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Rainfall duration and debris-flow initiated studies for real-time monitoring

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Introduction

Duration is an important parameter with which to forecast the burst time of debris flows, particularly for a real-time monitoring system. The main triggering factor for landslides is rainfall, which is normally monitored and recorded by the distributed rain gauge stations. Therefore, the intensity versus duration relationship based on rain gauge data is used to monitor landslide and debris flow in real-time. Crosta and Frattini [\(2002\)](#page-8-0) gathered a worldwide data set and fit as a lower bounds threshold for landslides of pyroclastic covers. The effects of rainstorm characteristics (mean and maximum hourly

Abstract A rainfall-induced debris flow warning is implemented employing real-time rain gauge data. The pre-warning for the time of landslide triggering derives the threshold or critical rainfall from historical events involving regional rainfall patterns and geological conditions. In cases of debris flow, the time taken cumulative runoff, to yield abundant water for debris triggering, is an important index that needs monitoring. In gathered historical cases, rainfall time history data from the nearest rain gauge stations to debris-flow sites connected to debris flow are used to define relationships between the rainfall intensity and duration. The effects by which the regional rainfall patterns (antecedent rainfall, duration, intensity, cumulative rainfall) and geological settings combine

together to trigger a debris-flow are analyzed for real-time monitoring. The analyses focused on 61 historical hazard events with the timing of debris flow initiation and rainfall duration to burst debris-flow characteristics recorded. A combination of averaged rainfall intensity and duration is a more practical index for debris-flow monitoring than critical or threshold rainfall intensity. Because, the outburst timing of debris flows correlates closely to the peak hourly rainfall and the forecasting of peak hourly rainfall reached in a meteorological event could be a valuable index for real-time debris-flow warning.

Keywords Landslides \cdot Debris flows \cdot $Real-time monitoring \cdot Rainfall$ thresholds \cdot Chichi earthquake \cdot Taiwan

intensity, duration, and rainfall amount) on triggering of shallow landslides were assessed by Dhakal and Sidle ([2004](#page-8-0)), and Aleotti [\(2004](#page-8-0)).

Historical rainstorms demonstrate that a critical combination of rainfall intensity and duration was essential to triggering a debris flow in the San Francisco Bay region (Cannon and Ellen [1985](#page-8-0)). The threshold combination of rainfall intensity and duration could relate to the balance between the rates at which rainfall infiltrates and drains out of the colluvium (Campbell [1975\)](#page-8-0). Various rainfall parameters including antecedent rainfall, duration, intensity, and cumulative rainfall are used to reflect the rainstorm characteristics for delimiting the threshold or critical rainfall. Keefer et al. [\(1987\)](#page-9-0) calculated the critical volume of water required to trigger a debris flow based on the threshold parameters of the rainfall intensity and duration. The meteorological parameters of rainfall intensity and duration were also used for mapping rainfall thresholds of debris flow in the San Francisco Bay Region, California (Wilson and Jayko [1997\)](#page-9-0).

In this study, 1,104 slopeland hazard events data, including 153 debris-flow cases, were gathered. Among these, 96 collected historical cases, with the date on which debris-flow was initiated, were recorded, together with 61 cases with reported detail of debris-flow outburst time. This investigation collected and analyzed relationships between rainfall characteristics of peak hourly rainfall, duration and the time of debris-flow burst, as only rarely have studies focused on the influence of rainfall characteristics on the initiation and duration of debris-flows.

Debris-flow historical events collection

Data of hydroclimatic events induced by debris flows were collected from 1989 until the end of 2001. Meteorological events in the data include five rainstorm events and five typhoon-induced heavy rainfalls from Ofelia (June 1990), Herb (October 1998), Xangsane (November 2000), Toraji (July 2001), to Nari (September 2001) typhoon. In these data, only 61 debris-flow events were documented with the triggering time taken from newspapers or reported by interview with local residents.

