



**Determination of
rainfall thresholds by
a probabilistic and
empirical method**

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**Determination of rainfall thresholds for
shallow landslides by a probabilistic and
empirical method**

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Segoni et al. (2014). (ii) Daily precipitation and antecedent effective rainfall, e.g. Glade et al. (2000), Guo et al. (2013). (iii) Cumulative precipitation-duration thresholds, e.g. Aleotti (2004). (iv) Cumulative precipitation-average rainfall intensity thresholds, e.g. Hong et al. (2005). (v) Combination of cumulative rainfall threshold, rainfall intensity-duration threshold and antecedent water index or soil wetness, e.g. Baum and Godt (2009).

Various critical threshold values and equations have been proposed for different regions, such as Seattle, on the West Coast of the USA (Baum and Godt, 2009), the Adriatic Danubian area in central and southern Europe (Guzzetti et al., 2007b), and Xi' an, Shanxi Province, China (Zhuang et al., 2014). For Tuscany, Italy, Segoni et al. (2014) presented a mosaic of several local rainfall thresholds instead of a single regional value. They established a relation between the threshold parameters and the prevailing lithology, which significantly enhances the effectiveness of an early warning system. However, all these rainfall thresholds strongly depend on the local physiographic, hydrological and meteorological conditions (Guzzetti et al., 2007a). They suffer as well from the lack of necessary resources for provision of continuous support or expansion of services. The application of these methods in other regions is therefore very difficult. Presently, most mountainous regions in China lack available rainfall records and landslide occurrence information, which makes it difficult to establish rainfall thresholds for landslides in a short period of time.

This paper presents the results of a recent study on rainfall thresholds for shallow landslides at a regional scale to overcome the aforementioned difficulties: the thresholds are determined with rigorous statistical techniques from two rainfall parameters. This paper contains (i) the description of a method to calculate rainfall thresholds from limited available data and time; (ii) the application and improvement of the rainfall threshold for landslide early warning in a case study.

2 Study area

The Huangshan study area is located in Anhui Province, Eastern China (Fig. 1), and covers an area of 9807 km², most of which are tablelands and mountains, with elevations ranging from 1000 m to 1873 m above sea level (a.s.l.) and some areas between the mountains with elevations lower than 500 m a.s.l. The Huangshan region has a population of 1.47 million (in the year 2012). In the mountainous areas, the general climate is moist monsoonal and subtropical with an average yearly temperature of 15.5–16.4 °C, although this is strongly dependent on the altitude, especially above 1000 m a.s.l. The total annual rainfall ranges from 1500 to 3100 mm, most of which is falling on the southern slopes from May to October.

The landslide-prone areas lie between the Southern Yangtze Block (South of the Yangtze Plate) and the transitional segment of the Jiangnan uplift belt. The main fault zones are NE- and EW-trending which determine the local tectonics and topography, and one fault called as Xiuning fault separates the mountains from the hilly parts and plains, as shown in Fig. 2 (Ju et al., 2008). The rocks in the study area range from Late Precambrian to Upper Triassic in age and consist mainly of granite, dolomite, limestone, sandstone, slate and shale. The complicated geological condition, the numerous heavy rainfall events and the numerous human activities in the area caused numerous landslides, leading to catastrophic economic losses and large numbers of fatalities in recent years.

3 Materials and methodology

The methodology used in this study mainly consisted of two components: (i) collect landslide and rainfall records and (ii) analyze the relationship between rainfall and landslide occurrence with probabilistic and empirical methods. The flow diagram of this approach is described in Fig. 3. Several ways have been used in this study to collect

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a period lasting 6 h. With this definition, I_h and R_t can be calculated easily from the rainfall record.

R_t and I_h can be plotted in a graph with x and y axes. Rainfall records accompanied by or without landslide occurrences can be shown in this graph (Fig. 5). Subsequently, following the method proposed by Jan et al. (2002) and modified by Zhuang et al. (2014), the rainfall thresholds for shallow landslide can be determined as follows.

3.2.1 The lower envelope of landslide occurrence

Draw a line with a gradient ($-a$) under the lowest points which represent landslide occurrences under such rainfall condition. This is shown with a blue line in Fig. 5. The area between the blue line and the x and y axes defines combinations of R_t and I_h with a zero probability of landslide occurrence (PRO = 0%). For a safer consideration, the probability is defined as PRO = 10%, as shown in Fig. 5.

