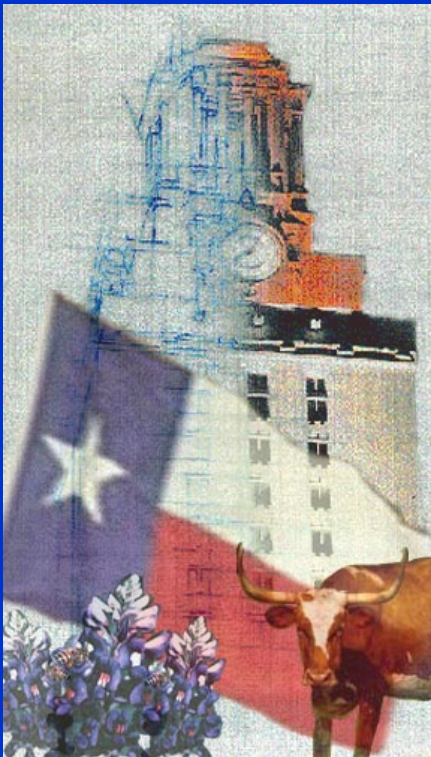


# Comparison of Earthquake Damage Evaluation using Change Detection and Thematic Classification



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# Damage Detection Analysis

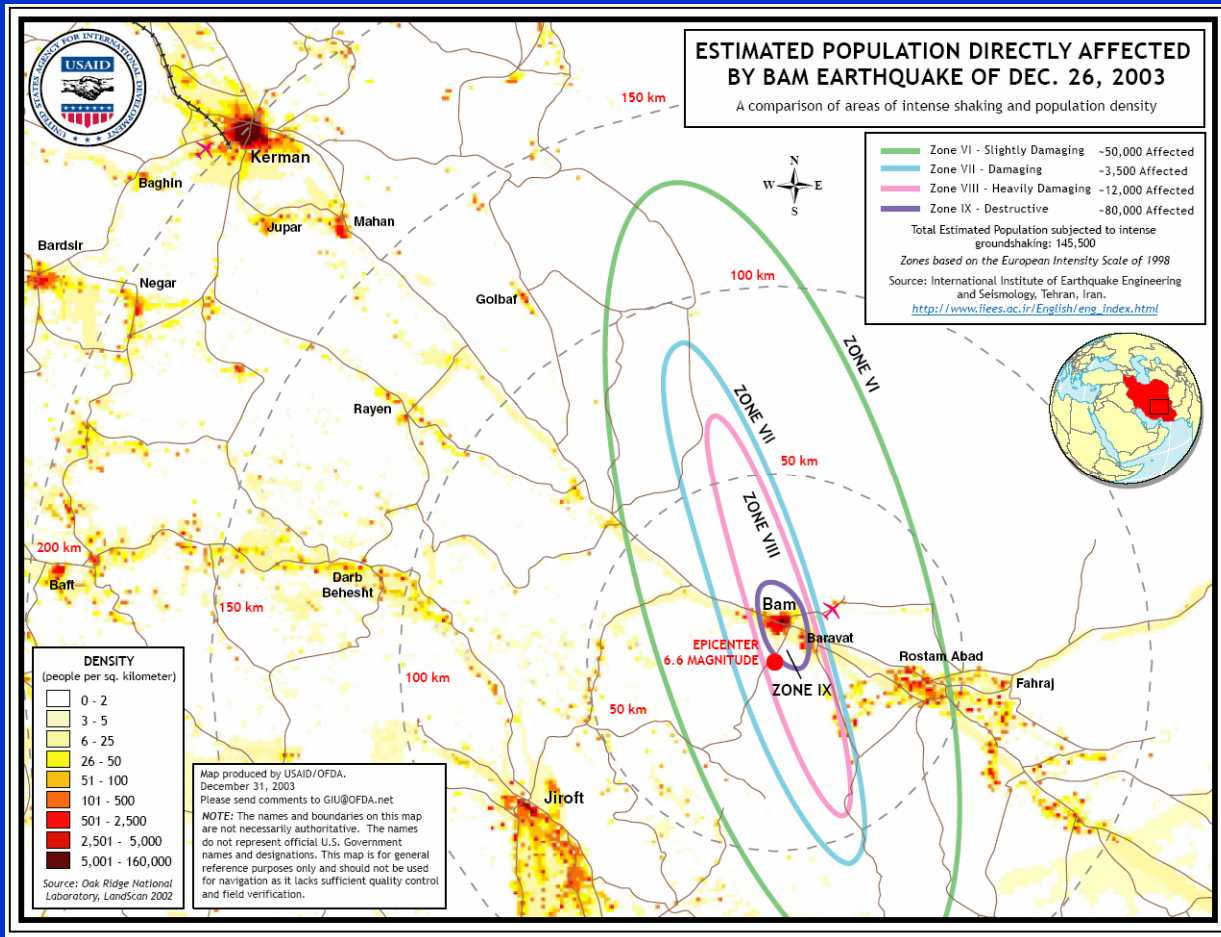


- Optical satellite images can provide critical information regarding earthquake damage
- Methods available to identify damage
  - Change detection (requires pre- and post-earthquake images)
  - Thematic classification (requires only post-earthquake image)
- Application of these methods to 2003 Bam, Iran earthquake
- Comparison of change detection and thematic classification results