In 1990, when Ofelia typhoon hit Taiwan, 430 mm of cumulative rainfall and 106 mm of intense peak hourly rainfall, resulted in 29 deaths and 6 people missing island-wide. In 1996, Herb typhoon hit Taiwan, bringing an unexpectedly high cumulative rainfall, up to 1,994 mm, leading to 27 people dead and 14 missing. After the Chichi earthquake happened in 1999, Xangsane typhoon in 2000 hit Taiwan resulting in 78 people

Fig. 1 Debris-flow hazard in Hontong primary school hit by Xangsane typhoon in year 2000

dead and 11 people missing. Figure 1 shows the debrisflow hazard in northern Taiwan, where a primary school was catastrophically damaged when the Xangsane typhoon hit Taiwan. In July 2001, Toraji typhoon struck Taiwan for 10 h, causing a high magnitude of slopeland hazards and resulting in 103 people dead and 111 people missing. During September 2001, Nari typhoon hit Taiwan accompanied by high daily rainfall, up to 820 mm within 1.5 days. The typhoon caused serious flood hazards, with 94 people dead and 10 people missing. In the typhoons, which hit Taiwan after the 921 earthquakes, rainfall related disasters caused considerably more deaths because of the earthquake induced loosening of soil mantles, leading to slopeland hazards which were easily triggered.

The 61 historical debris-flow events were categorized in a debris-flow inventory as shown in Table 1. Information from each event was condensed in a table, including the rainfall histogram, typhoon route, site location, triggering time, and geological information as

Table 1 Time of debris flows initiated and their corresponded rainfall characteristics

| Rainfall parameters Time of debris flow initiated | Debris-flow corresponded rainfall characteristics | | |
|---|--|--|--|
| | Prior to hourly peak rainfall (16 cases) | At the instance of hourly peak rainfall (10 cases) | Afterward hourly peak rainfall (13 cases) |
| Rainfall histogram characteristics | Debris flows initiated under intermittent rainfall (within 5 days) | | Initiated under a rolling rainfall |
| | Initiated at secondary hourly peak rainfall | | |
| Averaged duration | 19 _h | 25 _h | 43 _h |
| Averaged rainfall intensity at triggering | 50 mm | 75 mm | 30 mm |
| Averaged effective cumulative rainfall | 302 mm | 390 mm | 633 mm |

shown in Fig. 2. The data are divided into three categories: beforehand, afterward, and at the instance of peak hourly rainfall, by the time of debris-flow initiation and its correspondence with the peak hourly rainfall. The effective cumulative rainfall is the summation of cumulative rainfall (14 days prior to debris-flow triggering) and the antecedent rainfall multiplied by a decay factor of 0.9, defining the rate of soil moisture decline within a specific period by the Antecedent Soil Water [Status Model \(Glade et al.](#page-9-0) 2000). Two types of rainfall characteristics were separated and analyzed for intermittent rainfall type (within 5 days prior to initiated debris-flow) and rolling rainfall type as shown in Fig. 3.

The data were collected from nine counties, which covering three serious debris-flow counties, including Taipei, Nantou, and Hualian county as delineated in Fig. [4.](#page-3-0)

Geological setting

To understand the bedrock properties and the effects of rainfall duration on the time of debris-mass outbursts,

Fig. 3 Example of two types of rainfall characteristics to initiate debris-flow: a intermittent rainfall; b Rolling rainfall

61 collected data were superimposed on the simplified geologic map in Taiwan as shown in Fig. [5.](#page-3-0)

Collected debris-flow sites in northern Taiwan are mainly positioned in alluvium stratum and sedimentary rocks, while those in western Taiwan are settled in sedimentary rock and metamorphic rock. The rocks in the eastern Central Range of Taiwan differ significantly from metamorphic to igneous rock (andesite and andesite proclastics) and to slate rock in the eastern coastal range. The longitudinal valley fault sits in the common boundary of metamorphic rock and the eastern coastal range, in which four debris-flow sites are also located.

