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National Laboratory**  
Operated by Battelle for the  
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# Enhanced Target Area Identification using Topographic LIDAR Data

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Sandia is a multiprogram laboratory operated by Sandia Corporation, a Lockheed Martin Company,  
for the United States Department of Energy's National Nuclear Security Administration  
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# Overview of Talk



- Review of LIDAR
  - Examples of range related features
  - Focus of this study
  - Results
  - Summary
- 
- This work has been funded by Dept. of Defense
    - Strategic Environmental Research and Development Program (SERDP)
    - Environmental Security Technology Certification Program (ESTCP)

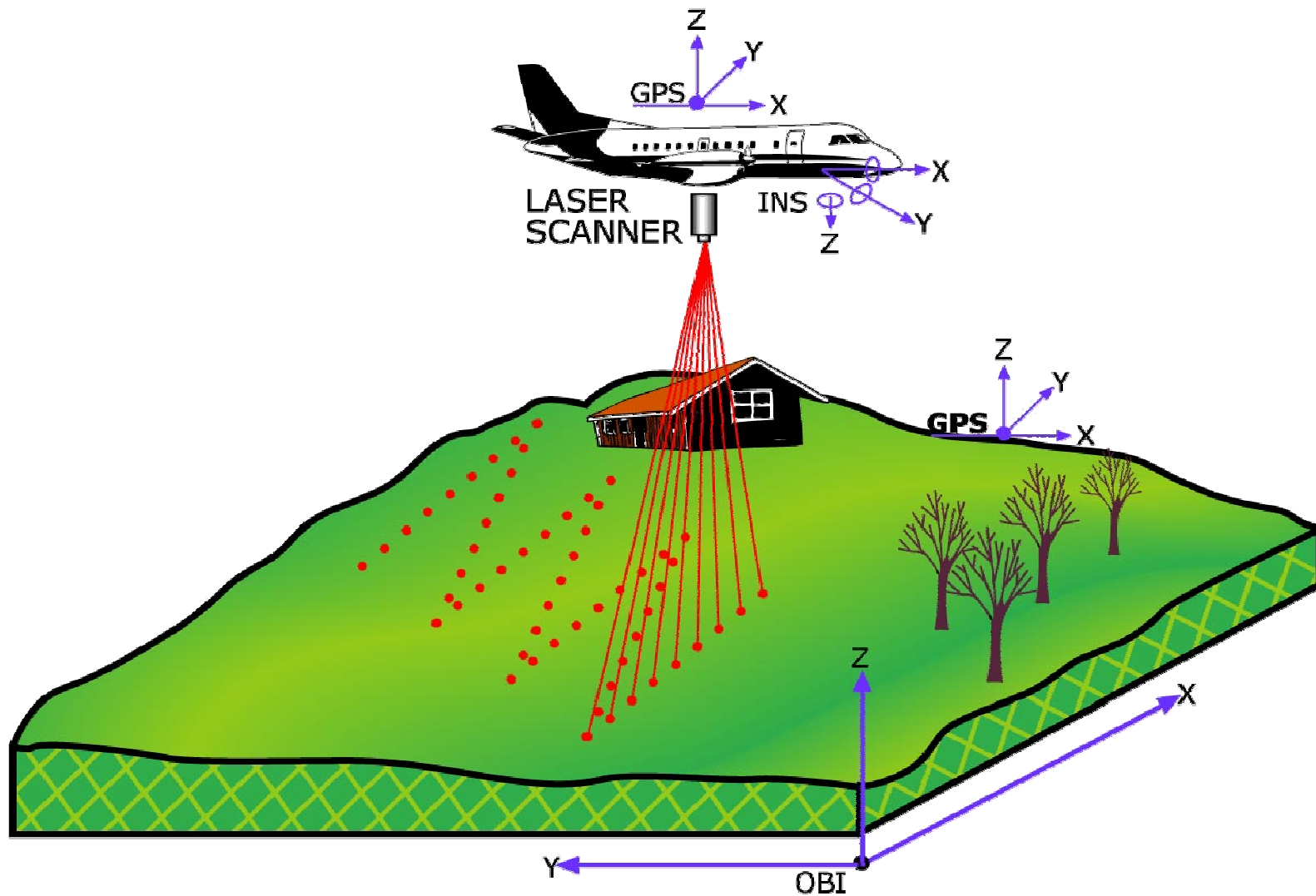


# LIDAR

## Light Detection and Ranging

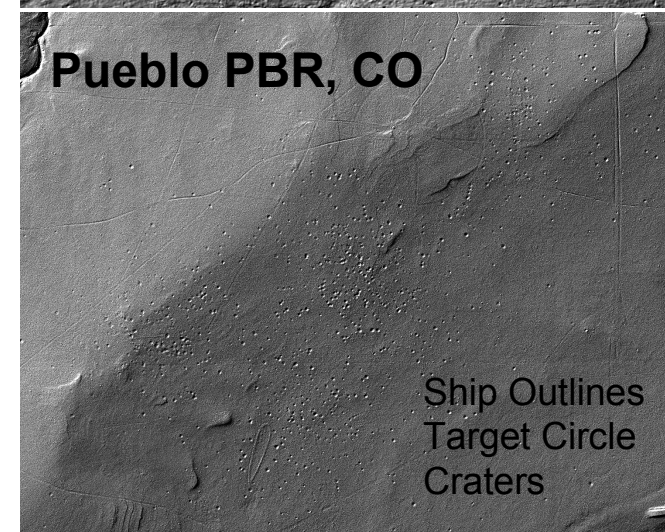
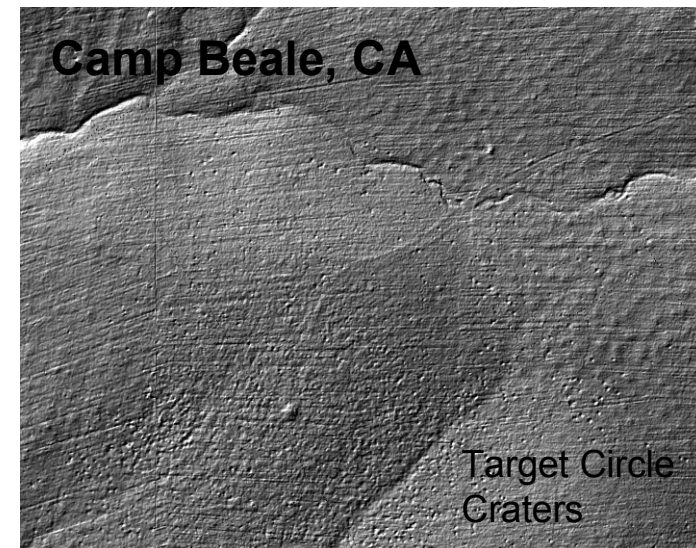
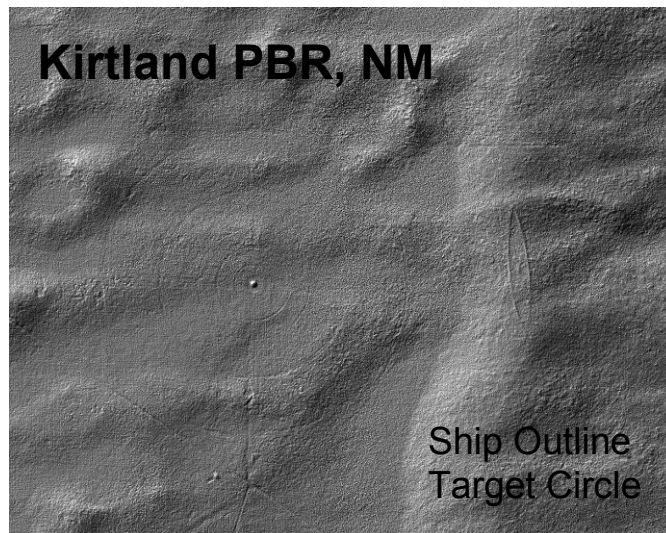


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# Munitions Related Features in Topographic LIDAR Data







# Focus of Study



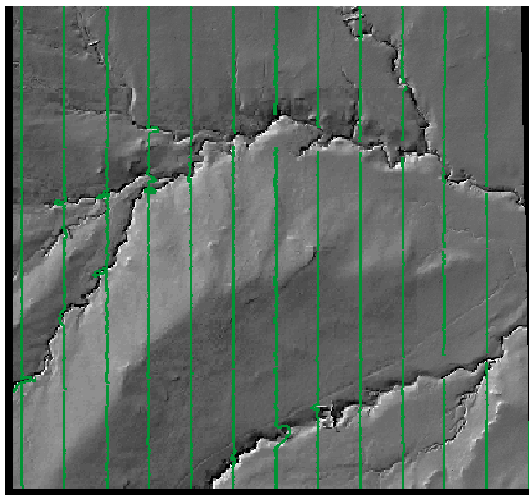
- Can munitions-use related features identified in topographic LIDAR data sets be used in conjunction with sparse magnetometer transect data in identifying and characterizing former practice range target locations?
  - Magnetometer data as primary geostatistical variable
  - Crater density as secondary geostatistical variable
- What are the benefits of including secondary information (topographic LIDAR) in target identification and characterization?