# 2003 Bam, Iran Earthquake



2003 December 26  $M_w$  6.6



- Pre- and post-earthquake Quickbird images

30 Sept 2003

4 Jan 2004



# Change Detection



- Requires pre- and post-earthquake images
- Co-registered pre- and post- earthquake images
- Use image-to-image correlation

$$r = \frac{n \sum PV_a PV_b - (\sum PV_a)(\sum PV_b)}{\sqrt{n \sum PV_a^2 - (\sum PV_a)^2} \cdot \sqrt{n \sum PV_b^2 - (\sum PV_b)^2}}$$

$PV_a$  = pixel value in pre-earthquake image

$PV_b$  = pixel value in post-earthquake image

$n$  = number of pixels in correlation window

***15 by 15 pixel (9 m) window used***



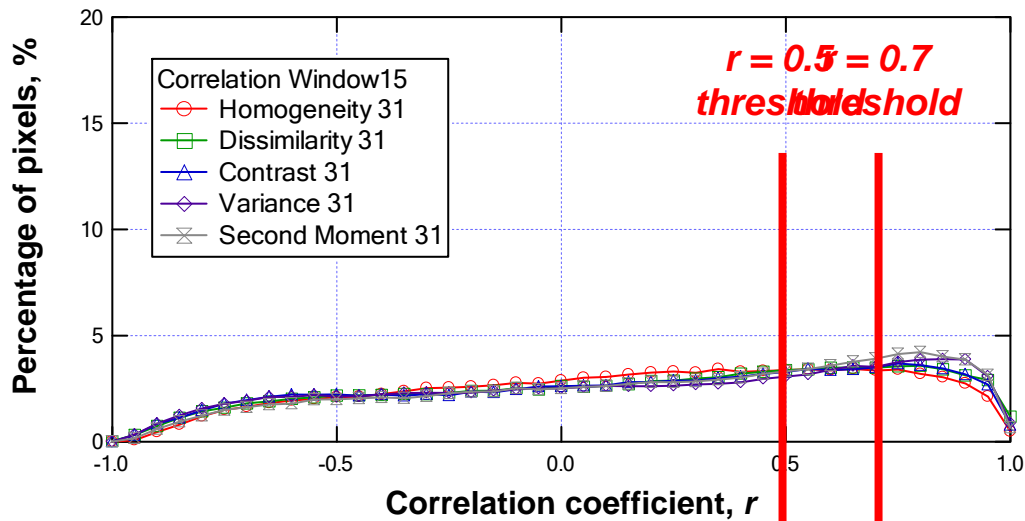
# Texture



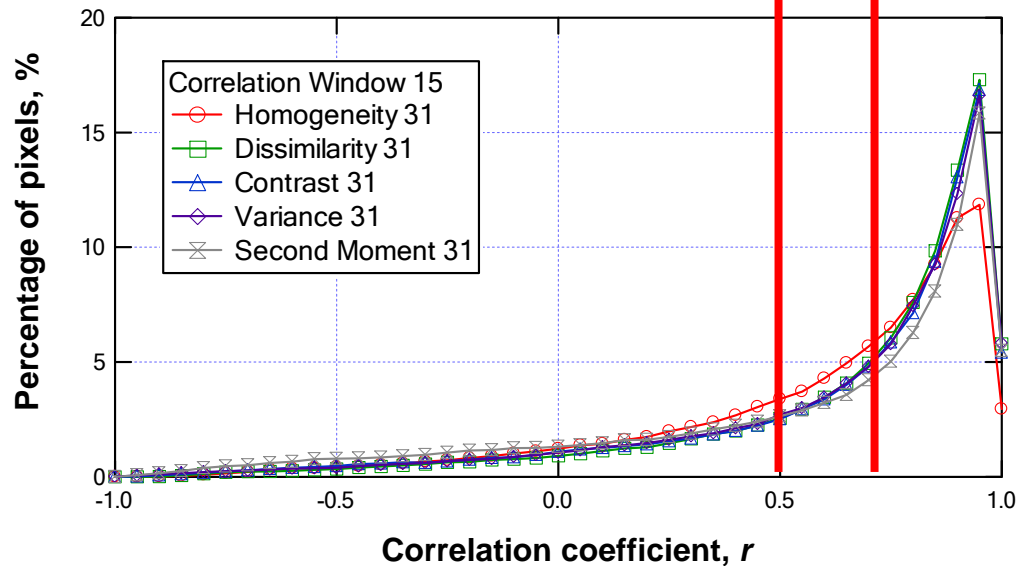
- Earthquake damage shows changes in texture
- Use texture measures based on the gray-level co-occurrence matrix (CM)
  - Homogeneity, dissimilarity, contrast
  - Second moment, entropy
  - Mean, variance, correlation
- Considered texture over 31 by 31 pixel window, 15 pixel horizontal shift