Statistical analysis

Statistics and regression analyses were adopted to explore the effects of rainfall characteristics (critical rainfall intensity, duration, and rainfall patterns) on the triggering mechanism of debris flow (rainfall time lag to initiate a debris flow) based on the debris-flow inventory.

Figure 6 [presents the statistical frequency histogram](#page-3-0) [for critical rainfall duration to trigger debris flows.](#page-3-0)

Fig. 4 Site locations of 61 historical debris-flow cases

There are 39 statistical cases after taking out debris-flow cases using the same rain gauge station data (39 statistical cases are left). Most debris flows were initiated within 10 h (20 cases) after rainfall started, including cases initiated following the Chichi earthquake (21 September 1999) caused by the Toraji typhoon, reveals the influence of the 921 earthquake in reducing the critical rainfall duration characteristics necessary to trigger a debris-flow.

Fig. 5 Simplified geologic map in Taiwan (after Central Geologic Survey)

Fig. 6 Frequency statistic for critical rainfall duration

The time lag histogram for debris-flow initiation to peak hourly rainfall is presented in Fig. [7. Most debris](#page-4-0) [flows \(59%\) were initiated 1 h prior to and following the](#page-4-0) [time of peak hourly rainfall. The time lag for initiating](#page-4-0) debris flows is within -13 (prior to the peak hourly [rainfall\)](#page-4-0) \sim [45 h \(after the peak hourly rainfall\),](#page-4-0) -1 \sim [18 h,](#page-4-0) [and](#page-4-0) $-5 \sim 10$ h, for the rainstorm induced, typhoon in-duced and post -[921 earthquake, respectively. The time](#page-4-0) [lag of typhoon-induced debris flows was shorter than](#page-4-0) [rainstorm-induced, and the effects of the 921 earth](#page-4-0)[quakes reduced the time lag for initiating debris flows.](#page-4-0) [The time lag from peak hourly rainfall to initiate debris](#page-4-0)[flow is further classified into two groups for rolling](#page-4-0) [rainfall and intermittent rainfall \(a series of discontinu](#page-4-0)[ous rainfalls within 5 days of initiated debris-flow\)](#page-4-0) [characteristics as depicted in Fig.](#page-4-0) 8. Debris flows initi[ated under the intermittent rainfall were more closely](#page-4-0) [correlated to the peak hourly rainfall than under the](#page-4-0) [rolling rainfall.](#page-4-0)

Fig. 7 Time lag for peak hourly rainfall to the triggering of debris flows

Figure 9 shows the critical rainfall intensity versus duration graph. There were 19 debris flows triggered after the 921 earthquakes, in which there were seismically induced landslides within the watersheds, an [example of which is shown in Fig.](#page-5-0) 10 for Hazard ID 455 [with](#page-5-0) $13,400 \text{ m}^2$ $13,400 \text{ m}^2$ $13,400 \text{ m}^2$ $13,400 \text{ m}^2$ [\(3.9% of the watershed\) of landslide](#page-5-0) [areas. The lower initiated rainfall threshold intensity or](#page-5-0) [lower critical rainfall duration to outburst debris-flow is](#page-5-0) [governed by the seismic effects. The lower bound of the](#page-5-0) [rainfall intensity–duration relationship, after excluding](#page-5-0) [the effects of the 921 earthquakes, can be referred to as:](#page-5-0)

$$
I_{\rm c} = 38.86D^{-0.34} \tag{1}
$$

The mean rainfall intensity and critical rainfall duration relationship for the historical data is shown in Fig. [11.](#page-5-0) [The lower bound of the mean rainfall intensity–duration](#page-5-0) [can be regressed as:](#page-5-0)

$$
I = 115.47D^{-0.80}
$$
 (2)

