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An assessment of landslide distribution in the Faifa area, Saudi Arabia, using remote sensing and GIS techniques

T. Alharbi^{1,2}, M. Sultan¹, S. Sefry³, R. El Kadiri¹, M. Ahmed^{1,4}, R. Chase¹, A. Milewski⁵, M. A. Abdullah³, M. Emil¹, and K. Chounaird¹

¹Geosciences, Western Michigan University, 1903 W. Michigan Avenue, Kalamazoo, MI 49008, USA

²Geology and Geophysics, King Saud University, 2455, Riyadh, 11451, Saudi Arabia ³Saudi Geological Survey, Jeddah, 21514, Saudi Arabia

⁴Geology, Faculty of Science, Suez Canal University, Ismailia, 41522, Egypt

⁵Geology, University of Georgia, Geography-Geology Building, 210 Field Street, Athens, GA 30602, USA

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Correspondence to: M. Sultan (mohamed.sultan@wmich.edu)

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Abstract

An integrated approach was adopted over Faifa Mountain and its surroundings, Saudi Arabia, to identify landslide types, distribution, and controlling factors, and to generate landslide hazard maps (HMs). Given the inaccessibility of the area, we relied on remote sensing observations and GIS-based applications to enable spatial analysis of data and extrapolation of limited field observations. HMs were generated depicting debris flows within ephemeral valleys and on sparsely vegetated slopes (Type I), and landslides caused by failure along fracture planes (Type II). Type I HMs were generated applying linear relationships between Normalized Difference Vegetation Index (NDVI) and slope values and threshold slope values (ephemeral valleys: 30°; overland flows: 10 40.9°) that were both extracted over known debris flow locations. For Type II HMs, landslides were predicted if fracture planes had strike values similar (within 20°) to those of the slope face strike and dip angles exceeding the friction, but not slope angles. Comparisons between predicted and observed debris flows yielded success rates of 82% (ephemeral valleys) and 75% (overland flows); unverified predictions are 15

interpreted as future locations of debris flows. Our approach could serve as a replicable model for many areas worldwide, where field measurements are difficult to obtain and/or are cost prohibitive.

1 Introduction

- The Red Sea hills of the Arabian Peninsula are formed of a complex of volcanosedimentary igneous and metamorphic rocks that formed by accretion of island arcs and closure of interleaving oceanic arcs 550–950 Ma (Stoeser and Camp, 1985). The uplift associated with the opening of the Red Sea some 30 million yr ago exposed this complex along the length of the Red Sea on the African and Arabian sides (Wolfenden et al., 2004). The basement complex is unconformably overlain by Paleozoic, Mesozoic,
- and lower Tertiary sedimentary successions (Fig. 1a) (Agar, 1987). The study area,





Faifa Mountain and its surroundings in the Jazan region (latitude: 16.5–17.7° N; longitude: 42.0–43.8° E), is located within the basement complex of the Red Sea hills to the north of the Saudi–Yemen border line (Alehaideb, 1985; Abou Ouf and El Shater, 1992). In the study area, highly deformed rocks of variable compositions (granite gneiss, amphibolite, phyllite, quartzite, schist) are intruded by a massive syenite intrusion and the area is dissected by fault systems of variable directions. Elevations are high, reaching up to 1800 m above mean sea level (a.m.s.l.) at the top the mountains and as low as 230 m a.m.s.l. at the foot of the mountains (Fig. 2a). Precipitation is high (up to 800 mmyr⁻¹; Fig. 1b) and slopes are steep (up to 71°; Fig. 2b).

The discovery of oil in the Kingdom of Saudi Arabia signaled an important era in the construction of new urban centers and networks of highways. Faifa Mountain and its surroundings were no exception. These areas witnessed the construction of highways, roadcuts, and bridges to connect these remote mountainous terrains to the coastal

plain. Given the high precipitation over the Faifa area, the steep gradient, and the intensified constructional phase, landslides are becoming problematic. In this paper, we examine the distribution and nature of landslides, investigate the factors controlling their development, and use this information to construct landslide hazard distribution maps for the Faifa area. Our approach is largely based on observations extracted from remotely acquired datasets and field data.

2 Methodology

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Our approach involves the following steps: (1) examination of known landslide locations in the field and/or from high-resolution remote-sensing datasets, and characterization of their type; (2) extraction of criteria to enable identification of the known landslide locations using remote-sensing datasets; (3) use of the selected criteria to identify areas where similar landslide types could occur elsewhere in the study area; and (4) refinement and validation of predictions. Step 3 entails the construction of a hazard





map that shows the relative likelihood for the occurrence of each of the identified landslide types across the investigated area. On these maps, the likelihood for the occurrence of a landslide is dictated by the intensity of one or more of the factors controlling landslide occurrence. Examples of these factors include slope angle and direction, fracture plane dip angle and dip direction, vegetation intensity, and manmade structures (Cruden and Varnes, 1996).

