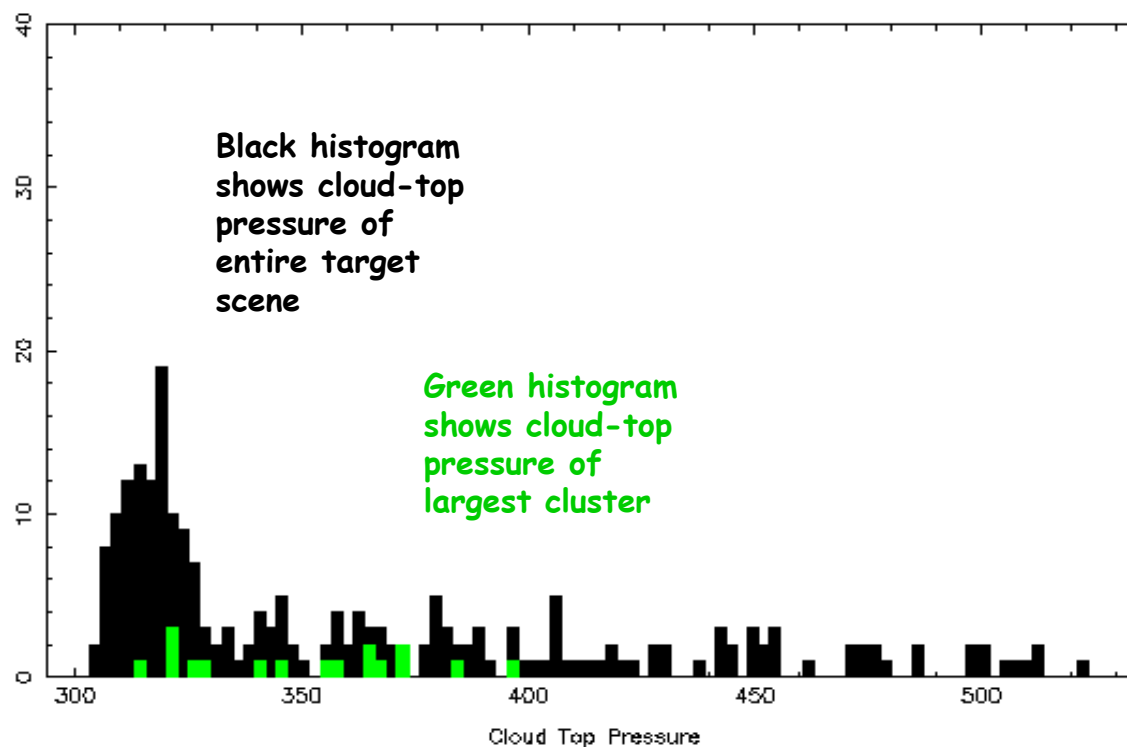


# Nested Tracking Approach for Reducing Slow Speed Bias



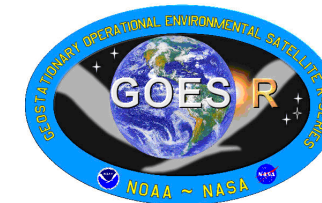
## Linking tracking to height assignment