The regressed threshold equation is close to the averaged line as suggested by Guadagno [\(1991\)](#page-9-0). This finding suggests that a higher rainfall threshold under the same duration is essential to initiate a debris-flow than by the Caine ([1980](#page-8-0)), Ceriani et al. ([1992](#page-8-0)), and Calcaterra et al. ([2000\)](#page-8-0) results that were mainly considering shallow landslide cases. A comparison between Figs. 9 [and](#page-5-0) 11 [for the critical rainfall-intensity duration and mean](#page-5-0) [rainfall-intensity duration relationships, respectively,](#page-5-0) [reveals that seismically induced landslides within a wa](#page-5-0)[tershed would reduce the critical rainfall intensity to](#page-5-0)

Fig. 8 Time lag to the triggering of debris flows for different rainfall characteristics: a rolling rainfall; b intermittent rainfall

Fig. 9 Critical rainfall intensity–duration graph

[trigger a debris-flow while there was little reduction of](#page-5-0) [mean rainfall intensity. This observation implies that for](#page-5-0) [those debris-flow cases, the interaction between debris](#page-5-0)[flow triggering and earthquake effects is undefinable](#page-5-0) [herein. Therefore, the mean rainfall-intensity duration](#page-5-0) [relationship is a better index than the index of critical](#page-5-0) [rainfall-intensity duration for debris flows in real-time](#page-5-0) [rainfall monitoring.](#page-5-0)

Implications for real-time rainfall monitoring

Using the results of statistical analyses, steps toward real-time debris-flow monitoring are divisible into three sequences, including real-time rainfall monitoring for debris-flow triggering mechanisms, geological conditions, and debris-flow initiated time estimation. The first step, monitoring the rainfall by rain gauge, leads to judging the possibility of triggering debris flows by current rainfall data. The geological condition aids the comprehension of source material properties and re-

Fig. 10 Debris-flow watersheds affected by the 921 earthquakes

gional debris-flow triggering characteristics. Debris-flow initiation time is established by the statistical results of historical events and regional geological conditions.

Triggering mechanism for debris-flow monitoring

Debris flows initiated under a rolling rainfall often burst under higher rainfall intensity than those which were initiated by intermittent rainfall as shown in Fig. 12. The intermittent rainfall-induced debris flows were determined by higher effective accumulated rainfall. In the

Fig. 11 Critical rainfall duration and mean intensity for initiation the debris flows

Fig. 12 Critical rainfall intensity and effective cumulative rainfall

historical data, the minimum effective cumulative rainfall to initiate a debris-flow was over 150 mm. The 200 mm of cumulative rainfall and 20 mm/h of rainfall intensity or over about 400 mm of effective cumulative rainfall were necessary to burst a debris-flow under a rolling rainfall. For debris flows, initiated through intermittent rainfall, a minimum of 200 mm rainfall was required to trigger debris flows.

Regional debris-flow outburst characteristics

Figure 13 [summarizes the statistical results of stream](#page-6-0) [bedrocks and their corresponding debris-flow initiation](#page-6-0) [time. Among the 61 collected data with the initiation](#page-6-0) [time of the debris-flow 90% of debris flows with igneous](#page-6-0) [bedrock were initiated at approximately the same time](#page-6-0) [as the peak hourly rainfall was reached, and only minor](#page-6-0) [cases occurred sometime beforehand. In the eastern](#page-6-0) [coast range, four debris-flow events within the longitu](#page-6-0)[dinal valley fault were outbursts at the peak hourly](#page-6-0) [rainfall and only one site in the eastern coast range was](#page-6-0) [initiated afterwards. Streams in sedimentary and meta](#page-6-0)[morphic rocks triggered debris flows less frequently at](#page-6-0) [the instance of peak hourly rainfall and tended to initi](#page-6-0)[ate the debris-flow after the peak hourly rainfall, which](#page-6-0) [could reflect the loose or fracture characteristics of](#page-6-0) [bedrocks. In addition to the important effects of regional](#page-6-0) [rainfall characteristics, other factors, e.g., the material](#page-6-0) [properties and physiographic factors, will control the](#page-6-0) [initiated time of debris masses.](#page-6-0)