To conduct steps 1 through 4, we had to produce many derived image products that display important topographic and spectral characteristics of interest that could be used to identify existing landslide locations and areas prone to landslide development.

- Examples include disruption of contoured elevations, decrease in vegetation, and high spectral reflectance within areas affected by landslides. Investigating the intensity of vegetation in an area was possible as a result of examining Normalized Difference Vegetation Index (NDVI) images; these were extracted from spectral reflectance images, which were in turn derived from raw DN (digital number images) of SPOT
- (Système Pour l'Observation de la Terre) multispectral images. Additional products were generated to evaluate the hazards associated with the identified landslide types. For example, to evaluate the hazards associated with debris flows on road networks and existing structures, maps showing the distribution of houses and roads were generated. These products and many others were generated and hosted in a Web-
- ²⁰ based geographic information system (GIS) (http://www.esrs.wmich.edu/webmap). Constructing the Web-based GIS made it possible to correlate spatial and temporal co-registered datasets and the development of conceptual models to identify the conditions for landslide development, predict the areas in which landslides could occur and identify locations for fieldwork to examine predictions and refine the adopted ²⁵ methodologies.

2.1 Generation of a Web-based GIS

The adopted approach entails the following: (1) compilation of relevant datasets, and (2) development of a Web-based GIS to organize and manage the datasets and provide

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a platform for users to access, visualize, and analyze the accumulated data types for the study area. The adopted system is a hybrid system that takes advantage of the existing tools and datasets in GoogleMaps, applies Python scripts to generate custom tools, and uses the ArcGIS server to host the services.

Three types of datasets that were collected for the study were also included in 5 the Web-based GIS (folder name: Faifa): (1) published datasets (geologic maps, remote sensing data); (2) derived products (e.g., false color images, contour maps); and (3) field data (e.g., dip direction and amount of fracture planes). Hazard maps were extracted from the analysis of the above-mentioned datasets and were also incorporated in the Web-based GIS. All of the above-mentioned datasets are included 10 in seven subfolders. (1) The "Topography" subfolder includes (a) a 10 m digital elevation model (DEM) (Fig. 2a) that was extracted from digital topographic contour maps provided by the Saudi Geological Survey (SGS); (b) a hillshade map; and (c) a slope map (Fig. 2b). (2) The "Remote Sensing" subfolder includes (a) a visible Google Earth image (spatial resolution: 0.56 m); (b) a false-color composite image from GeoEve 15 image (blue: band 1; green: band 2; red: band 3) (spatial resolution: 0.5 m); (c) Shuttle Imaging Radar band C (SIR-C) (spatial resolution: 50 m) data; (d) NDVI extracted from SPOT multispectral images (spatial resolution: 2.5 m), which provides a measure for the intensity of vegetation (Fig. 2c) (the higher the NDVI values for a picture element, the more extensive the vegetation, and vice versa; Rouse, 1973); (e) an 20 Advanced Spaceborne Thermal Emission and Reflection Radiometer (ASTER) falsecolor composite (blue: band 1; green: band 2; red: band 3) (spatial resolution: 15 m); (f) a Landsat Thematic Mapper (TM) false-color composite ratio image (blue: 5/4; green: 5/1, red: 5/7) (spatial resolution: 30 m). (3) The "Geology" subfolder includes (a) a scanned and digitized geologic map (Fairer, 1985) covering 1° latitude by 1.5° 25 longitude (scale 1 : 250 000), (b) distribution of faults/fractures extracted from geologic map (Fairer, 1985), ASTER, Landsat TM, SIR-C, and DEM; and (c) fracture dip aspect (direction) and amount, measured along the major roads by SGS geologists. (4) The





"Land Use" subfolder contains digitized buildings, roads, naturally vegetated areas,

bare soils, and terraces extracted from Google Earth and GeoEye images (Fig. 2d). (5) The "Hydrology" subfolder includes products that were extracted from digital 10 m DEM: (a) stream distribution (Fig. 2d) generated using standard techniques for stream delineation, such as the TOPAZ technique (Garbrecht and Martz, 1997; and (b) flow accumulation that provides a count for the number of pixels that drain towards a certain 5 pixel (Chang, 2006). (6) The "Field Data" subfolder is comprised of the type and location of the landslide sites (Fig. 2a) that were visited in the field (January 2010 and January 2012). (7) The "Hazard" subfolder includes various hazard maps generated for each of the two main types of landslides identified in the study area: those related to debris flows and those related to failure on fracture planes. 10

2.2 Landslide types in the study area

Our observations from field trips 1 and 2 (Fig. 3) and examination of remotely acquired datasets led us to identify two major types of landslides: those related to debris flows (Fig. 4a) and those related to failure along fracture planes (Fig. 4b). Next, we discuss the criteria by which we identify each of these landslide types from field and remotely acquired data and the methodology used to generate hazard maps for each of the identified landslide types.