3.2.2 The upper envelope of landslide occurrence

Similarly, a line with the same gradient can be drawn above the highest points representing combinations of R_t and I_h without occurrence of landslides, as shown with a red line in Fig. 5. The area above the red line represents combinations of R_t and I_h with a 100% probability of landslide occurrence (PRO = 100%). For a safer consideration, the probability is defined as PRO = 90%, as shown in Fig. 5.

3.2.3 The algorithm for each probability line

In the area between the lower envelope (blue line) and the upper envelope (red line), probability lines can be defined by the same method (Fig. 5). The algorithm for each probability line is shown in Eq. (1).

$$R_t + aI_h = C, \quad (1)$$

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where R_t is the accumulated precipitation (mm), I_h is the hourly rainfall intensity (mm h^{-1}) and C is a numerical constant.

According to Eq. (1), there must be two constants C_{\min} and C_{\max} , corresponding to the lower envelope and the upper envelope respectively. There is an uncertain value C in the area between the C_{\min} and C_{\max} . The relation between the value C and the probability of landslide occurrence (PRO) can be calculated by Eq. (2).

$$\frac{C - C_{\min}}{C_{\max} - C_{\min}} = \left(\frac{\text{PRO} - 0}{1 - 0} \right)^2 = \text{PRO}^2 \quad (2)$$

Equation (2) can be changed to Eq. (3) for a better understanding.

$$C = C_{\min} + (C_{\max} - C_{\min}) \cdot \text{PRO}^2 = C_{\min} + \Delta C \cdot \text{PRO}^2 \quad (3)$$

Then, a line for each probability for shallow landslide occurrence can be drawn in the graph by Eq. (3), as shown in Fig. 6.

3.2.4 Modification and application in Huangshan region

While drawing the first probability line (blue line), the gradient ($-a$) is an uncertain parameter, dependent on experiences or on historical data sets (Jan et al., 2002). To deal with this problem, another parameter (W) has been defined as shown in Eq. (4).

$$W = R_t \cdot I_h, \quad (4)$$

where R_t is the accumulated precipitation of one rainfall event (mm), I_h is the maximum hourly rainfall intensity (mm h^{-1}). So, the W represents a combination of the influence from both rainfall factors on landslide occurrence.

Based on the results from Eq. (4), the lowest 3–5 available points of rainfall records with landslide occurrence in a descending sequence, can be selected to determine the gradient ($-a$) of the lower curve by the least squares method. For a safe landslide

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early warning in Huangshan region, the probability of the lower curve is defined as $PRO = 10\%$ (C_{10}), and the probability of the upper curve is defined as $PRO = 90\%$ (C_{90}). Each probability line between them can be calculated with Eq. (5).

$$C = C_{10} + (C_{90} - C_{10}) \cdot \frac{(PRO - 0.1)^2}{0.64} \quad (5)$$

5 When $PRO = 10\%$, in Fig. 5, the formula of the lower curve is $R_t + 13.5/h = 200$, thus $C_{10} = 200$; and when $PRO = 90\%$, the formula of the upper curve is $R_t + 13.5/h = 600$, thus $C_{90} = 600$. Then, Eq. (5) can be modified into Eq. (6).

$$C = 200 + 400 \cdot \frac{(PRO - 0.1)^2}{0.64}, \quad (6)$$

10 where PRO is between 0.1 and 0.9. Based on Eq. (6), each probability line for rainfall-induced landslide occurrence can be drawn in the graph (Fig. 6).

There are 16 points of landslides in the area that occurred where $PRO = 10\text{--}50\%$ ($C_{10\text{--}50}$), as shown in Fig. 6, and 38 points in the area where $PRO = 10\text{--}90\%$ ($C_{10\text{--}90}$). The ratio between $C_{10\text{--}50}$ and $C_{10\text{--}90}$ is 42%, which is less than 50% but it is still reliable enough for initial application. When more data come available, they will make
15 the method more accurate and more suitable for shallow landslide early warning.