- Use cloud height of pixels in largest cluster





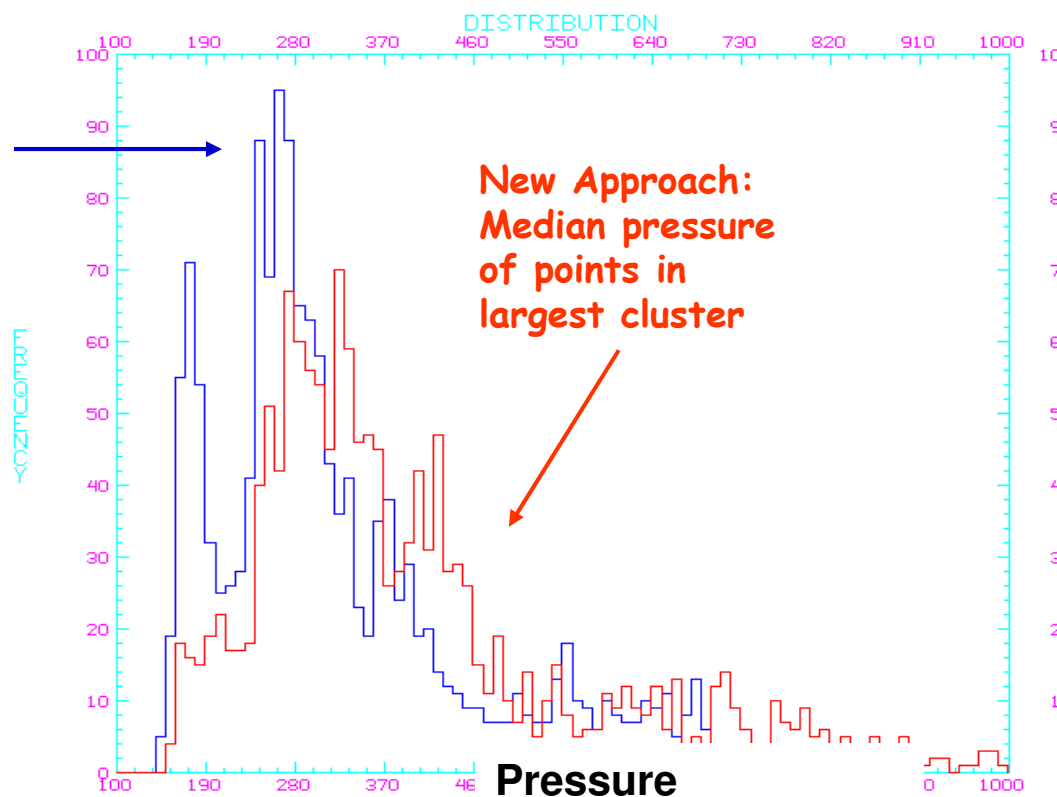
# Nested Tracking Approach for Reducing Slow Speed Bias