2.2.1 Debris flows within ephemeral valleys

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Debris flows often have high densities, with over 80% solids by weight, and may exceed the density of wet concrete (Hutchinson, 1988). Debris flow occurs during torrential 20 runoff following exceptional rainfalls. Soils on steep slopes that are not protected by vegetation are prone to debris flows (Cruden and Varnes, 1996).

Our observations from field trip 1 and examination of remotely acquired datasets led us to identify a number of the visited landslides as being caused by debris flows that originated with abrupt floods of water that undermined and incorporated sediments.

sensing and GIS to assess landslides in Discussion Saudi Arabia T. Alharbi et al. Pape **Title Page** Abstract Introductio Discussion Conclusions Reference Tables **Figures** Papel ◀ Close Back **Discussion** Pape Full Screen / Esc **Printer-friendly Version** Interactive Discussion This conclusion is supported by (1) the localization of debris along discrete channels:

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(2) the fact that the landslides are all in high elevations (> 800 m a.m.s.l.), where the slopes are quite steep $(35-38^{\circ})$; and (3) the precipitation over these steep mountains is high (up to 850 mmyr⁻¹) (Fig. 1b) and will be channeled in the ephemeral valleys toward the lowlands (Cruden and Varnes, 1996). Given the steep surface gradient in the study area and the high precipitation over the mountainous area, one would expect a heavy sediment load to be carried to the lowlands by the ephemeral streams crosscutting these mountains.

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One would expect that, in general, the steeper the slope is along the identified streams, the more likely it is for a debris flow to occur. The mean slope in the area is 23° and the standard deviation is 13°. The steepest slopes are found on the mountainsides surrounding the valleys. Areas over these steep-sloped mountainsides are prone to mass movement (i.e., landslides) initiated by debris flow.

The lesser the vegetation, the more likely the stream will be effective in transporting debris downslope (Horton, 1933; Scott, 1971; Wells et al., 1987; Weirich, 1989;

- ¹⁵ Florsheim et al., 1991). Only barren or nearly barren slopes along the identified stream were considered subject to debris flows. The NDVI values (Fig. 2c) for the study area range from -0.18 to +1.0. Areas with NDVI values of -0.1 to 0.09 are usually considered barren rocks or dry soils (Jackson and Huete, 1991). Areas of high NDVI (shades of green) are less prone to debris flow, whereas areas of low NDVI values (area of human) are more areas to debris flow. During field trip 0 we visited areas
- (shades of brown) are more prone to debris flow. During field trip 2, we visited areas with NDVI values of 0.09 or less and found that all of these areas were barren or have very sparse vegetation.

The third condition has to do with the presence or absence of terraces. In some of these steep-sloped areas, the locals modify the slopes by building more stable structures called terraces. These terraces are concentrated at the higher elevations in the Faifa area. These structures enhance infiltration and reduce runoff (Naderman et al., 1990). Debris flows are less likely to occur in areas where terraces were established. Based on our field observations and analysis of Google Earth images,





we reached the conclusion that areas covered by terraces are stable areas that are not prone to debris flow. Figure 2d shows the distribution of terraces in the study area.

We extracted a relationship for the study area that adequately describes the interplay between the intensity of vegetation and the steepness of the slope. Using known

- ⁵ locations of debris flows (from field and satellite observations), we extracted the slopes and NDVI values for picture elements (pixels) that we identified as representing the onset points for each of these debris flows. The extracted slopes ranged from 30 to 42° and averaged 35°, whereas the NDVI values ranged from -0.04 to 0.24 and averaged 0.07. A linear regression was then used to identify the equation of a straight line that
- ¹⁰ best fitted the points with the steepest slope and the smallest NDVI values (Fig. 5). Knowing the equation of the straight line, we then substituted NDVI and slope values for all pixels of all streams in the equation to test whether the examined stream pixel is on the line (value = 0), above the line (value: -ve), or below the line (value: +ve). A hazard map was then constructed from pixels that were found to be on or below the
- line; in addition, the selected points had slope values that exceeded a threshold value of 30°, the minimum observed slope angle for debris flows visited in the field (Fig. 6). The constructed hazard map represents the locations along mapped stream lines that are susceptible to the development of debris flow. Points falling above the line were considered to be unsusceptible to debris flow. An additional condition was enforced:
 the points that were found to be susceptible to debris flow had to be outside the areas
- mapped as terraces.

