AN URBAN DAMAGE SCALE BASED ON SATELLITE AND AIRBORNE IMAGERY

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SUMMARY

In the last decade, remote sensing technologies have played increasing roles in quantifying the extent of damage during large earthquakes. This has been especially true for several recent foreign events, i.e., the 1999 Marmara, Turkey, the 2001 Bhuj, India, the 2003 Boumerdes, Algeria, the 2003 Bam, Iran and the 2004 Morocco earthquakes. Furthermore, remote sensing technologies played an important role in identifying hard hit areas – both water and windborne damage - after Hurricane Katrina in the U.S. Because of advances and improvements in deployment and resolution, commercial satellite data providers are now able to provide near real-time, high-resolution imagery following major catastrophes.

Despite the fact that numerous methodologies have been proposed for measuring the effects of disasters using remotely sensed data, there is yet to be developed a standard scale for quantifying damage and impacts using these data. Part of the reason for this is that the quality (resolution, timeliness and spectral properties) of remotely sensed data has improved only in the last several years and researchers have not had enough time to test and validate their damage detection approaches.

This paper proposes the requirements of a regional damage scale for measuring the effects of earthquakes, floods and windstorms using high-resolution optical and synthetic aperture radar (SAR) data. The basis for this scale comes from recommendations made at two EERI-MCEER-UCI sponsored workshops (2003, 2004) where the focus was on the application of remote sensing technologies for disaster response and recovery. Many of the participants in these two workshops are current members of EERI's Subcommittee on Remote Sensing.

INTRODUCTION

The benefits of a standard scale for damage assessment are significant. By establishing common damage states (e.g., collapse, partial collapse, etc.) and identifying key indices that accurately quantify these states, rapid assessments of damage for large regions can be conducted within a matter of days. Research has shown that rapid and accurate damage assessments can reduce the overall impacts of a large disaster by helping to prioritize

important response activities and preventing cascading events (e.g., release of hazardous materials). A standard scale will also provide a basis for collecting and archiving important satellite imagery for future research.

Figure 1 shows a comparison of before and after event imagery for the Boumerdes, Algeria earthquake in 2003. The availability of high-resolution imagery has significantly changed our expectations with regard to regional damage assessment using remotely sensed data. The next section discusses a few studies that have use this high-resolution data to determine the damage levels of areas impacted most by large earthquakes.



FIGURE 1 Selected examples of building damage in the city of Boumerdes, identified by visual inspection of pan-sharpened Quickbird imagery, acquired before and after the 5/21/03 earthquake. Images courtesy of DigitalGlobe, <u>www.digitalglobe.com</u>

DAMAGE STUDIES

To date, there have been ten major earthquakes where damage has been measured using remotely sensed data: 1993 Hokkaido, Japan; 1995 Kobe, Japan; 1999 Marmara, Turkey; 2001 Bhuj, India; 2001 San Salvador, El Salvador; 2001 Atico, Peru; 2003 Boumerdes, Algeria; 2003 Bam, Iran; 2004 Niigata, Japan; and 2004 South Asia earthquake and tsunami. In each of these events, different sensors were used, as were different methodologies for quantifying damage. The ability to more accurately identify severely damaged areas with remotely sensed data has improved considerably in the last several years, largely as a result of commercially-available high-resolution satellite imagery.

Figure 2 summarizes research on some of the events above. In theoretical terms, a basic distinction can be drawn between *direct* approaches, where damage is recorded through its signature within the imagery versus *indirect* indicators, using a surrogate measure such as nighttime lighting levels (Hashitera *et al.*, 1999). Within the realm of direct damage detection, studies are based on either *mono-* or *multi-temporal* analysis. While the former distinguishes between the appearance of damaged and non-damaged structures within a given scene (see, for example, Mitomi *et al.*, 2000, 2001, 2002), the latter infers damage detection is an extremely active research area, where considerable progress is attributable to collaborative efforts between U.S. and Japanese investigators.

A number of intermediary reports document progress made with the development of qualitative and quantitative approaches to damage detection based on satellite imagery (see Eguchi *et al.*, 2000a, 2000b, 2003a, 2003b; also Matsuoka and Yamazaki, 2000a, 2000b, 2002, 2003). These studies employ optical and radar coverage. Optical sensors such as SPOT and Landsat are widely used in earth observation. Images are easy to interpret as they depict the ground surface as it appears to the human eye. Although more difficult to interpret as it records surface geometry, radar imagery has the advantage of 24/7, all weather viewing capability. As shown in Figure 2, both types of imagery have been implemented for a range of earthquakes including the 1995 Kobe, 1999 Marmara and 2001 Bhuj events.