## Linking tracking to height assignment (cont.)

- Impact is to push heights lower in the atmosphere

**Old Approach:**  
Coldest 20% of pixels in 15x15 box



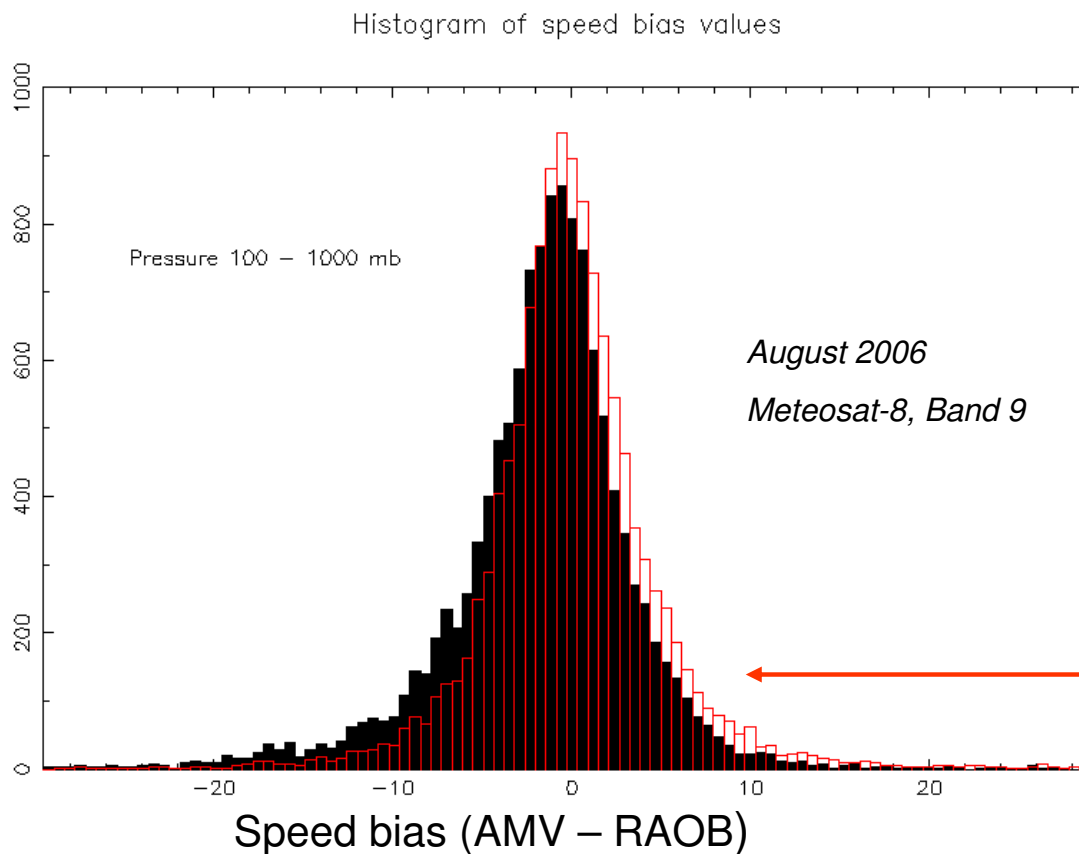