Fig. 13 Histogram showing the stream bedrocks and their corresponded debris flows initiated time

Debris-flow initiated time estimation

Table 2 [lists the initiation time of debris flows and cor](#page-7-0)[responding rainfall characteristics for the 61 collected](#page-7-0) [cases, but no rain gauge data were repeated \(39 rainfall](#page-7-0) [stations\). Debris flows initiated before and after the](#page-7-0) [hourly peak rainfall were ascribed to the longer duration](#page-7-0) [than that initiated at the time of peak hourly rainfall.](#page-7-0) [Debris flows initiated before the peak hourly rainfall](#page-7-0) [were frequently triggered by intermittent rainfall and](#page-7-0) [burst at the secondary peak hourly rainfall. Debris flows](#page-7-0) [that triggered after the hourly peak rainfall were ob](#page-7-0)[served to be initiated after a rolling rainfall and attrib](#page-7-0)[uted to higher cumulative rainfall than other types.](#page-7-0) [Those debris flows initiated at the instance of peak](#page-7-0) [hourly rainfall were triggered at higher rainfall intensity](#page-7-0) [than in the other two cases.](#page-7-0)

Debris-flow triggering time is estimated based on the rainfall characteristics (duration, intensity, and cumulative rainfall), geological conditions, and is closely correlated to the time of peak hourly rainfall for intermittent rainfall characteristic. Means to measure the time of peak hourly rainfall by satellite or radar images (Hsu et al. [2002](#page-9-0); Kidd et al. [2003](#page-9-0)) is in development and not discussed herein.

Flowchart for debris-flow real-time monitoring by rain gauge

An operating procedure is proposed for debris-flow precautions based on real-time rainfall monitoring. The flowchart for debris-flow monitoring is shown in Fig. [14,](#page-8-0) [with comments as follows:](#page-8-0)

- 1. Triggering mechanism for debris-flow monitoring as cumulative rainfall up to 150 mm
- 2. For an intermittent rainfall characteristic, debris flows could trigger as

(a) cumulative rainfall up to 200 mm, and (b) reach to Eq. 2,

- 3. For a rolling rainfall characteristic, debris flows could trigger as,
- (a) cumulative rainfall up to 400 mm, or
- (b) rainfall intensity over 20 mm and cumulative rainfall over 200 mm, and
- (c) reach to Eq. 2,
- 4. Verifying the regional geologic conditions and debrisflow triggering characteristics, for debris-flow initiated time prior to, at the instance or after the peak hourly rainfall,
- 5. Debris-flow initiation time estimation.

Nearly 60% of debris flows initiated within the period of prior to and afterward 1 h to the time of peak hourly rainfall reached through an intermittent rainfall was observed by the statistic analysis result. For watersheds under a rolling rainfall accompanied by high cumulative rainfall, debris flows tend to initiate after the hourly peak rainfall. For watersheds through high rainfall intensity, debris-flow is likely to initiate at the instance of hourly peak rainfall.

Conclusions

This study presents an operational procedure based on rainfall characteristics and geological setting, for debrisflow monitoring. According to statistical results of historical debris-flow, rainfall characteristics and regional geological conditions are attributable to the debris-flow outburst time prior to, at the time or after the hourly peak rainfall. Additionally, the seismically induced landslides in the watershed would reduce the critical rainfall duration to trigger a debris-flow and the mean rainfall intensity duration relationship is an applicable

index for debris-flow rainfall monitoring. Results of this investigation also suggest that a debris-flow monitoring system for island-wide Taiwan considering the different geological conditions and rainfall characteristics is essential for monitoring regional debris-flow outburst characteristics.

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