# Change in Texture



**Heavily  
damaged area**



**Undamaged  
area**

# Results of Change Detection

Using correlation coefficient and VAR31 feature



- Red – damage
- Threshold  $> 0.5$
- Vegetation and shadow mask



# Thematic Classification



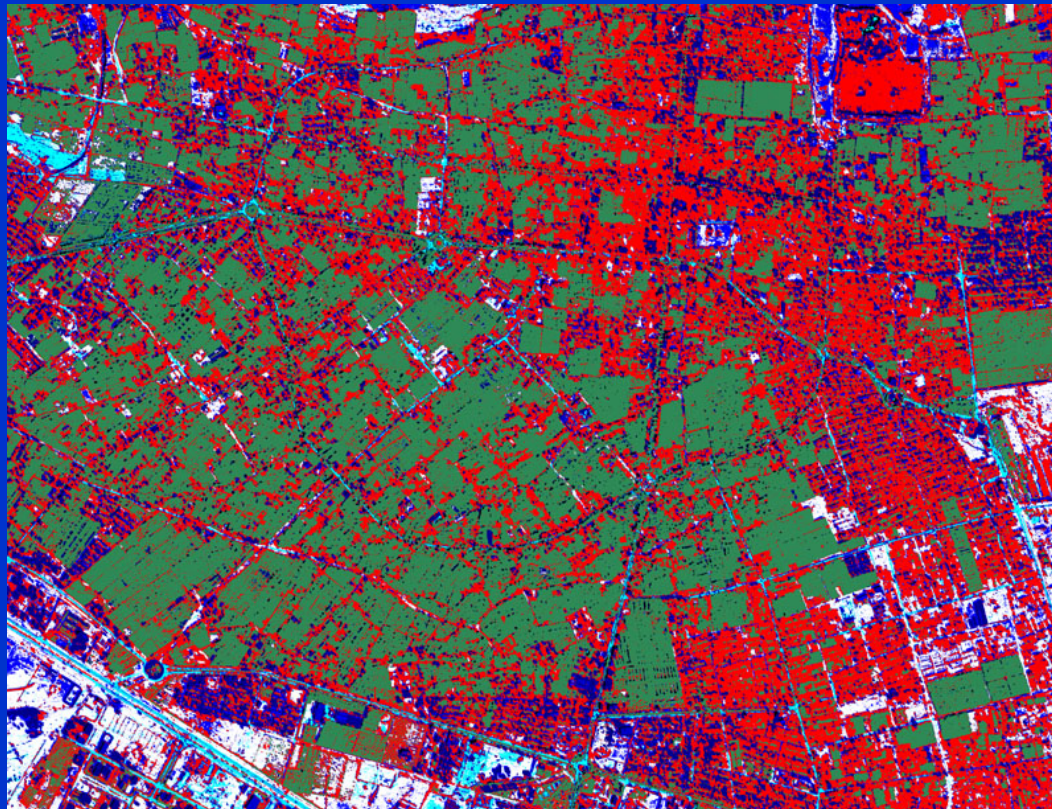
- Requires only post-earthquake image
- A subset of data associated with “damaged” and “undamaged” areas is identified for training the algorithm.
- Apply Bayesian pair-wise feature selection algorithm in conjunction with a maximum likelihood classifier





# Results of Thematic Classification

Using maximum-likelihood classification and 14 spectral and textural features selected by feature selection



- Red – damage
- Green – vegetation
- Blue – buildings
- White – open areas
- Cyan – roads



