ANALYZING SURFACE ROUGHNESS MODELS DERIVED BY SAR AND DEM DATA AT GEOTHERMAL FIELDS

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Abstract - Surface roughness is a physical property which is used in many applications such as hydrological analyses, erosivity of rocks, and identification of geothermal surface manifestations. In this study, the surface roughness was calculated by a pin-meter. This tool is expected to be able to measure the fragmental size at ground surface. However, there is a possibility that the tool still has some errors from the effect of topography undulation. In previous research, detrending method was used to minimise the topographical effect in the measured surface roughness. In this paper, we used Synthetic Aperture Radar (SAR) data from Sentinel-1A, and Digital Elevation Model (DEM) SRTM to evaluate the effectiveness of detrending method of pin-meter. Therefore, the measured surface roughness originated solely from fragmental materials. The selected research areas were Wayang Windu and Patuha geothermal field in Indonesia. Modelling the surface roughness by Sentinel-1A image was conducted by utilising backscattering coefficient and local incidence angle. While surface roughness model from DEM is formed by the Root mean square (RMS) for each grid with the optimum size 19×19 pixels. Both models were compared to pin-meter data which have been detrended. Then, the comparison was analyzed based on determination correlation value ($R^2$). Surface roughness model derived by Sentinel-1A produced $R^2$ about 0.1130 higher than DEM about 0.060. It might indicate that the surface roughness measured by the pin-meter following detrending process is free from the effect of topography undulation. Then, surface roughness model derived by Sentinel-1A data was used to identify surface manifestation. Analysis was performed based on pH measurement at field and scatter plot pattern. According to the selected model, the surface roughness at geothermal surface manifestation zones are inversely proportional to the soil pH.

Keywords: Sentinel-1A, DEM, geothermal, surface roughness, pin-meter

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1. INTRODUCTION
Based on Hajnsek (2001), the methods for estimating surface roughness are developed since 50 years ago. The methods are divided into two main categories: two- and three-dimensional. The often-used method is two dimensions (Hajnsek, 2001). The two-dimensional method is formed mechanically by using needles on board. The height difference between needles presents surface profile. This tool is called pin-meter. In this paper, the surface roughness is defined as a variance of earth surface elevation above the horizontal line (Saepuloh et al., 2015). Surface roughness explains about fragments on the ground surface. Thus, the ground surface must be free from topographic effects. Therefore, this research was aimed to clarify that the pin-meter data is independent from topographic effect by utilizing a surface roughness model from Polarimetric Synthetic Aperture Radar (PolSAR) and Digital Elevation Model (DEM) data.

SAR technology with long wavelength is superior to detect target at surface and near surface regardless atmospheric condition such as cloud and water vapor. SAR satellite transmits microwave energy and receives the backscattering signals. The backscattering signals are controlled by surface roughness, dielectric permittivity, and magnetic permeability of ground surface. The primary factor influenced backscattering is surface roughness which is related to rock types (Saepuloh et al. 2016). The PolSAR image used in this paper is Sentinel-1A in C-band frequency equivalent to wavelength 5.6 cm. In addition, the Shuttle Radar Topography Mission (SRTM) 30 m DEM was also used for generating surface roughness model related to topographic undulation. The measured soil pH data at 41 locations were used to identify the geothermal surface manifestation. The low pH about 1-4 was assumed to correlate with hydrothermal fluids.

2. DATA AND METHODOLOGY
2.1 Data
The study area was located at Mts. Wayang-Windu and Patuha, West Java, Indonesia and presented by Figure 1. There are four data used in this study: surface roughness at field obtained by a pin-meter, Sentinel-1A SAR, SRTM DEM 30 m, and soil pH data. The pin-meter size was 30 cm width containing 60 pins. The 269 points were measured at the field by the pin-meter with three directions: N-S, W-E, and topographic slope (N-E). The detrending and interleaving techniques were applied to obtain accurate surface roughness (Saepuloh et al., 2016). Sentinel-1A SAR image used in this study is in Ground Range Detected (GRD) level with interferometric wide swath acquisition type. It was acquired at 2nd February 2016 on descending orbit with the incidence angle between 29.1° and 46.0° in near and far range, respectively. The DEM SRTM 30 m was also used for generating surface roughness model related to topographic undulation. The measured soil pH data at 41 locations were used to identify the geothermal surface manifestation. The low pH about 1-4 was assumed to correlate with hydrothermal fluids.