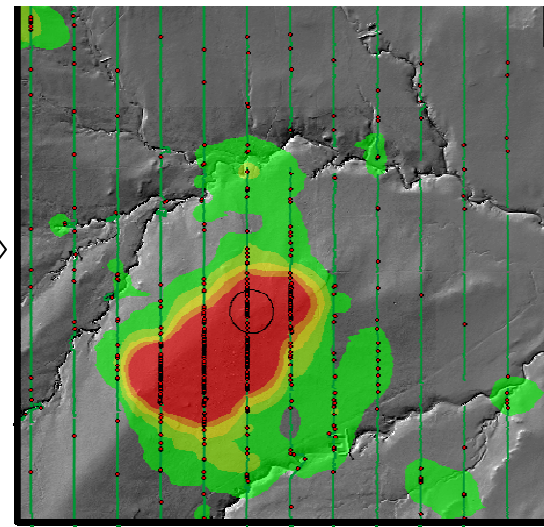
# Geostatistical Estimation



- Ordinary Kriging
  - Using a single variable – magnetic anomaly locations



$$z^*(\mathbf{u}) = \sum_{\alpha=1}^{n(\mathbf{u})} \lambda_{\alpha}(\mathbf{u}) z(\mathbf{u}_{\alpha})$$



Estimates at  
un-sampled  
locations

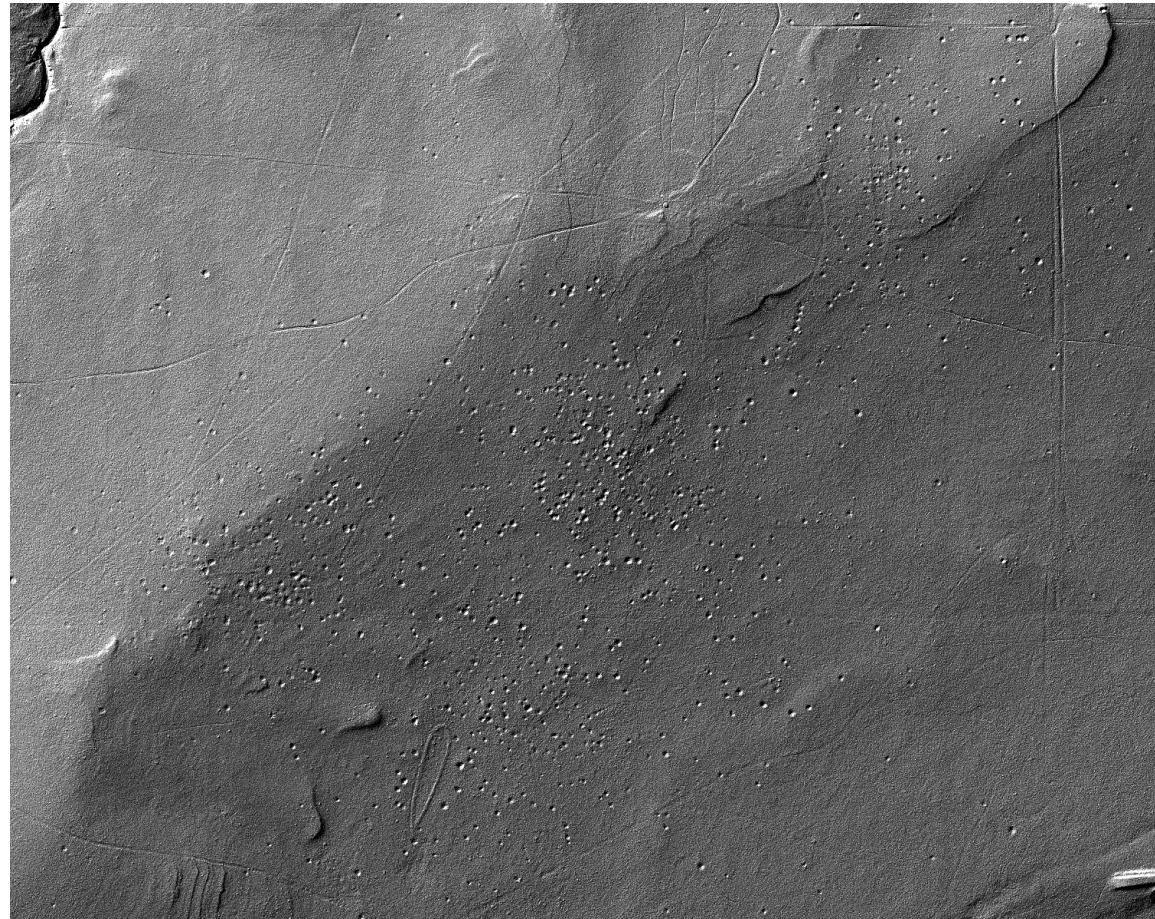
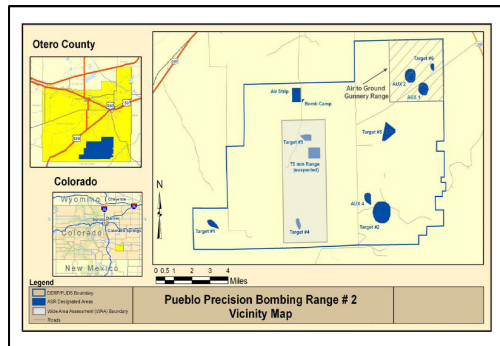
What about the inclusion of secondary information from the WAA?