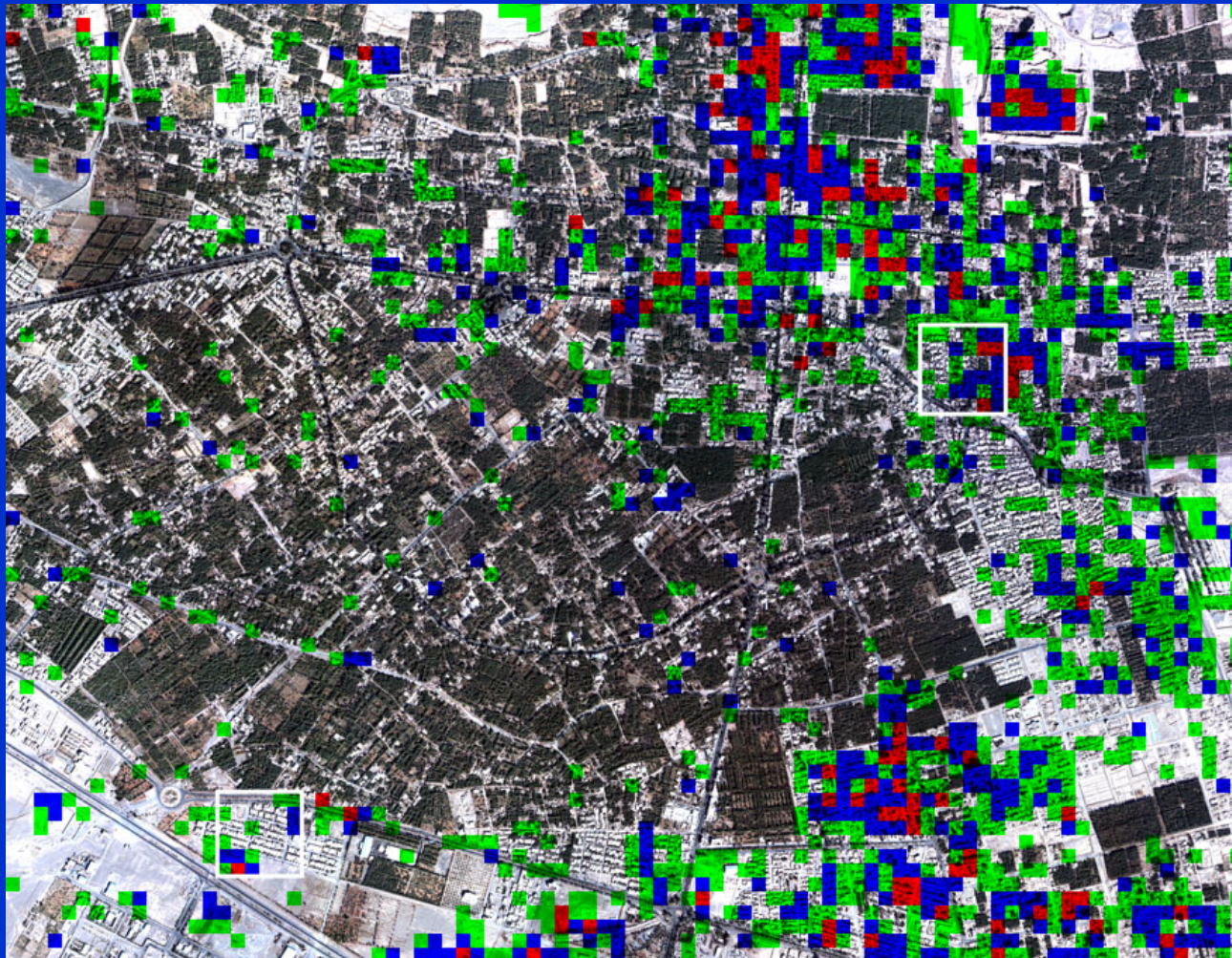
# Damage Intensity (DI)






- Defined as percentage of damaged pixels within a 60 m by 60 m (100 pixels by 100 pixels) window
- Only consider pixels that are urban area
  - DIDN'T WE CHANGE THIS??
- Threshold for earthquake damage
  - $DI > 40\%$