DAMAGE SCALES

Various damage scales have been used to measure the effects of earthquakes. One of the more popular scales is the European Macro-seismic Scale (EMS98). This scale provides visual and descriptive information on damage to masonry and reinforced-concrete buildings, as measured in five categories: Grade 1: negligible to slight damage; Grade 2: moderate damage; Grade 3: substantial to heavy damage; Grade 4: very heavy damage; and Grade 5: destruction or collapse. Yamazaki et al. (2004) and Matsuoka and Yamazaki (2004) utilized this scale in quantifying damage in a number of earthquakes including the Bam, Iran earthquake. In general, only damage states 1, and 4 and 5 are easily detectable using remotely sensed data (Huyck et al., 2004).

Huyck et al.(2004), developed a regional scale which quantified the percentage of collapsed or severely damage structures in moderate-sized zones. They used the following ranges of observed collapsed buildings to measure the severity of damage in two regions affected by the 1999 Marmara, Turkey earthquake: 0-6.25%; 6.25-12.5%; 12.5-25%; 25-50%; and greater than 50% collapsed structures. The results generally show that an increase in these values/ranges correlates well with an increase in change between before and after satellite imagery. This relationship holds true for different sensors (SPOT, and ERS) and using different change detection indices (correlation, coherence, and intensity difference).

Simpler measures have been successfully employed in some recent events using highresolution imagery. As opposed to measuring large areas of significant damage, some investigators have attempted to identify damage to specific buildings. Using Quickbird satellite images of the Boumerdes, Algeria earthquake, Rathje and Crawford (2003) applied semi-automated thematic classification algorithms to identify collapsed and pancaked buildings using only post-earthquake, pan-sharpened images. In addition, Saito and Spence (2004) used a texture-based analysis, namely semivariograms (in conjunction with spectral information), to classify four levels of debris in the Bam, Iran earthquake: debris with very rough texture; debris of a heavily damage or partially collapsed building; debris with high reflectance, and debris with comparatively lower reflectance.

STANDARDIZED SCALE – REQUIREMENTS

A standardized scale is needed in order to ensure consistent interpretation of remotely sensed images and data. Assessments that could potentially be based on these data and their use in damage detection algorithms include:

- Identification of areas of significant damage and disruption,
- Number of collapsed buildings or structures,
- Number of people killed or injured (based on the building damage assessments),
- Areas of inundation (caused by dam failure or tsunami), and
- Areas of utility outage (as measured by lack of power or nighttime lights).

Some of the requirements that should be addressed in establishing this scale include:

- 1. At a minimum, the damage scale must distinguish between collapsed and non-collapsed structures.
- 2. The scale must distinguish between image changes caused by building damage and those that reflect normal ambient effects, e.g., seasonal changes.
- 3. Ideally, the scale will identify the following structural damage states: tilting of buildings, and soft-story collapses or failures.

- 4. The scale should be employed using a variety of sensors, including optical (high-resolution), radar, and LIDAR.
- 5. The scale should distinguish damage to buildings and other infrastructure, such as roadways, bridges, utility equipment.
- 6. The scale should distinguish damage to residential, commercial and industrial facilities.
- 7. The scale should be updatable as new and better sensors emerge.

In the last meeting of EERI subcommittee (in 2004), the following challenges were identified in creating a standardized scale:

- Being able to agree on meaningful damage states,
- Fusing data from different sensors with different scales, spectral properties, temporal frequencies,
- Lack of ground truth data to corroborate damage assignments made from remotely-sensed data,
- Gap in understanding between users and technology developers,
- Overcoming barriers to acceptance. We have the technology, but potential users have yet to implement it. Why?

The discussion above is just the beginning of a more extended set of discussions that must occur among experts who are doing work on damage assessment using remote sensing technologies. So far, there have been two meetings in the last two years of the EERI Subcommittee on Remote Sensing. This particular meeting (Chiba, September 12-13, 2005) will represent the third meeting of this group. A major agenda item of the Chiba meeting will be the development of a standardized damage scale using remotely sensed data.

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