Using the criteria listed above, a hazard map was constructed showing the distribution of areas that are prone to debris flows (1405 debris flows), hereafter referred to as predicted debris flows (Fig. 6a). Examination of Fig. 6b and c demonstrates the correspondence between the observed and predicted debris flows.

demonstrates the correspondence between the observed and predicted debris flows. Comparisons between the distribution of a subset of the predicted flows (500 debris flows extracted using a random number generator) and the observed debris flows in the field and from Google Earth images shows a success rate of 82%, where the





predicted flows exceed the observed flows. These additional locations probably mark potential areas where debris flows could be triggered in the future.

Debris flows could pose a risk to human life and property (e.g., buildings) if these flows intersect the roads, and if there were no or inadequate retaining walls in place.

- In both cases, we can test for the first condition using remote sensing data, but not the second. Figure 7 is a risk map showing 669 intersections of debris flows with roads and 76 intersections of debris flows with houses. A field shot of one of these debris flows that intersects a road is shown on Fig. 4c. In the absence of high special resolution DEM data, a number of these identified hazardous intersections turned out to be false
- alarms. For example, we found in field trip 2 that a number of the identified house locations at intersections with debris streams were on higher grounds than the streams that presumably intersect them. These types of false alarms were more pronounced for houses on high ground elevations. Unfortunately, these observations cannot be easily extracted from available remote-sensing data. Our field inspections in field trip 2
 showed that all space-borne debris flow/road intersections are valid and approximately
 - 60 % of the debris/house intersections are true.

Our field observations during field trips 1 and 2 for landslides (landslides 1–7, 11, 13, 14, 16, 18; Fig. 2a) and inspection of the distribution of these debris flows on Google Earth images showed that they are spatially correlated with the distribution of

- roads, and specifically the asphalt roads, suggesting a causal effect. Many of them seem to originate from, or are enhanced by, the construction of roads. The debris flows are readily identified from Google Earth images. The flows have distinctly more rocks (bright tones) and less vegetation (dark tones), and thus they appear as bright areas compared to their surroundings (Fig. 6c). The following features support the suggestion
- that the debris flows are apparently enhanced by the construction of roads: (1) the majority of these flows originate downslope from roads; (2) often the case debris flows start as overland flows downslope from roads but quickly become organized in one or more streams away from the road; and (3) debris flows are more pronounced at higher elevations, at road kinks, and along asphalt roads.





The above-mentioned observations and others across the entire Faifa area allowed us to develop a conceptual model for their development. In this model, precipitation over the mountains is channeled toward asphalt roads by streams that intersect the roads or by overland flow over the mountain sides. Upon reaching the roads, the flows (in stream or over the mountain sides) are often redirected to follow the gradient of the road instead of the gradient of the landscape. Once the road changes its orientation (e.g., at a kink), the flow on road surface is redirected; at this time it reverts to following the gradient of the landscape. The process is repeated as the flows intersect other roads downstream on their journey to the lowlands. Because asphalt roads – and to a lesser extent unpaved roads (highly compacted material) – are impervious layers, they have the effect of impeding infiltration and enhancing runoff.

2.2.2 Overland debris flows on sparsely vegetated slopes

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In the previous section, we dealt with hazards related to debris flow within streams. However, debris flow is not only restricted to streams; it occurs as overland flows as

- ¹⁵ well, where overland flow describes the tendency of water to flow across land surfaces, taking the form of a continuous sheet over relatively smooth soil or rock surfaces rather than being concentrated into channels (Horton, 1933). In natural systems, overland flow describes water that runs across the land after rainfall before it enters a watercourse, after it leaves a watercourse as floodwater, or after it rises to the surface naturally from underground. In our field area, overland flows occur on the sparsely
- vegetated, steep slopes of massive, crystalline, basement rocks that are abundant in the area.

Given the steep slopes of the mountainous terrain and the high levels of precipitation in the study area, one would expect that overland flows must play a role in transporting ²⁵ eroded material downslope (Horton, 1933). As is the case with organized debris flows along streams, one would expect that in general, the steeper the slope, and the less the vegetation, the more likely overland flows would be occur (Glancy and Harmsen, 1975).





The less vegetation there is in an area, the more likely it is that overland flow will be effective in transporting debris downslope (Horton, 1933; Scott, 1971; Wells et al., 1987; Weirich, 1989; Florsheim et al., 1991). Only barren or nearly barren slopes were considered to be subject to overland flows. A third condition for the occurrence of ⁵ overland flow has to do with the presence or absence of terraces. Overland flow is less likely to occur in areas where terraces were established. Terraces have the effect of reducing the steepness of slopes, increasing infiltration, and reducing runoff.