# Damage Intensity-CD

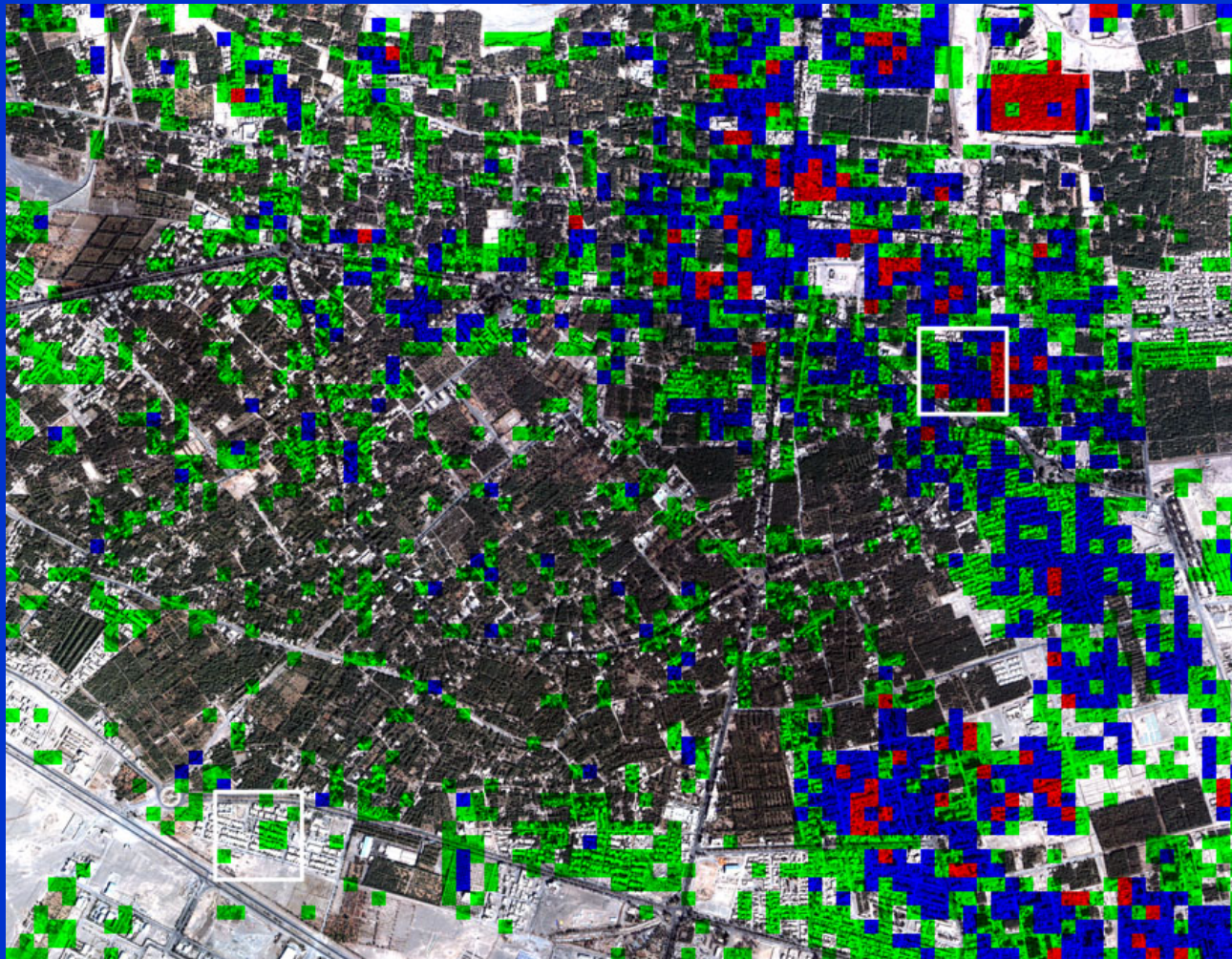


## LEGEND




-  D3  
DI = 40-60%
-  D4  
DI = 60-80%
-  D5  
DI = 80-100%



# Damage Intensity-ML

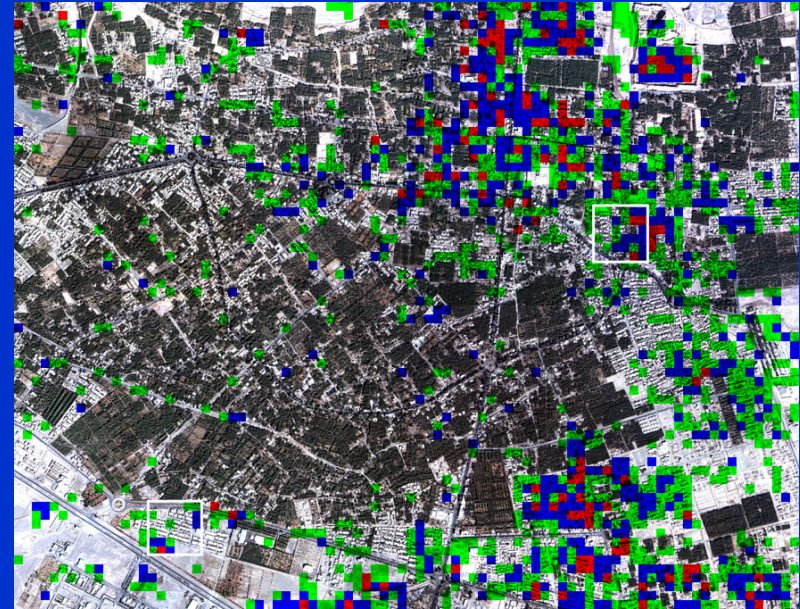
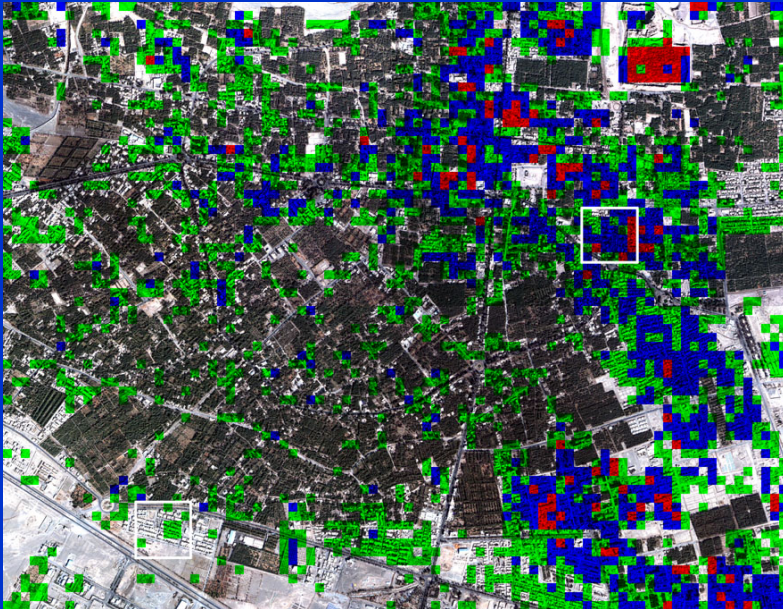