# Results from Testing



Slow bias versus radiosonde is greatly reduced



Black histogram shows control

Red histogram shows test

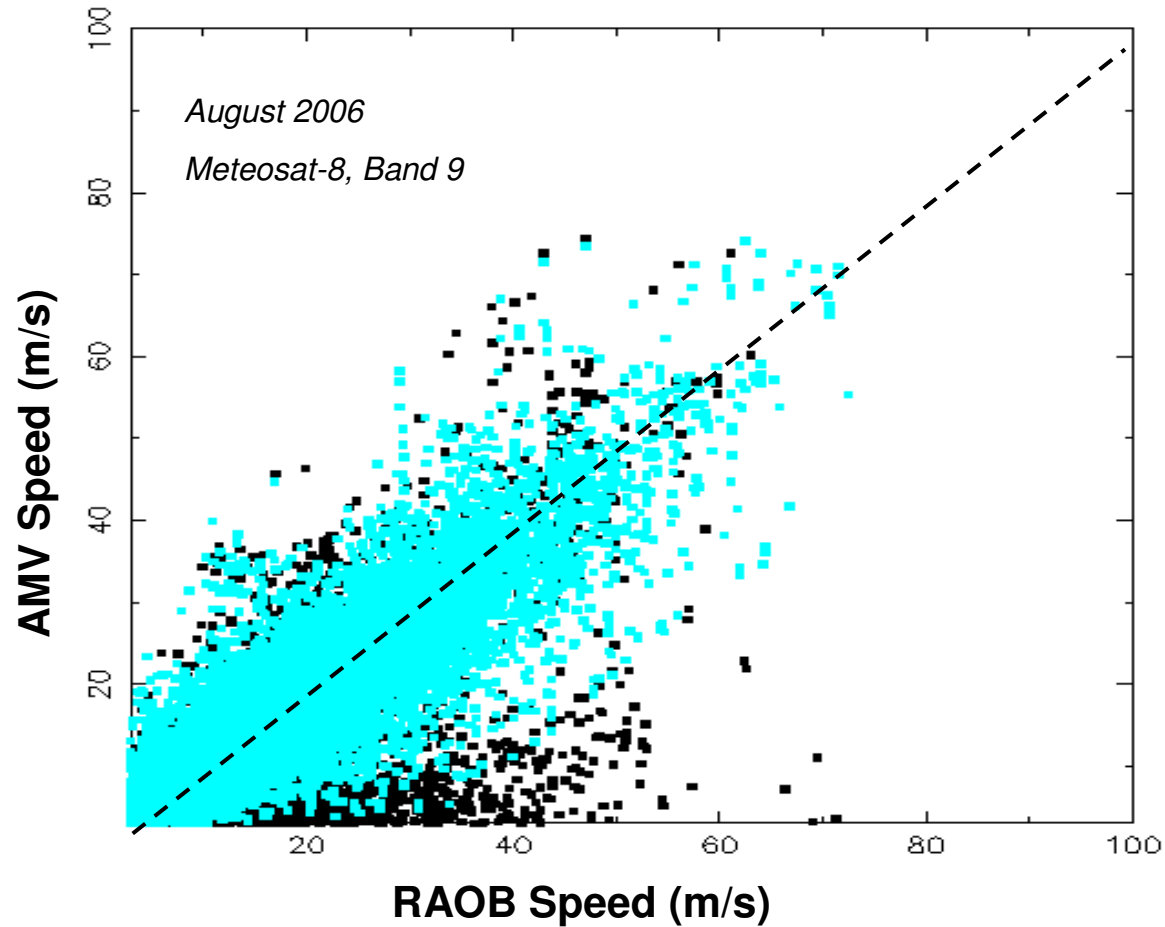
Test distribution shifted right  
- faster AMVs and/or lower heights