# Pueblo Precision Bombing Range #2



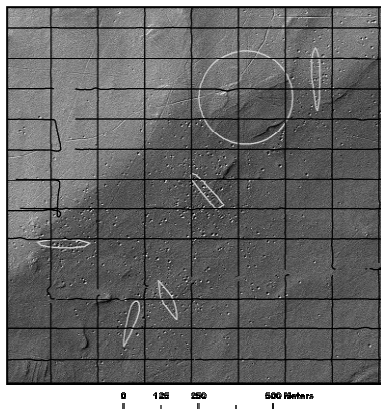
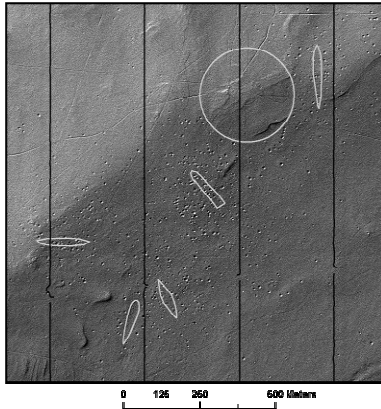
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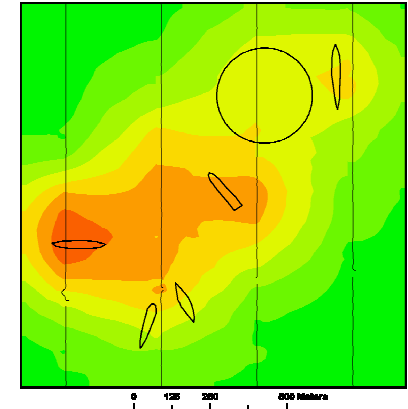
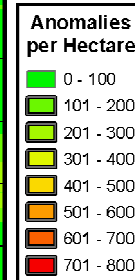
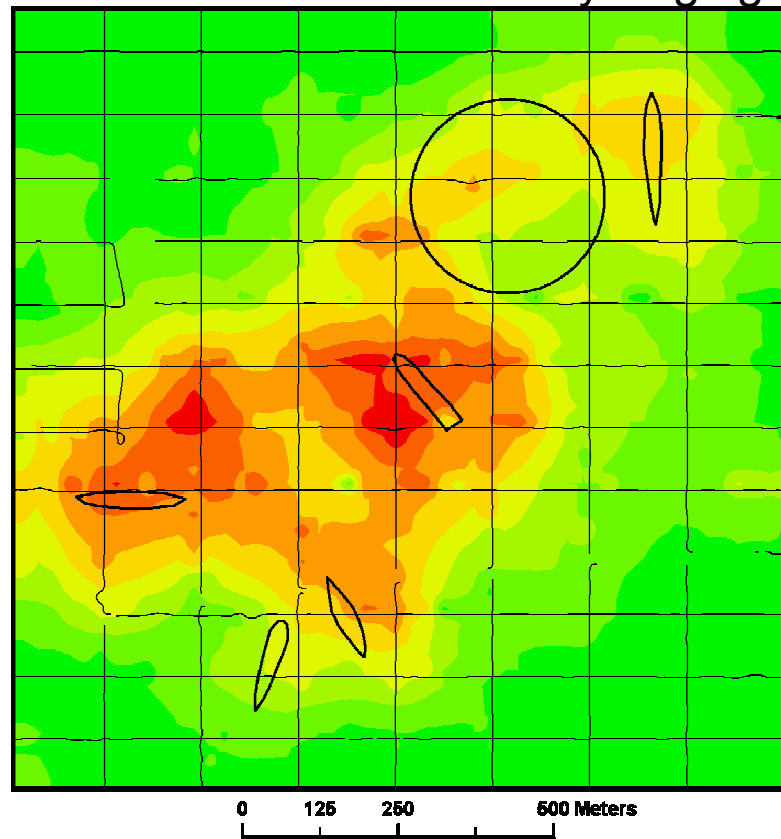