Three digital products, NDVI, slope, and terrace distribution, were used to generate a hazard map that reflects the areas prone to overland debris flows (Fig. 9). In the case of debris flows along streams, we used measurements (slope, NDVI) along the

- the stream network solely, but in the case of overland flow we used the data from the images in its entirety. In field trip 2, we visited many of the locations identified using the above-mentioned criteria. All of them showed evidence that overland flows occurred in these areas. An example of such a landslide is shown in Fig. 4d for landslide17 from Fig. 2a. Evidence included the presence of many locations rack units of various aircles.
- from Fig. 2a. Evidence included the presence of many loose rock units of various sizes on the investigated slopes and the presence of features indicative of water movement such as rills (a rill is a narrow and shallow incision into topsoil layers, resulting from erosion by overland flow or surface runoff).

We developed a hazard map (Fig. 9) that shows areas prone to the development of overland debris flows; the map takes into consideration the three criteria listed above: slope, NDVI, and the presence or absence of terraces. In the construction of the hazard map, we adopted the same methodology we used earlier to identify areas prone to the development of debris flow. We extracted the slopes and NDVI values over known locations of overland flows that were identified in the field. We then extracted a linear regression relationship that best fitted the points with the steepest slope and the largest

NDVI values (Fig. 8).

Knowing the equation of the straight line, we then substituted NDVI and slope values to test whether each of the examined pixels is on the line (value = 0), above the line (value: -ve), or below the line (value: +ve). A hazard map was then constructed from





pixels that were found to be on or below the line; in addition, the selected points had slope values that exceeded a threshold value of 40.9°, which represents the minimum slope for the overland debris flows visited in the field (Fig. 9). The hazard map represents the locations of areas susceptible to debris flow. These locations had 5 to be outside the areas mapped as terraces.

Inspection of Fig. 9 shows that the overwhelming majority of this type of landslide is expected to occur outside of the Faifa area. The reasoning is that the vegetation intensity is generally quite high within Faifa, but not in the surrounding areas (Fig. 2c). The presence of vegetation impedes mass movement by debris flow, and its absence

- promotes it. The total number of predicted overland debris flows is 3558. Comparisons 10 between the distribution of a subset of the predicted flows (500 debris flows extracted using a random number generator) and the verified overland debris flows from Google Earth images show a success rate of 75%, where the remaining 25% probably mark potential areas where debris flows could be triggered in the future.
- The predicted overland flow locations were inspected in the field and using Google 15 Earth and GeoEye images. The criteria that were used to verify the predicted overland debris flows include one or more of the following field and/or satellite-based observations: (1) the presence of many loose rock units of various sizes on the investigated slopes, and (2) the presence of features indicative of water movement, such as rills.
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2.3 Landslides caused by failure along fracture planes

Many landslides result from failure along preexisting fracture planes (Lowell, 1990). According to Norrish and Wyllie (1996), there are four necessary structural conditions we should consider for planar failure. First, the strike of the planer discontinuity must be within 20° of the strike of the slope face. Second, the dip of the planer discontinuity must be less than the dip of the slope face and in the same general direction. This condition does not apply to roads in the mountainous areas, where the road cut is usually a vertical wall. Third, the dip of the planer discontinuity must be greater than





the angle of the friction of the surface. The ideal friction angle of the rock material is partially controlled by the size and shape of the grains exposed on the fracture surface and by the mass of the block above the planer discontinuity. Fine-grained rocks and rocks with high mica content tend to have a low friction angle, whereas coarse-grained rocks have a high friction angle (Norrish and Wyllie, 1996). For example, granite has

rocks have a high friction angle (Norrish and Wyllie, 1996). For example, granite has high friction angle that ranges from 34 to 40° (Barton, 1973, 1974; Jaeger and Cook, 1976; Wylie, 1992; Wyllie and Norrish, 1996). Finally, the lateral extent of the potential failure mass must be defined either by lateral release surfaces that do not contribute to the stability of the mass or by the presence of a convex slope shape that is intersected
 by the planar discontinuity (Norrish and Wyllie, 1996).

Landslides, when they do occur, modify the landscape. In a simple model, mass movement associated with a landslide will move mass downhill, deposit the transported mass downhill, and disrupt the general slope in the area. On a contour map, these features could give rise to: (1) gentle slopes as indicated by widely spaced, wiggly contours representing chaotic surfaces formed by piling of accumulated debris downslope; and (2) steeper slopes represented by horseshoe, closely-spaced contours uphill (Casals, 1986; Keaton and DeGraff, 1996). In Fig. 10, we outlined a number of locations of possible historical landslides that display the relationships described above. In many of these locations, terraces were established. One interesting

²⁰ hypothesis worth investigating is that the locals targeted the areas of "mass deposition" within the ancient landslides to construct their terraces.