4 Example of application

According to the national standard, a four-level early warning scheme (Zero, Outlook, Attention and Warning) for rainfall-induced shallow landslides in the Huangshan region are defined. A corresponding four color-coded scale (Blue, Yellow, Orange and Red) of warning levels is shown in Fig. 7.
20

Figure 7 shows that the probability of landslide occurrence in the blue area is less than 10%, indicating that landslides are very unlikely to occur. At this probability level,

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for landslide early warning must be regarded as a long-term research activity before it can be used as a reliable approach in the future.

In spite of these limitations, we can conclude that the presented method to establish threshold lines from limited data sets facilitates the prediction of occurrences of rainfall-induced shallow landslide, which is useful for landslide prevention and mitigation at an early stage. Moreover, the rainfall threshold curves can be improved when more data are collected in the future.

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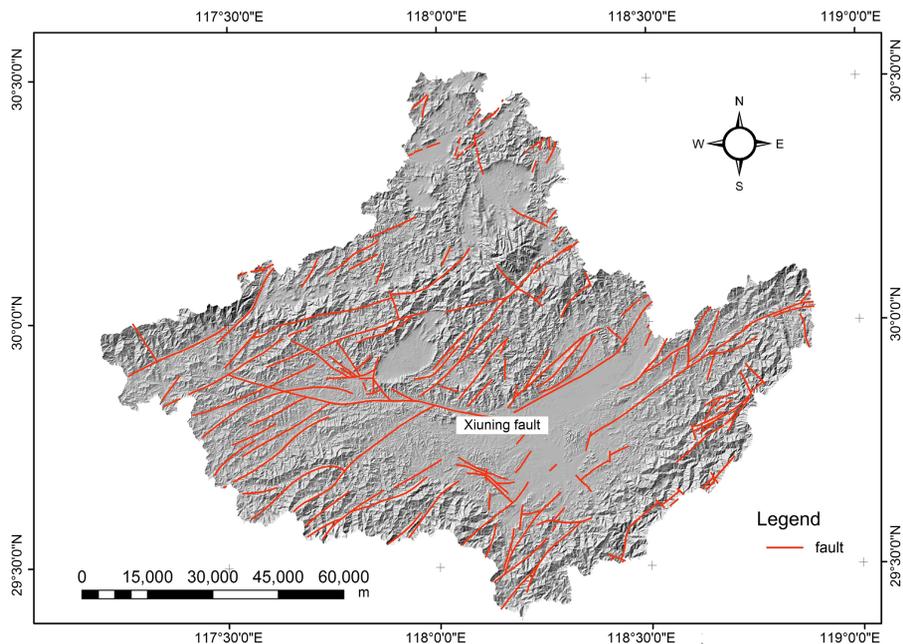


Figure 2. Faults distribution of the Huangshan region with a DEM background.

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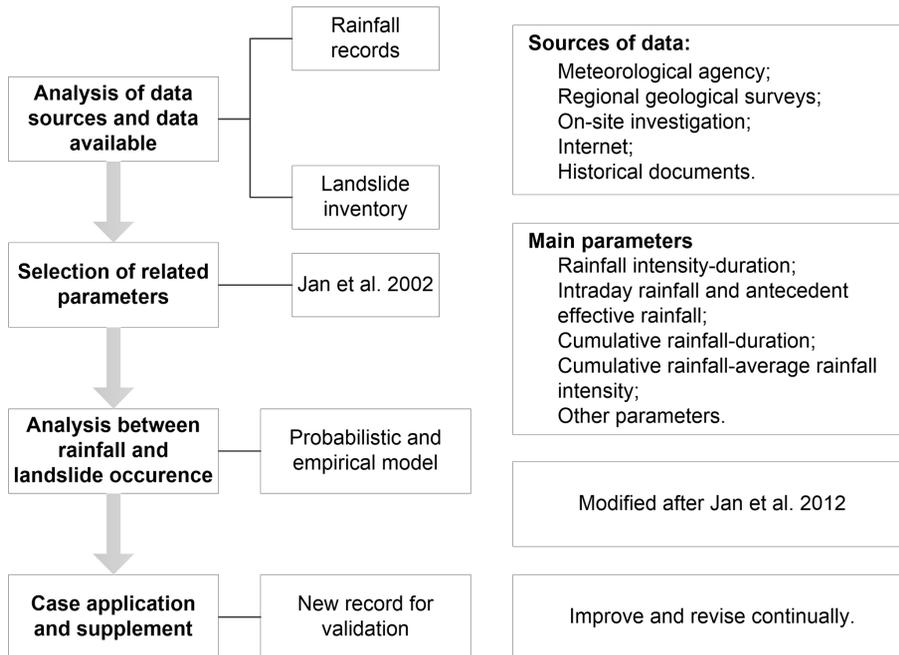


Figure 3. Flow chart illustrating the procedure to determine rainfall thresholds.