# Magnetometer Data Ordinary Kriging



Dense Transect Ordinary Kriging

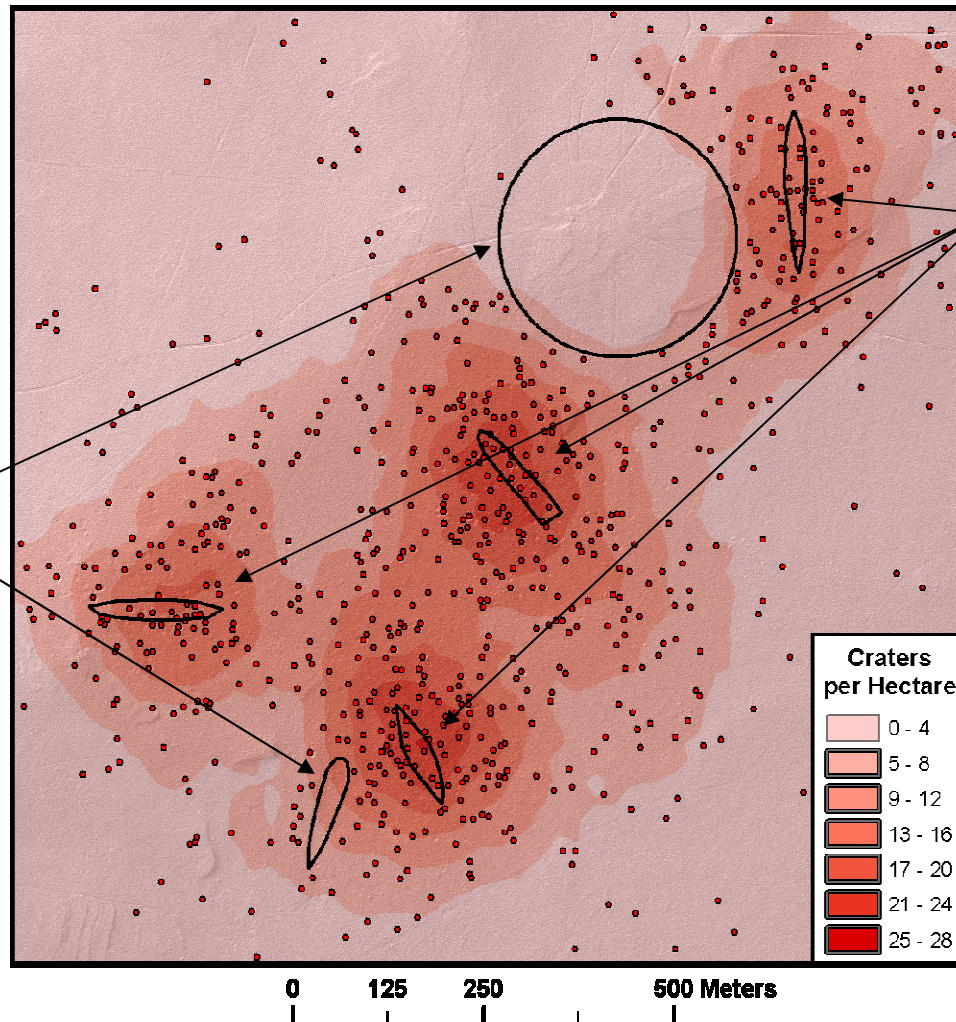






# Secondary Information Crater Density Analysis

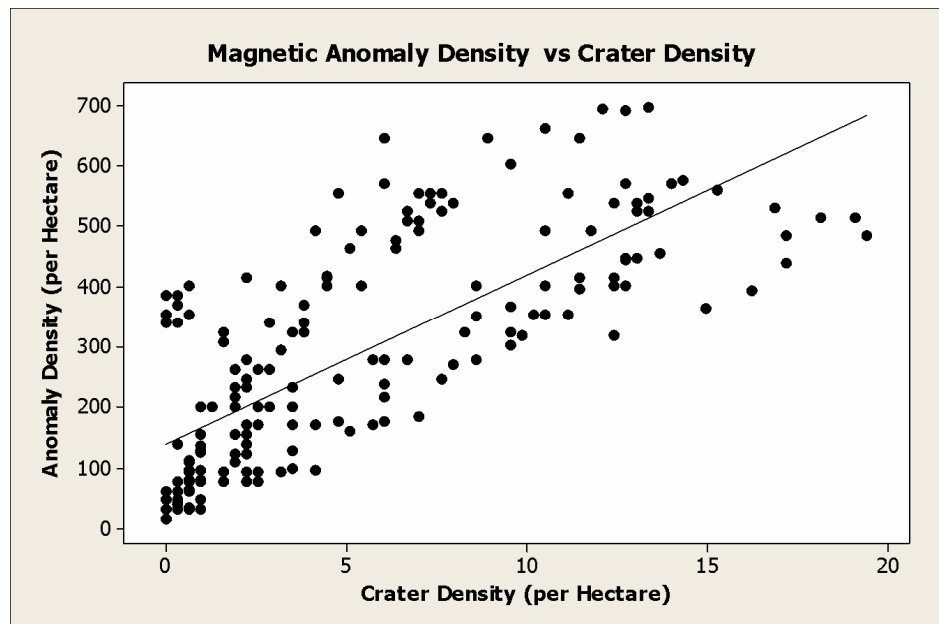
Lack of  
correlation with  
other features.



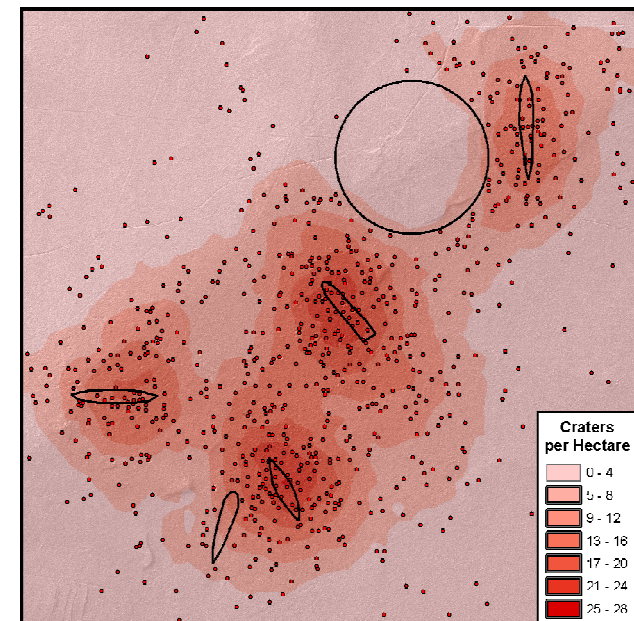
Spatial correlation  
between crater  
clusters and target  
features.



# Relationship Between Crater Density and Anomaly Density



Correlation Coefficient = 0.75  
n = 200





# Using crater density to augment magnetometer data

Simple Kriging with Locally Varying Means can be used to include a secondary variable (crater density) into kriging estimation

Develop functional relationship between primary and secondary variables

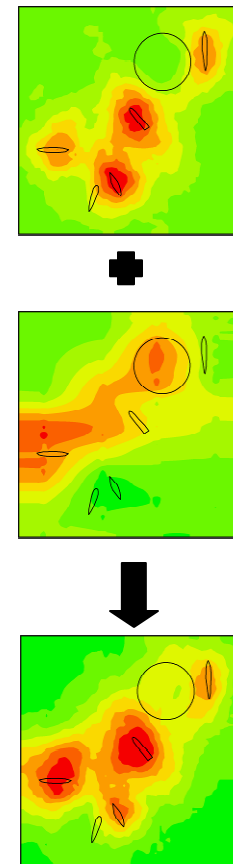
$$z(\mathbf{u}) = 137.44 + 28.08z_2(\mathbf{u})$$