## LEGEND

-  D3  
DI = 40-60%
-  D4  
DI = 60-80%
-  D5  
DI = 80-100%

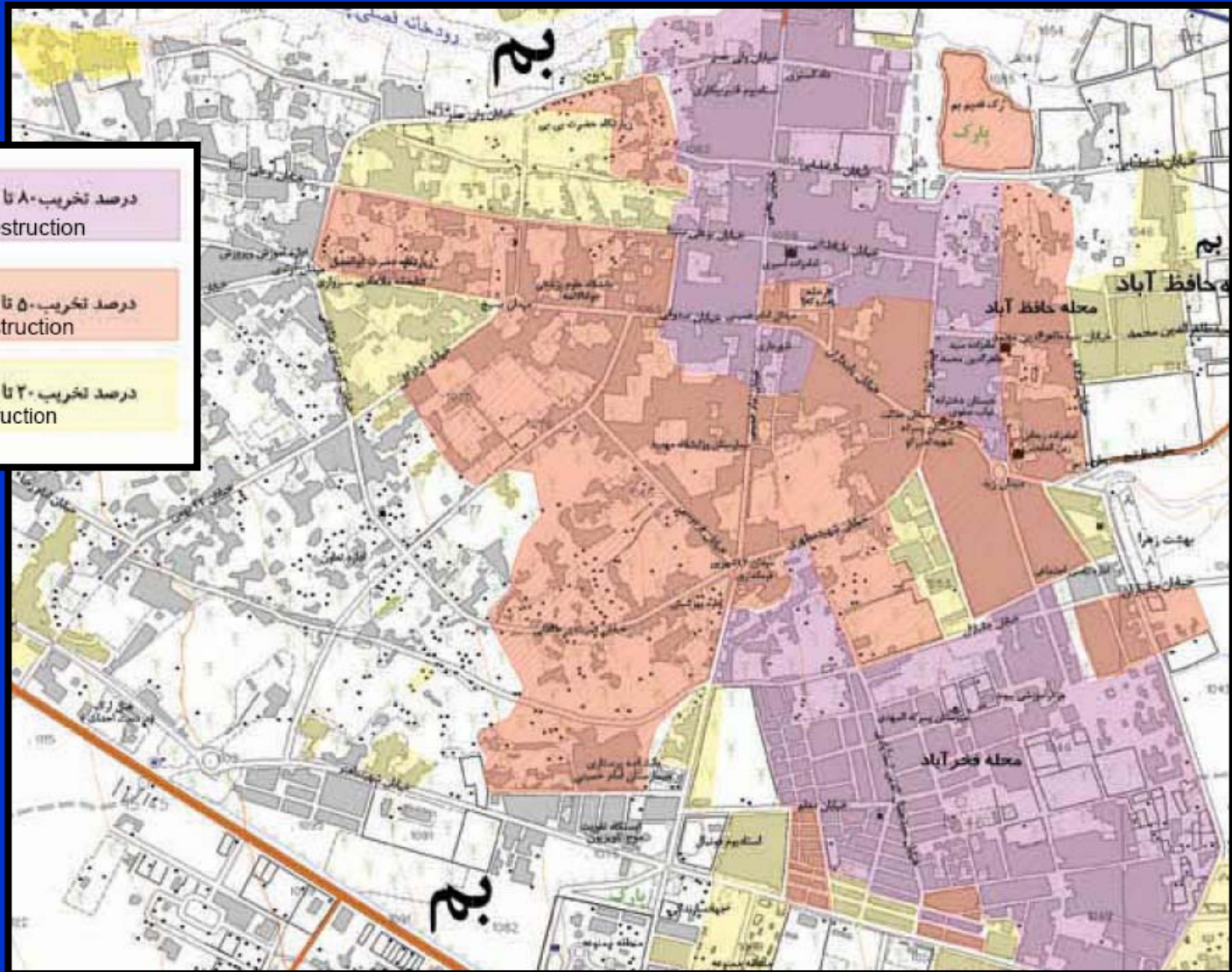


# Damage Intensity

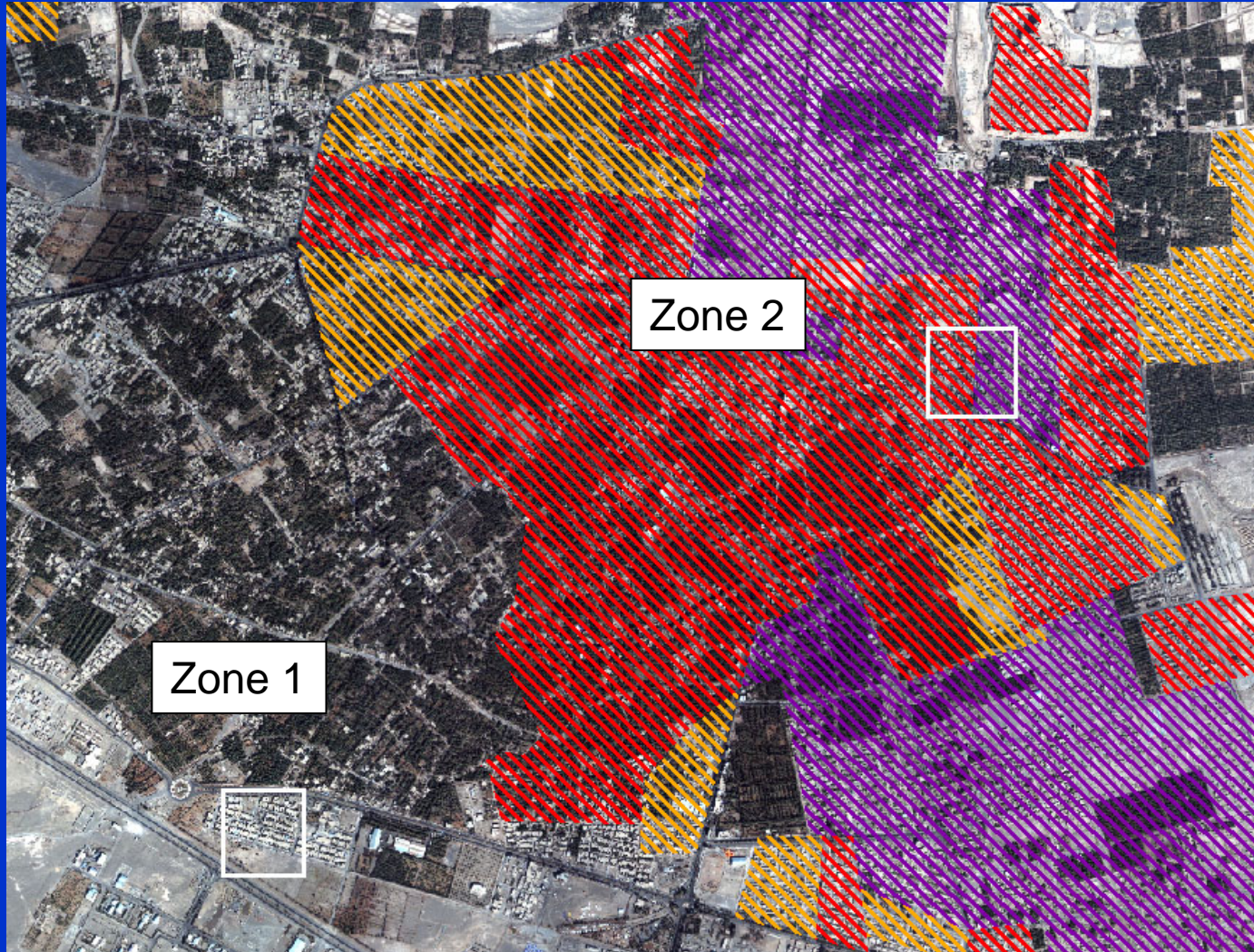


ML	CD
38% of image DI3-DI5	24% of image DI3-DI5
DI3 – 5.16km <sup>2</sup>	DI3 – 2.98km <sup>2</sup>
DI4– 2.63km <sup>2</sup>	DI4 – 1.79km <sup>2</sup>
DI5– 0.44km <sup>2</sup>	DI5 – 0.48km <sup>2</sup>