In this section, we use data collected along the major roads, our knowledge about the geology of the area, observations extracted from remotely acquired data, and GIS technologies to determine locations that are prone to movement along fracture planes.

²⁵ An intensive exercise was conducted along the major roads in Faifa to identify areas prone to mass movement along fracture planes. Ideally, one could extrapolate these measurements across the entire field area. Unfortunately, the measurements are limited in their areal distribution, making the application of simple extrapolation techniques an unreliable exercise. We made two main observations from the field





(fracture plane dip direction and dip angle), and satellite-based measurements (ASTER, DEM, SIR-C) that led us to believe that our limited field measurements could be used to infer the dip angle and direction of the fracture planes across large sections of the entire study area.

- ⁵ The first observation is that many of the slopes in the study area are apparently controlled by dominant fracture planes. This hypothesis was based on field observations made during our two field trips and by comparing the slope direction of a particular pixel with the measured dip direction of fracture planes that were measured in the examined pixel. Slopes controlled by fracture planes will dip in the same approximate direction. Thus, by identifying a particular slope direction that is consistently controlled by fracture planes dipping in the same direction, one can infer the presence of such fracture planes whenever that particular slope direction is encountered in the field area. For each slope direction angle (1–360°), we reported the number of locations where measurements were made, the dip direction, and dip
- angle for all fracture planes with dip direction similar (±20°) to that of the slope in the examined pixel. As described earlier, the fracture plane dip angle and direction measurements were collected along transects covering the Faifa main roads. For each transect, the major fracture plane directions were first identified; these ranged from one to five major fracture plane directions. For each of the identified major fracture plane 20 directions, representative measurements were acquired, averaged, and reported.

For each transect we compared the directions of the representative fracture planes with the slope direction along the transect. Two hundred and forty three slope directions were identified along the examined transects, only 106 of which were found to have one or more fracture planes dipping in a similar $(\pm 20^\circ)$ direction. A 50 % success indicates

that in half of the examined locations, we found fracture planes with dip directions similar to those of the investigated slope. The identified slopes were considered for extrapolation purposes only if consecutive (three or more) slope directions satisfied the above-mentioned condition. The rationale for setting this condition is that a prominent slope direction is rarely represented by a single and unique value, and is more likely





to be represented by a range of consecutive slope direction numbers. This statement applies to slope angle, fracture plane dip direction, and fracture plane dip angle. One or more factors could contribute to this, including (1) random variations in dip and slope directions and amounts, (2) human errors in collecting field measurements, and

- (3) averaging of measurements across the width and length of investigated pixels. The identified consecutive hazardous slopes were lumped in groups, where a group is represented by a range of slopes, typically three to five consecutive numbers, but could reach up to 23 slope numbers in some cases (see Table 1, Supplement). The slope groups were then subdivided into subgroups on the basis of the dip angles of
- ¹⁰ fracture planes. Typically, a group is subdivided into one to three subgroups. Average dip angles and directions were then obtained for each subgroup. Finally, we assigned fracture set information (average fracture plane directions and dip angles) to pixels with similar slope directions.
- The second observation is that the overwhelming majority of the valleys in the study area were found to be structurally controlled. This finding was based on examination of ASTER VNIR, SIR-C, and DEMS images that indicated that the majority of the valleys followed linear features, the orientation of which were found to be in four main directions: north–south, east–west, northwest–southeast, and northeast–southwest. We mapped the distribution of these zones (Fig. 11) using satellite imagery, DEM,
- and stream network. We mapped 572 major weakness zones in the study area. Many of the field measurements for fracture planes within the fractured/faulted zones indicated that the strike of the fracture planes was that of the fault or fracture zone. This observation allowed us to predict the presence of fracture planes within the fractured zones along its entire length and width that have the dip angle(s) and direction(s) of the
- fracture plane(s) measured within this zone. Our field- and satellite-based observations indicated that the longer the fracture zone, the greater its width; the zones varied in length from 93 to 2300 m and in width from 20 to 150 m.

Using the observations and methodologies described above, we were able to use the limited field observations in hand pertaining to the fracture plane orientation





to infer the fracture plane orientations across large sectors of the Faifa area and surroundings. We generated a map that displays fracture plane dip angle(s) and direction(s) across the entire Faifa area. The accuracy of our predictions was assessed by repeating the extrapolation steps described above using a subset (433 records) of

the available datapoints (559 records). The accuracy of the extrapolation technique was then assessed by comparing the predicted dip directions and amounts to those of the excluded 126 records. A prediction was considered to be successful if the predicted dip angle and direction was similar (within 20°) to that of a proximal (< 10 m) record. Predicted values for 75 of the 126 field measurement were found to be successful
 (success rate: ~60%).