Compute residuals

$$r(\mathbf{u}) = z(\mathbf{u}) - f[z_2(\mathbf{u})]$$

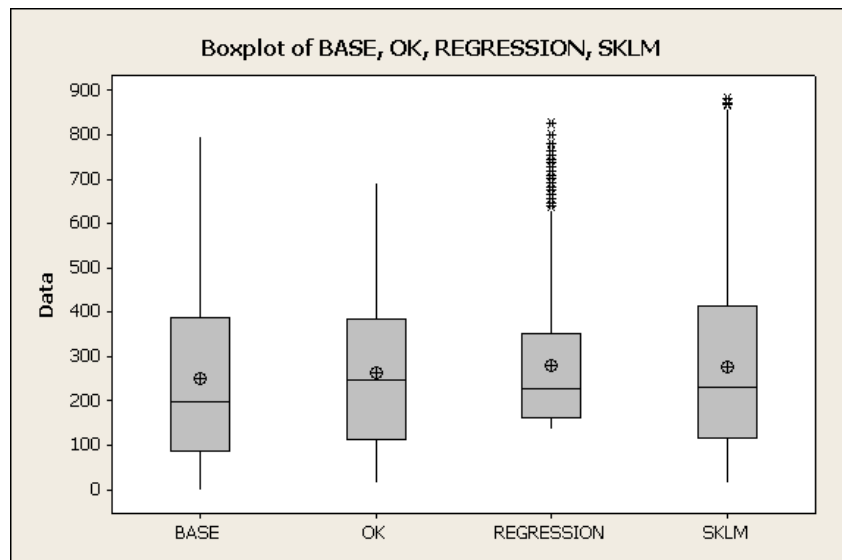
Kriging of residuals and combination of results

$$z^*_{SKLM}(\mathbf{u}) = f[z_2(\mathbf{u})] + \sum_{\alpha=1}^{n(\mathbf{u})} \lambda_{\alpha}^{SK}(\mathbf{u}) r(\mathbf{u}_{\alpha})$$





# Quantitative Comparison of Results



Some improvement  
in range of values

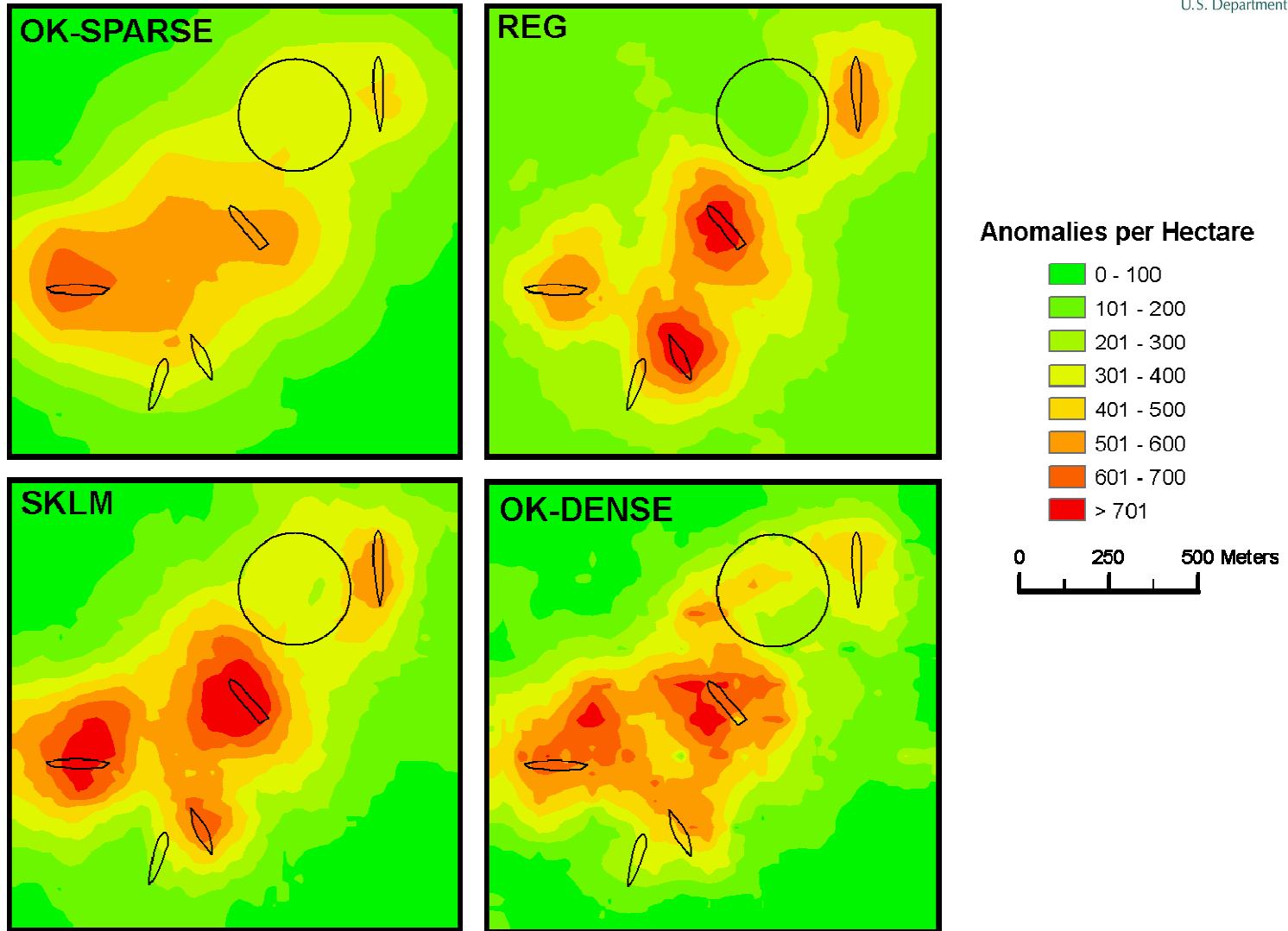
Estimation Technique	MSE Value	IMSE Value	% Change from OK
Ordinary Kriging	5,631	168,784	0 / 0
Linear Regression Model	14,305	306,877	154 / 82
SKLM	5,504	135,667	-2 / -20