2.2 Methodology
2.2.1 Surface Roughness Quantification
Quantifying surface roughness is conducted by measuring height different among pins. The quantified surface roughness is root mean square (RMS) of heights. Detrending and interleaving are applied to result in the pin-meter reading. According to Saepuloh et al. (2016), the RMS height $H_0$ was calculated for the three directions as follows:

$$H_0(\zeta) = \sqrt{\frac{1}{n} \sum_{i=1}^{n} \left( z(x_i) - \bar{z} \right)^2}$$  \hspace{1cm} (1)

Where $n$ is count of pins (=60), $z(x_i)$ is the height of the surface at the point $x_i$, $\bar{z}$ is the mean height of the surface within the profile, and $\zeta$ is the pin-meter direction (N-S, E-W, and N-E). For achieving more accurate RMS height, we combined all RMS values and termed as RMS height total $H_{0t}$ as follows:
Figure 1. Location of study area at Mt. Wayang-Windu and Patuha overlaid on Sentinel-1A image with VV polarization.

$$H_0 = \sqrt{\frac{1}{k} \sum_{j=1}^{k} (H_{0j})^2}$$  \hspace{1cm} (2)

Where $k$ is number of measurement direction ($k=3$), $H_{0j}$ is RMS height of measurement direction $j$th.

2.2.2 Surface Roughness Model by Sentinel-1A

Sentinel-1A level GRD has two types of polarisation (VH and VV). Each of type was extracted to obtain the backscattering coefficient. An open source software Sentinel Application Platform (SNAP) was used to calibrate, correct, and transform the Single Look Complex (SLC) to Multi Look Image (MLI) of Sentinel-1A SAR data from European Space Agency (ESA). There are four steps to obtain backscattering intensity image from MLI: range Doppler terrain correction, speckle filtering, thermal noise removal, and radiometric calibration. The range Doppler terrain correction was used for correcting the geometry of topographical distortion, speckle filtering for reducing speckle noises, and thermal noise removal for correcting distortion effect from thermal especially for low scatter region like the sea and lake. The radiometric calibration was used for correcting and extracting backscattering coefficient as follows (Miranda and Meadows, 2015):

$$\sigma_0^{db} = 10 \log_{10} (\frac{DN^2}{A_\sigma})$$  \hspace{1cm} (3)

Where $\sigma_0^{db}$ is backscattering coefficient, $DN$ is digital number, and $A_\sigma$ is look up table to transform radar reflectance to backscattering. An initial model served as an estimation of surface roughness was calculated for each polarised type as follows (Saepuloh et al., 2015):
\[ h_0(\eta \zeta) = \lambda \left( \frac{1}{60} \ln \left( 1 - \frac{10^{(0.1x \sigma^0 \eta \zeta)}}{0.04 \cos \theta_i} \right) \right) \]  

(4)

where \( h_0 \) is an initial model of surface roughness, \( \eta \zeta \) is polarized type either in H and V, \( \lambda \) is wavelength (=5.6 cm), \( \sigma^0 \eta \zeta \) is backscattering coefficient based on polarized type, and \( \theta_i \) is local incidence angle. We use linear fitting method to obtain correlation determination \( R^2 \) between surface roughness from model and pin-meter. We tried to generate others model which able to reach high \( R^2 \) value using combination of VV, VH, and \( \theta_i \).

2.2.3 Surface Roughness Model by DEM

The SRTM DEM 30 m is a potential source to calculate the surface roughness model related to topographic undulation. The model was calculated using various window sizes. There were ten window sizes from 3×3 to 21×21 pixels. The illustration of this process was presented by Figure 2. The surface roughness model from SRTM DEM 30 m was calculated as follows:

\[ H_0_{DEM} = \sqrt{\frac{1}{n} \sum_{i=1}^{n} (z(x_i) - \bar{z})^2} \]  

(5)

where \( H_0_{DEM} \) is surface roughness model related to topographic undulation, \( n \) is window size, \( z(x_i) \) is value of \( i^{th} \) pixel, and \( \bar{z} \) is mean of all pixel value in the window. Linear fitting method was used to obtain \( R^2 \) between \( H_0_{DEM} \) and \( H_0 \). Table 3 and Figure 4 show the \( R^2 \) between \( H_0_{DEM} \) and \( H_0 \).

2.2.4 Identification of Geothermal Surface Manifestation

The surface roughness model from Sentinel-1A and DEM were used to obtain the optimum model presented by spatial agreement with ground pH. Based on the model, the geothermal manifestation was identified by location and pattern of scatter plot. PH and surface roughness model are plotted to identify the spatial distribution of geothermal manifestation.