The next step involved the utilization of the generated fracture plane map to extract a hazard map that shows the pixels that are prone to mass movement along the identified fracture planes (Fig. 12). To generate this hazard map we utilized (1) fracture amount and direction maps, (2) slope angle and direction maps, and (3) road

- ¹⁵ distribution and orientation maps. A pixel is considered to be hazardous if the following conditions are met: (1) the dip of the planar discontinuity must be greater than the angle of the friction of the surface (40°); (2) the strike of the planar discontinuity must be within 20° of the strike of the slope face; and (3) the dip of the planar discontinuity must be less than the dip of the slope face. The last condition is waived along the roads,
- ²⁰ because the road cuts in this steep mountainous area are near vertical. This distinction is reflected in Fig. 12, where two main groups are identified: hazardous areas along the roads (blue and yellow symbols) and distant from roads (red and green symbols).

3 Conclusions

We adopted an integrated (field and remote sensing) approach to accomplish the
 following in our test site, the Faifa mountain and surroundings in the Jazan area,
 Red Sea Hills, Saudi Arabia: (1) identify the types and landslides and map their
 distribution, (2) identify the factors controlling their distribution, and (3) generate





hazard maps outlining areas that are prone for the development of landslides. To compensate for the paucity of field data and the inaccessibility of the examined area, we adopted an approach that relies heavily on observations extracted from readily available remote sensing datasets and on the applications of GIS-based technologies

- to enable (1) spatial analyses of all relevant data sets (published datasets, derived products, and field data); and (2) extrapolation of the limited field observations that were acquired along the main roads across the entire field area. Examples of relevant remote sensing images and derived products that were analyzed in the GIS include Google Earth images, SPOT, DEMS, and landuse maps. Debris flows within ephemeral
- valleys occur on steep slopes along channel networks, in areas that are less vegetated than their surroundings; on contoured elevation maps (contour interval: 10 m), such areas show evidence of disruption of contours. The products (slope, channel network, and contoured elevations maps) that were used to extract the debris flow distribution in the study area were all derived from DEMs (contour interval: 10 m). Investigating the
- intensity of vegetation in an area was made possible by examining NDVI images that were extracted from SPOT multispectral images. Coverages depicting the distribution of roads and houses were used to evaluate whether the extracted debris flow distribution poses risks to the human population and properties.

Our approach depends on (1) identification and characterization of known landslide locations using field and/or high-resolution remote sensing datasets, (2) extraction of criteria to allow identification of known landslide locations using remote sensing datasets, (3) using the selected criteria to identify areas elsewhere in the study area where similar landslide types could occur.

Two main types of landslides were identified: the first is caused by debris flows within ²⁵ ephemeral valleys or by overland flows on sparsely vegetated slopes (Type I), and the second by failure along fracture planes (Type II). For the first type, steps 1 through 3 were implemented by extracting NDVI and slope values over known locations of debris flows and using this data to define linear relationships that allow the identification of areas prone to developing debris flows elsewhere in the study area. In constructing





debris flow hazard maps, additional constraints were specified: (1) minimum slopes of 30 and 40.9° for flows within ephemeral valleys and for overland debris flows over mountain slopes, respectively; and (2) absence of terraces, structures that enhance infiltration and reduce runoff, making it less likely for debris flow to occur.

⁵ Comparisons between the distribution of predicted and observed debris flows shows a success rate of 82% in case of the ephemeral valleys and 75% in case of the overland flows; the unverified debris flows are here interpreted as potential locations where debris flows could be triggered in the future. The debris flows pose a risk to human life and property; approximately 670 intersections with roads and ¹⁰ 75 intersections with houses were mapped where all space-borne debris flow/road intersections were found to be valid, but only 60% of the debris/house intersections were validated in the field.

For the second type of landslides (Type II), we took advantage of two main observations that allowed us to infer the dip angle and direction of the fracture planes across large sections of the entire study using a limited set of field measurements. These observations were (1) many of the slopes in the study area are apparently controlled by dominant fracture planes, and (2) many of the field measurements for fracture planes within the fractured/faulted zones indicated that the strike of the fracture planes was that of the fault or fracture zone. The measured and inferred fracture plane

- orientations were then used to generate a hazard map showing pixels that are prone to mass movement along fracture planes. The fracture planes for these pixels have strike values that are within 20° of the strike of the slope face and have dip angles that exceed the angle of the friction but are less than the slope angles. The last condition is waived along the roads, given that the road cuts are nearly vertical. We found 18181 picture
- elements that satisfy these conditions. Because comparisons between the distribution of predicted and observed fracture plane orientations showed a success rate of 60 %, we suggest that the reliability of the generated fracture plane hazard plane is 60 % at best. The adopted methodology is best suited for the detection of areas prone to planar sliding, but not for topples and wedge sliding. For example, one of the adopted criteria





for the detection of areas prone to failure along a fracture plane is the requirement that the dip direction is similar $(\pm 20^{\circ})$ to that of the slope. This is not necessarily required for topples and wedge sliding.