# Results from Testing (cont.)



Test winds are better fit to radiosonde



### Black - control

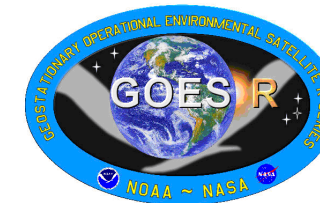
RMS: 7.78 m/s  
MVD: 6.14  
Spd Bias: -2.00  
Speed: 17.68  
Sample: 17,362

### Light Blue -test

RMS: 6.89 m/s  
MVD: 5.46  
Spd Bias: -0.18  
Speed: 17.91  
Sample: 17,428



# Results from Testing (cont.)



Statistical comparison:

	<b>Control</b> 15x15 box	<b>Test (19x19 outer box)</b> Largest cluster from 5x5 sample, new heights
<b>RMSE</b>	<b>7.53</b>	<b>6.63</b>
<b>Avg Difference</b>	<b>5.95</b>	<b>5.28</b>
<b>Speed Bias</b>	<b>-1.97</b>	<b>0.06</b>
<b>Speed</b>	<b>17.46</b>	<b>17.71</b>
<b>Sample</b>	<b>14548</b>	<b>14553</b>

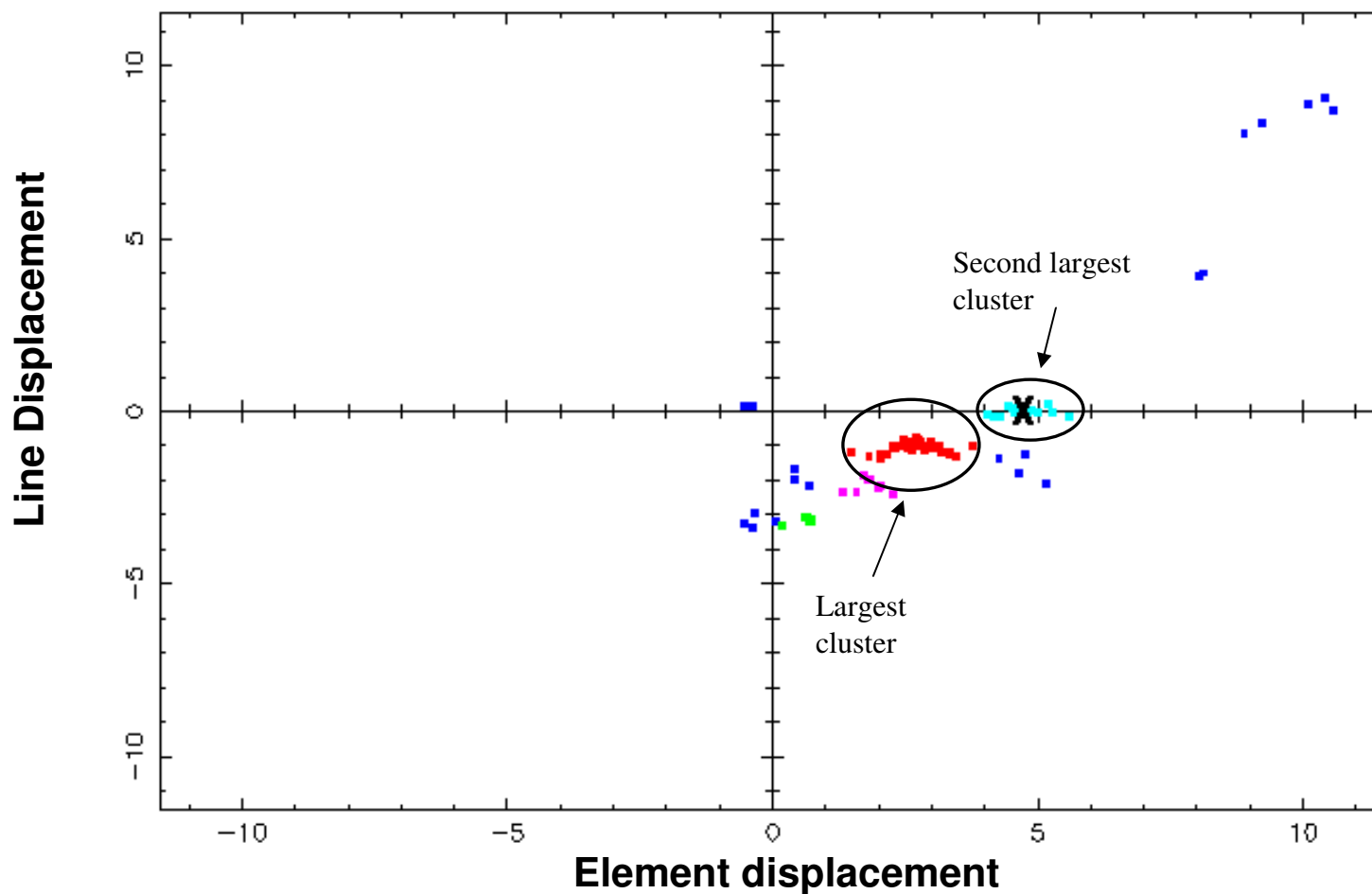
Winds generated using Meteosat-8 10.8  $\mu\text{m}$  imagery (15-minute loop interval) for the period Feb 1 - 28, 2008.