# Field Damage Survey



# Comparison with Field Survey





# Zone 1- Undamaged area



*Pre-earthquake*



*Post-earthquake*







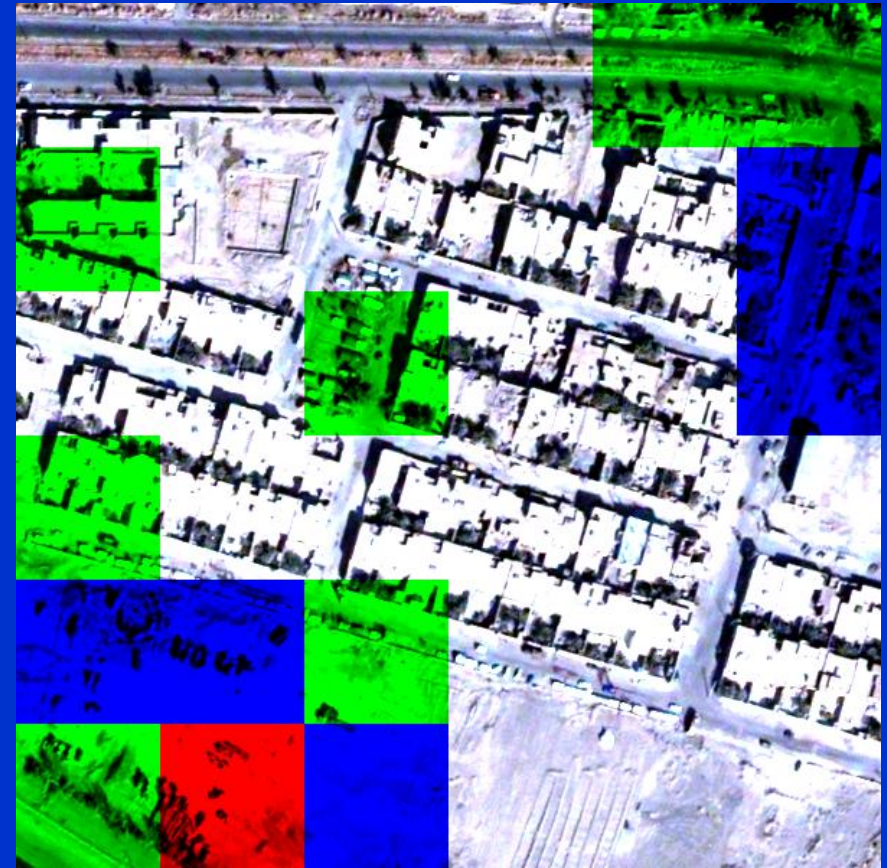
# Comparison of Results



*ML Classification*



*Change Detection*





# Zone 2- Damaged area



*Pre-earthquake*



*Post-earthquake*

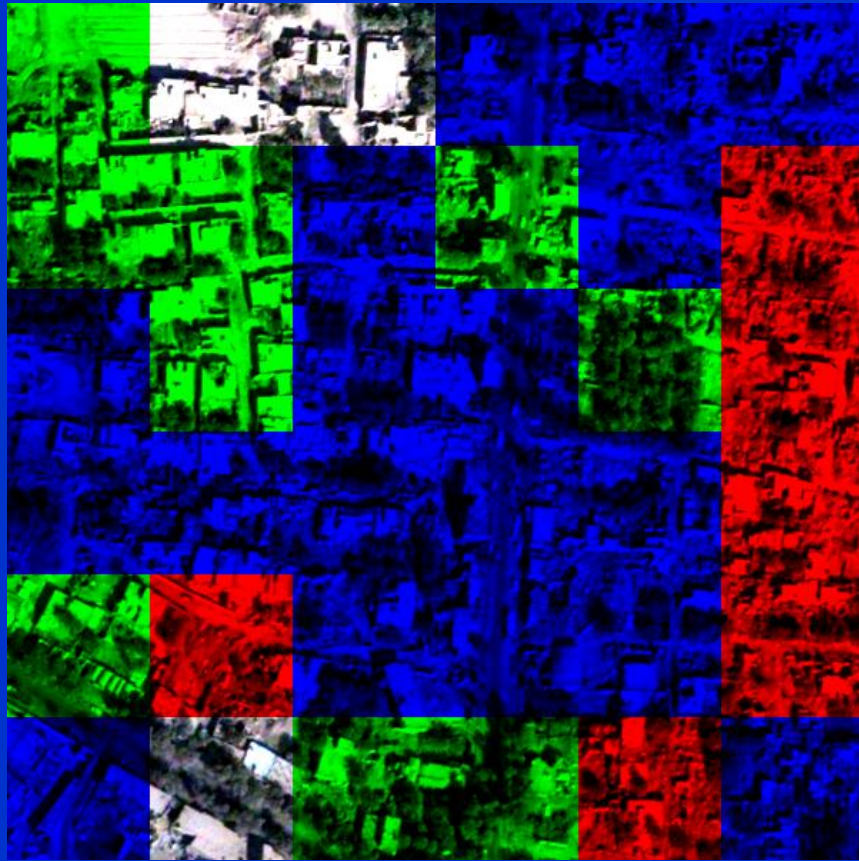




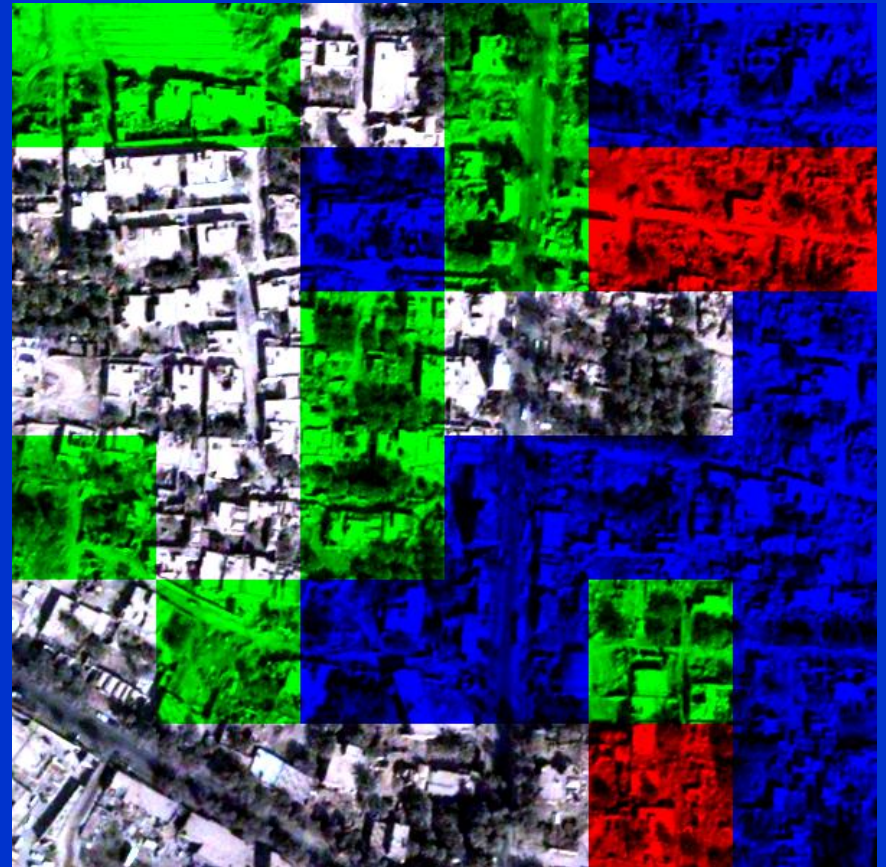
# Comparison of Results



*ML Classification*



*Change Detection*





# Conclusions



- Thematic classification identified more damage than change detection when considering the entire city
- Thematic classification is not always successful in distinguishing between different levels of severe damage



# Conclusions



- Change detection distinguished better different levels of severe damage
- Change detection identified some non-earthquake change that resulted in an overestimation of damage in isolated areas
- Future work
  - Developing multi-resolution techniques
  - Advanced textural features (e.g., wavelets)
  - Hierarchical classification