- As is the case with the Faifa area, many of the landslide occurrences worldwide are reported from remote areas that are distant from urban centers and lack adequate infrastructure and road networks, areas of high relief and steep slopes, all of which makes such areas largely inaccessible. Under these conditions, monitoring landslide activities using traditional methodologies becomes a difficult and expensive exercise. The methodologies adopted in this study rely heavily on readily available global remote-
- sensing datasets and utilize straightforward GIS technologies for spatial analysis of these datasets; therefore, they can offer reliable and cost-effective alternatives. A word of caution: the adopted approach should not be considered a substitute for traditional field-intensive methodologies and measurements, but should be only considered for inaccessible areas, where obtaining detailed field measurements is difficult and/or cost prohibitive.

Supplementary material related to this article is available online at http://www.nat-hazards-earth-syst-sci-discuss.net/1/6685/2013/ nhessd-1-6685-2013-supplement.pdf.

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Fig. 1. (a) Location map showing the location of the Faifa area in the Arabian Peninsula, the distribution of volcano-sedimentary igneous and metamorphic rocks, and overlying Paleozoic, Mesozoic, and lower Tertiary sedimentary successions in the Kingdom of Saudi Arabia. **(b)** Average annual precipitation (January 2011–December 2011) extracted from TRMM 3 hourly data for the Arabian Peninsula. **(c)** Main geologic map showing the rock units in the Faifa area (modified after Fairer, 1985).







Fig. 2. (a) Location map showing the distribution of landslides that were visited in the field (1–3, 6, 8, 10, 13–18) and a selected suite of similar landslides that were extracted from remotely acquired data (4, 5, 7, 9, 11, 12); background DEM image. (b) Map showing the distribution of slopes in the study area. (c) Color-coded NDVI image generated from SPOT image. (d) Land use map for the study area showing the distribution of roads, buildings, and terraces extracted manually from Google Earth images; stream networks extracted from 10 m DEM; and highly vegetated areas (NDVI: 0.09 to 1) and sparsely vegetated areas (NDVI: –0.18 to 0.09) generated from SPOT image. Also shown are the distributions of road networks.







Fig. 3. Location map showing the stops visited throughout field trips one and two.







Fig. 4. Field photographs taken throughout field trips one and two: **(a)** landslide caused by debris flows within an ephemeral valley; **(b)** area prone to landslide development by failure along fracture planes that dip towards the road; **(c)** intersection of debris flow with road; and **(d)** landslide caused by debris flow related to overland flow, where features indicative of overland flow include the presence of rills and loose rock units of various sizes on the slopes.







Fig. 5. Extraction of a relationship between the NDVI and the slope values for 26 debris flows within ephemeral streams that were verified in the field and/or by examination of Google Earth images. A linear regression was used to identify the equation of a straight line that best fitted the points with the steepest slope and the smallest NDVI values. Points plotting on or below the extracted line are susceptible to motion, whereas those above the line are stable.







Fig. 6. (a) Hazard map showing the distribution of the areas modeled as being prone to debris flows within ephemeral streams (red areas). **(b)** Enlargement of the boxed area in **(a)**. **(c)** Same as **(b)**, but with the modeled debris flow omitted. Note the correspondence between the modeled (**b**; red areas) and observed (**c**: bright areas) debris flows.



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Fig. 7. Risk map showing the intersections of debris flows within ephemeral streams with roads and with buildings.







Fig. 8. Extraction of a relationship between the NDVI and the slope values for 21 overland debris flows on sparsely vegetated slopes that were verified in the field and/or by examination of Google Earth images. A linear regression was used to identify the equation of a straight line that best fitted the points with the steepest slope and the smallest NDVI values. Points plotting on or below the extracted line are susceptible to motion, whereas those plotting above the line are stable.













Fig. 10. Contoured elevation map showing locations of possible historical landslides; these areas appear as domains of gentle slope surrounded by areas with steep slopes.



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Fig. 11. Distribution of the major zones of weakness (faults, fractures), sub-parallel and proximal fracture planes, and locations where field measurements (fracture plane orientations) were collected.







Fig. 12. Hazard map showing the distribution of picture elements along (blue and yellow symbols), and away from (red and green symbols) roads that are more likely to witness failure by motion on fracture planes. Information pertaining to the extrapolation technique that was applied to assign fracture set information to pixels is also provided in the figure; green and blue symbols refer to extrapolation related to "first observation" the red and yellow symbols are related to "second observation" (refer to Sect. 2.3).