# Results from Testing (cont.)



**Potential Opportunity:** Additional clusters may contain useful wind information (from different levels or scales) in the target scene

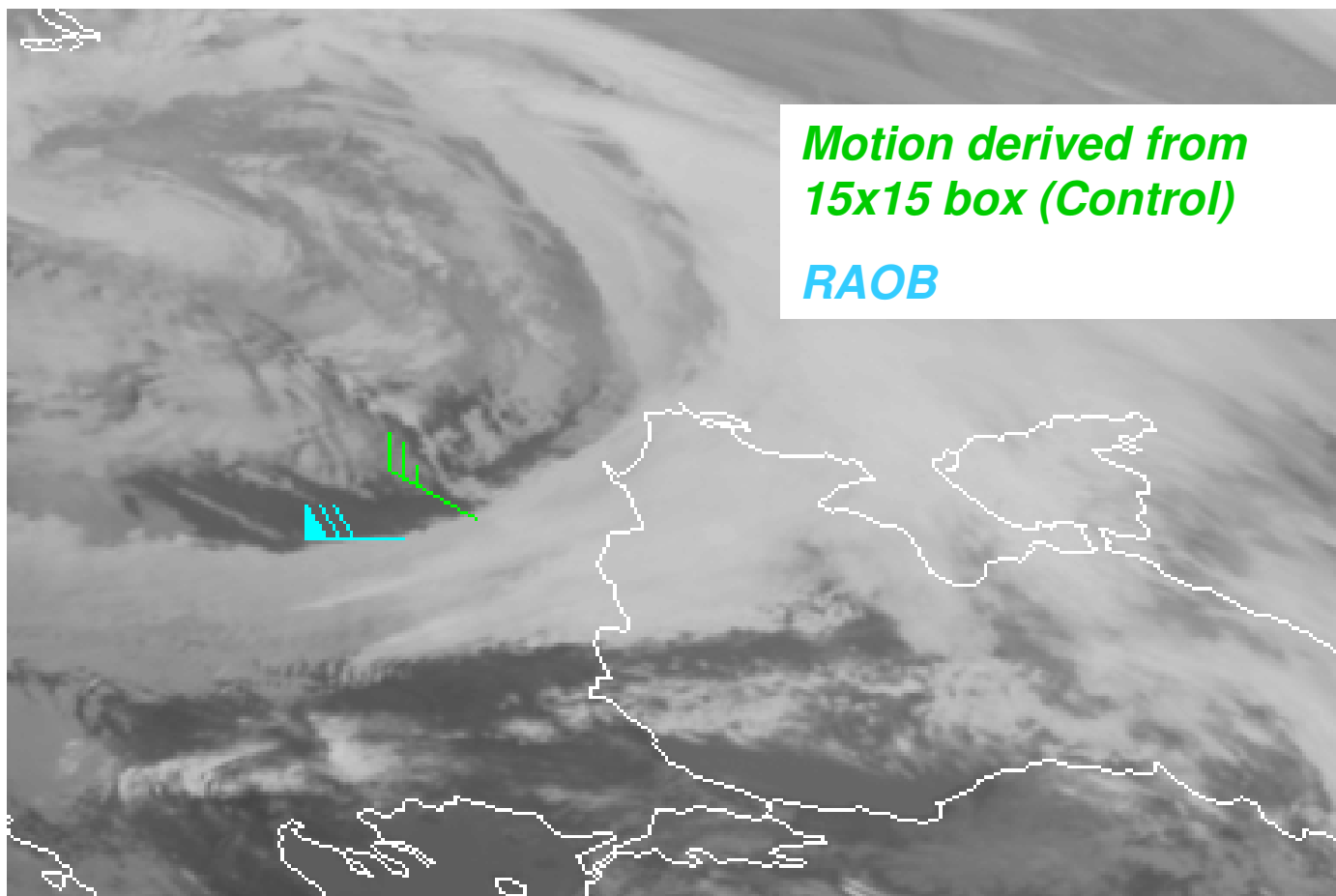


Red - motion of synoptic front

Light Blue - motion along front

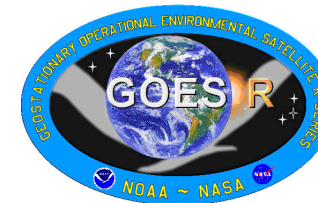


# Results from Testing (cont.)

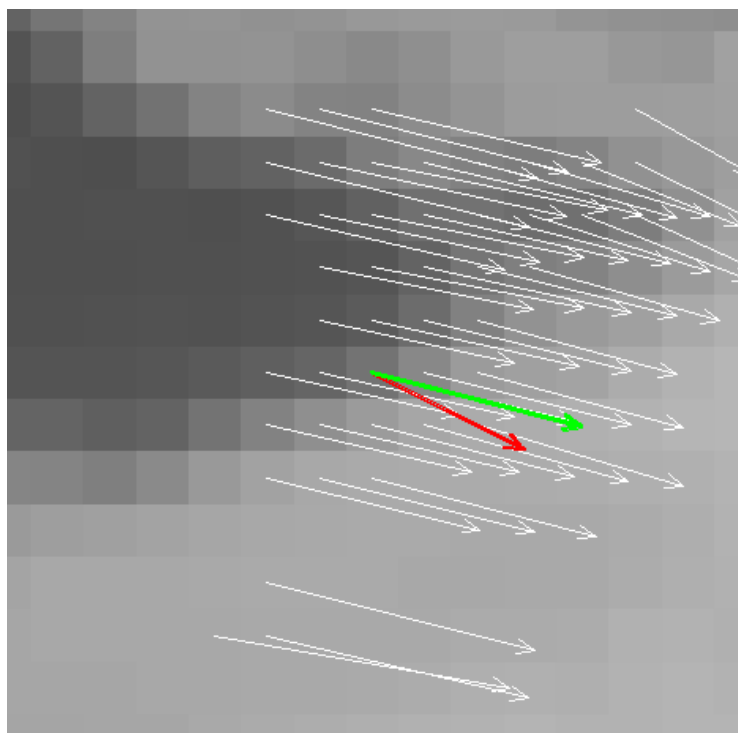




# Results from Testing (cont.)



Additional Clusters:

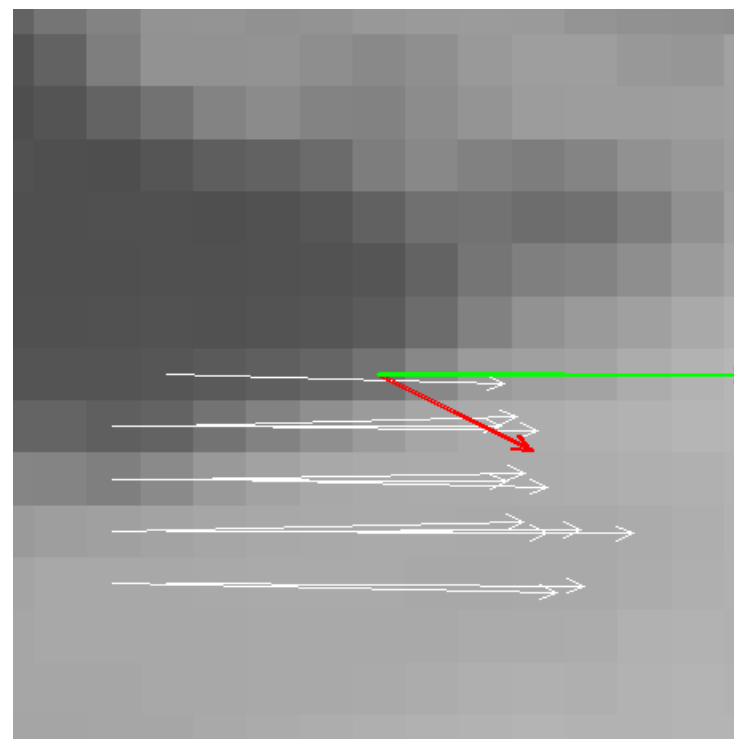


**Control**  
– 15x15  
(Speed:  
12m/s)

**Cluster 1**  
Speed:  
15m/s

*Largest Cluster*

***Motion of front***



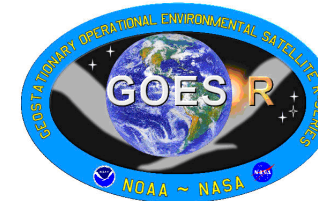
**Cluster 2**  
Speed:  
30m/s

*Second Largest Cluster*

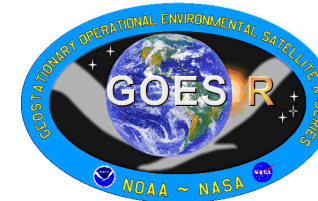
***Better match to raob***



# Summary and Future Plans

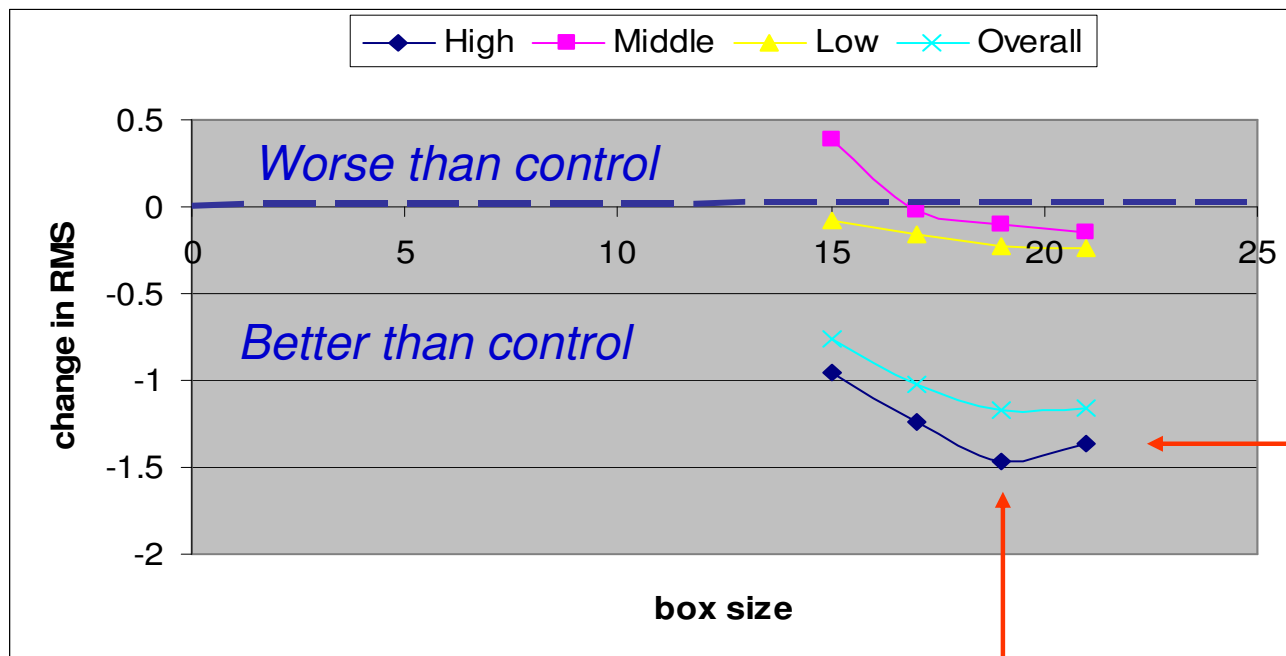


- **Nested tracking approach effectively minimizes the slow speed bias**
  - Most speed “adjustments” are small, but some can exceed 10 m/s
  - Smaller bias a result of lower height and faster wind
- **Nested tracking approach also significantly reduces RMSE**
  - Greatest benefit seen at upper levels for IR winds
  - Smaller improvements for cloud-top WV
- **Identified opportunities with the nested tracking approach**
  - Additional clusters may contain useful wind information in the target scene