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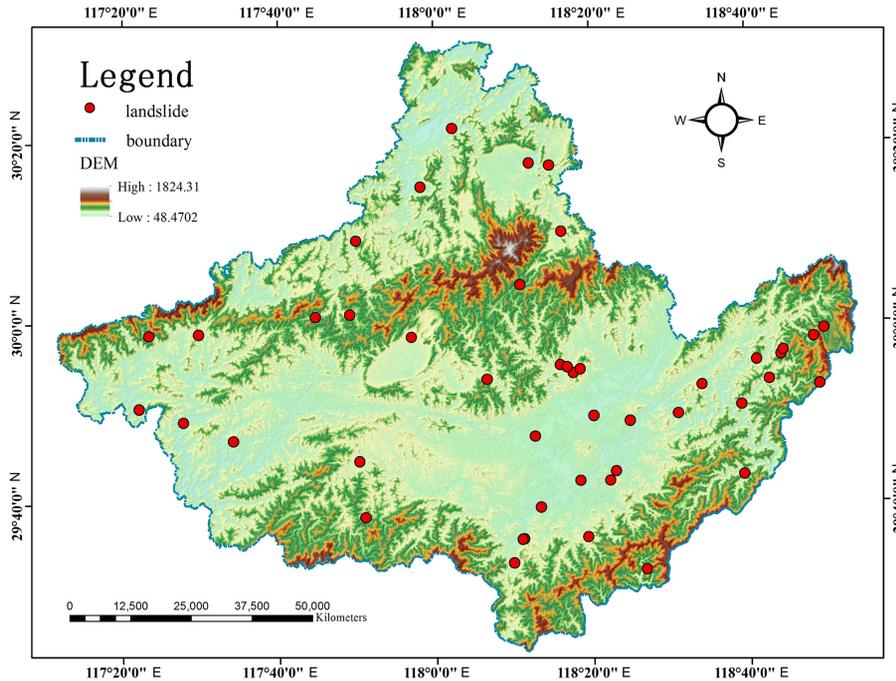


Figure 4. Location of rainfall-induced shallow landslide in the Huangshan region (2007–2012).

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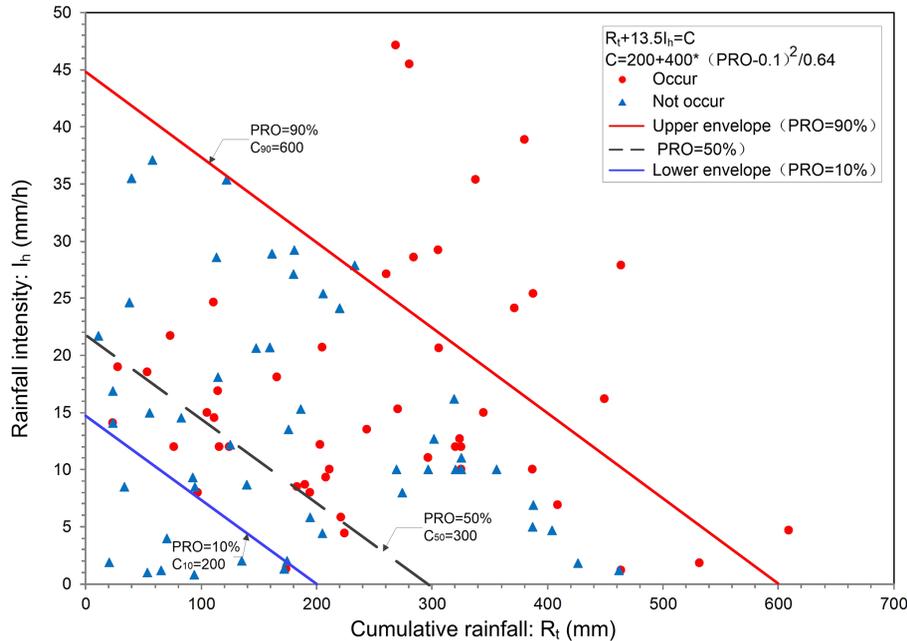


Figure 5. r_t – I_h graph for occurrence and non-occurrence of landslide events in the Huangshan region based on historical rainfall data. The red points and blue triangular points indicate occurrences and non-occurrences.