Most of improvement in the form of improved  
spatial representation





# Visual Comparison of Results Using Different Techniques





# Summary

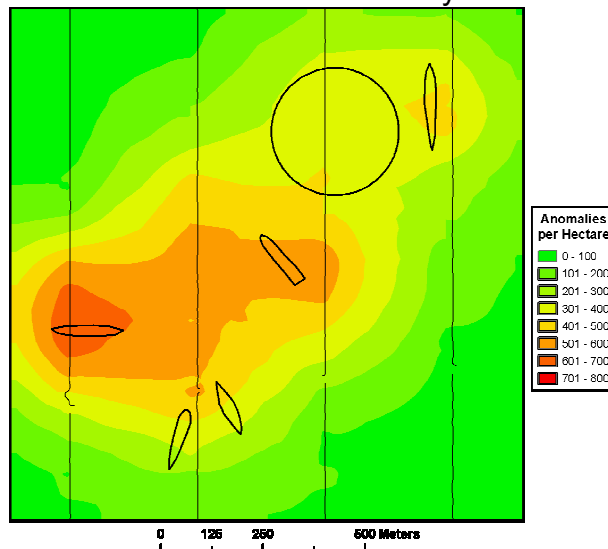


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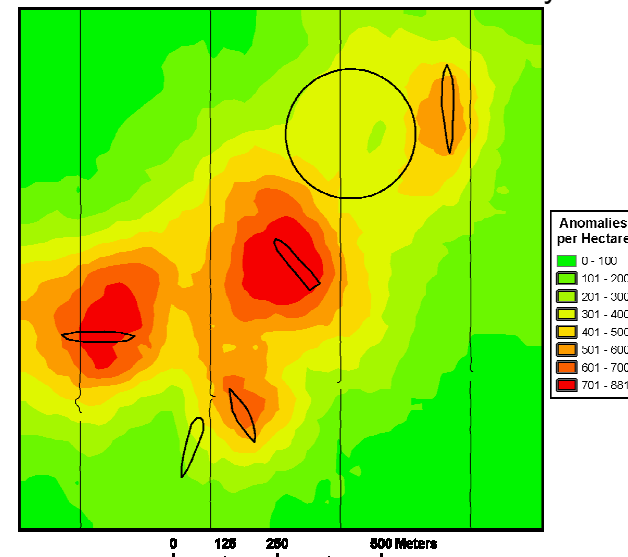
## Using secondary information in the kriging of sparse geophysical transect data:

- Improves the spatial quality of magnetic anomaly density estimates developed from very sparse magnetometer transect data
- Can provide identification at scales smaller than the geophysical transect spacing
- Provides a means to take advantage of comprehensive site data and combine this information with geophysical measurements
- Can reduce resource requirements for site characterization

OK – Transect Data Only



SKLM – Transect Data + Crater Density





# Questions

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