  - Use pixel level heights from cluster analysis to report layer information.
  - Clustering metrics may enable new quality control to be employed
    - Number of points in cluster
    - Number of clusters
    - mean distance of points in cluster
  - Extend cluster analysis to include height
- **Funded to extend new approach to current GOES winds processing**
- **Submitted a proposal to the Joint Center for Satellite Data Assimilation (JCSDA) to perform a NCEP GFS NWP forecast impact study using winds derived from new approach**



# Backup Slides

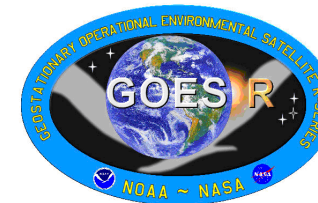
*Box size testing with new methods:*



*Largest impact at upper levels*

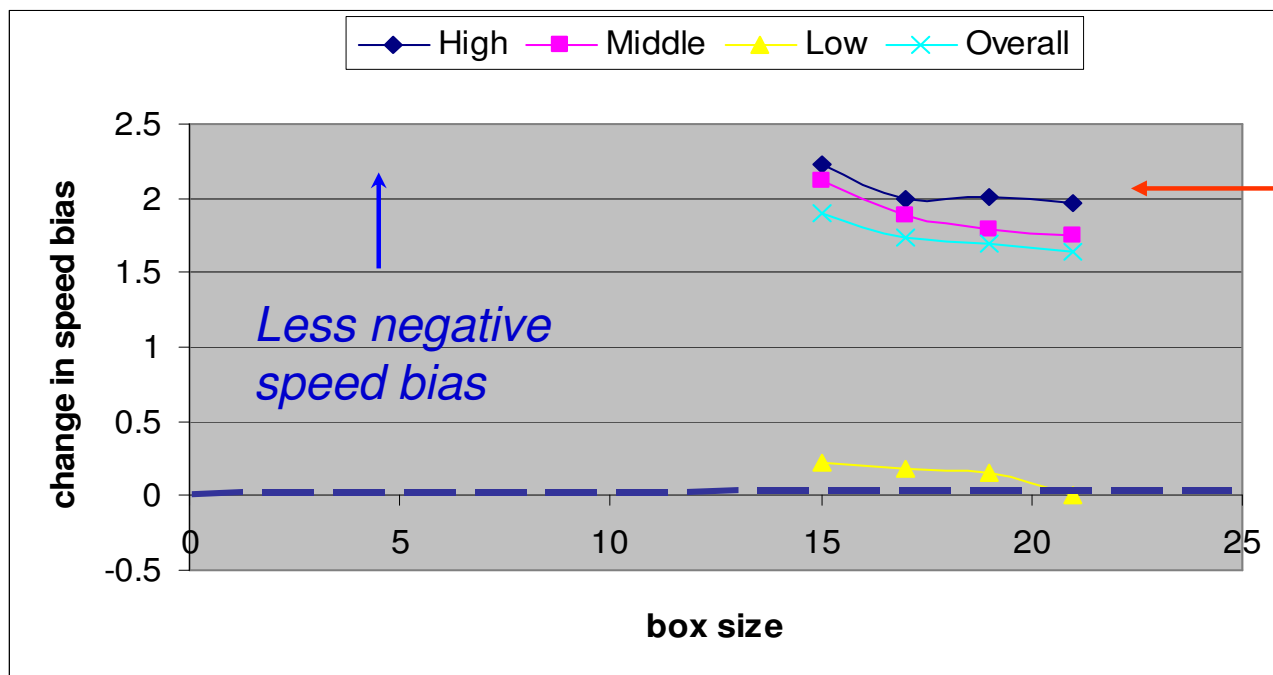
*19x19 box size is best relative to control*





# Backup Slides

*Box size testing with new methods:*



*Slope  
levels off  
with larger  
box*