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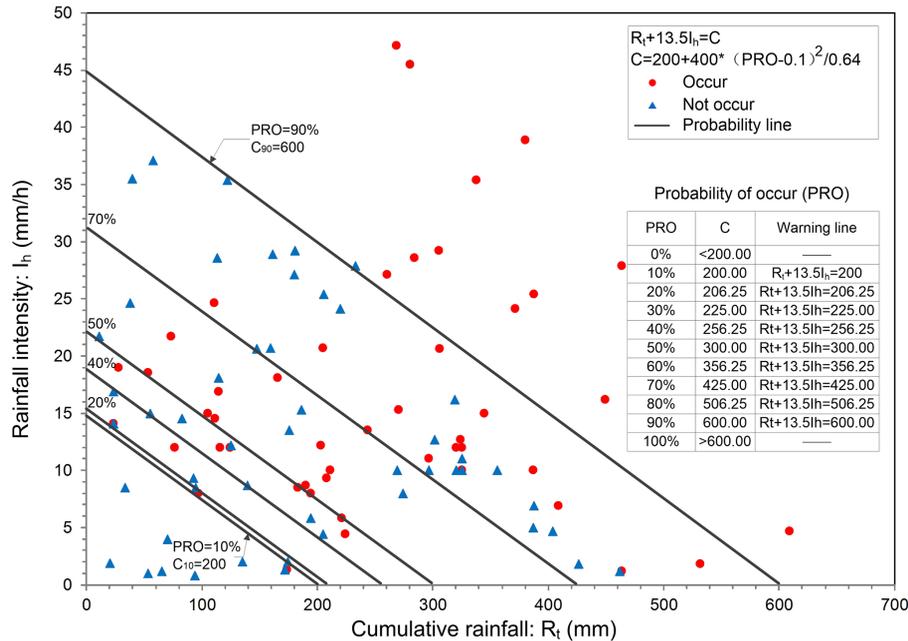


Figure 6. Several probability lines in Huangshan region based on the proposed approach.

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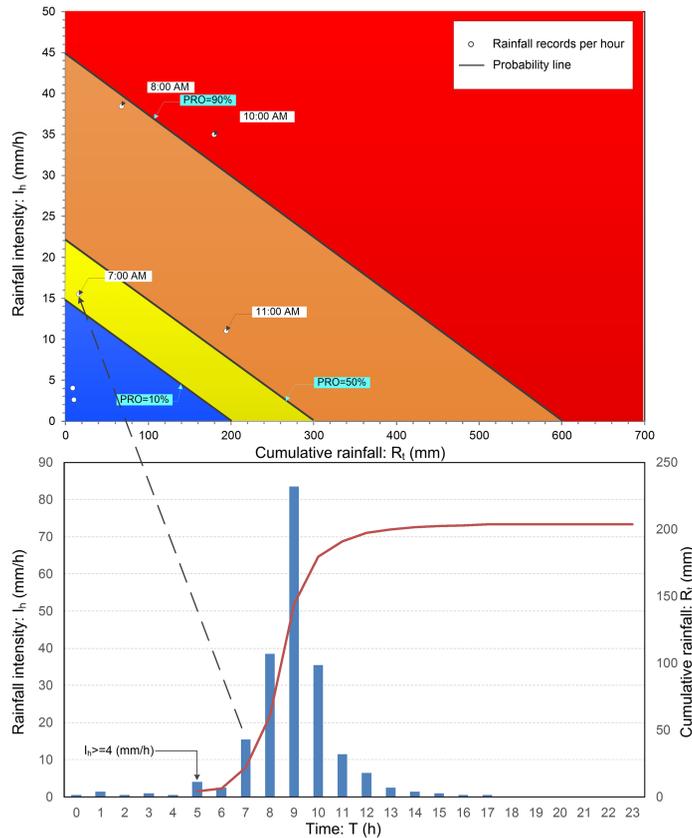


Figure 8. Application of the methodology in the Huangshan region (rainstorm of 30 June 2013).

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