**Table 1.** The high \( R^2 \) of surface roughness model based on Sentinel-1A data.

<table>
<thead>
<tr>
<th>Model</th>
<th>N-S</th>
<th>W-E</th>
<th>N to E</th>
<th>RMS Total</th>
</tr>
</thead>
<tbody>
<tr>
<td>model initial VV</td>
<td>0.0023</td>
<td>0.0157</td>
<td>0.0253</td>
<td>0.0141</td>
</tr>
<tr>
<td>Model initial VH</td>
<td>0.0010</td>
<td>0.0091</td>
<td>0.0016</td>
<td>0.0075</td>
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<tr>
<td>Model M6</td>
<td>0.0036</td>
<td>0.0163</td>
<td>0.0035</td>
<td>0.0150</td>
</tr>
<tr>
<td>Model M1</td>
<td>0.0291</td>
<td>0.0745</td>
<td>0.0148</td>
<td>0.0710</td>
</tr>
<tr>
<td>Model M4</td>
<td>0.0458</td>
<td>0.0764</td>
<td>0.0308</td>
<td>0.0796</td>
</tr>
<tr>
<td>Model M5</td>
<td>0.0521</td>
<td>0.1130</td>
<td>0.0238</td>
<td>0.1110</td>
</tr>
</tbody>
</table>

**Table 2.** Mathematical model of surface roughness with high \( R^2 \) based on Sentinel-1A data.
\[ M6 \] \[ h_{v^v} \times h_{v^h} \]

\[ M1 \] \[ 10 \ (h_{v^v}h_{v^h})^2 \times \tan(\theta_i) \]

\[ M4 \] \[ (h_{v^v}h_{v^h})^{3/2} \times \tan((\theta_i)^3) \]

\[ M5 \] \[ (h_{v^v}h_{v^h})^{5/2} \times \tan((\theta_i)^3) \times \log(\theta_i) \times 1000 \]

**Figure 3.** The influence of measurement direction to the surface roughness model related to topographic undulation showed that W-E measurement is the highest \( R^2 \) value almost for all models.

**Figure 4.** The effect of window size to surface roughness from pin-meter showed variation of \( R^2 \).

**Table 3.** The variation of \( R^2 \) for different window size between surface roughness derived
by DEM SRTM 30 m and pin-meter.

<table>
<thead>
<tr>
<th></th>
<th>3x3</th>
<th>5x5</th>
<th>7x7</th>
<th>9x9</th>
<th>11x11</th>
<th>13x13</th>
<th>15x15</th>
<th>17x17</th>
<th>19x19</th>
<th>21x21</th>
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<tbody>
<tr>
<td>N-S</td>
<td>0.044</td>
<td>0.048</td>
<td>0.048</td>
<td>0.045</td>
<td>0.043</td>
<td>0.041</td>
<td>0.041</td>
<td>0.043</td>
<td>0.044</td>
<td>0.044</td>
</tr>
<tr>
<td>W-E</td>
<td>0.033</td>
<td>0.035</td>
<td>0.028</td>
<td>0.026</td>
<td>0.025</td>
<td>0.025</td>
<td>0.029</td>
<td>0.035</td>
<td>0.037</td>
<td>0.037</td>
</tr>
<tr>
<td>N to E</td>
<td>0.044</td>
<td>0.046</td>
<td>0.049</td>
<td>0.056</td>
<td>0.059</td>
<td>0.058</td>
<td>0.058</td>
<td>0.059</td>
<td>\textbf{0.060}</td>
<td>0.059</td>
</tr>
<tr>
<td>RMS</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Total</td>
<td>0.042</td>
<td>0.047</td>
<td>0.040</td>
<td>0.038</td>
<td>0.037</td>
<td>0.038</td>
<td>0.042</td>
<td>0.048</td>
<td>0.050</td>
<td>0.050</td>
</tr>
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</table>

3. RESULTS
3.1. Surface Roughness Model
Table 1 shows the highest $R^2$ (=0.113) generated using M5 model from Sentinel-1A image which is used to generate surface roughness by SAR. The calculated mathematical models of surface roughness are listed in Table 2. The Figure 3 illustrates the trend of $R^2$ for each model. The Table 3 and Figure 4 shows the $R^2$ result of for surface roughness model from DEM SRTM 30 m. The $R^2$ of surface roughness model from Sentinel-1A (=0.113) is higher than DEM SRTM 30 m (= 0.060). Therefore, the M5 model was predicted as the optimum model to identify the geothermal surface manifestations. Figure 5 shows the roughness model on geothermal manifestations and the surrounding area based on M5 model.

3.2. Geothermal Surface Manifestation
Scatter-plot identification of geothermal surface manifestations at Mts. Wayang-Windu and Patuha based on surface roughness model is depicted in Figure 6. Figure 6a shows a correlation for all data that pH at geothermal manifestation inversely proportional to the surface roughness model generally. Figure 6b shows correlation based on location at Mts. Wayang-Windu and Patuha. There are two classes in this figure presented by Figure 6b. Figure 6c shows the correlation based on the pattern of scatter plot data which produces three groups while the Figure 7 presents its model spatially. Among these groups, two of them are directly proportional between pH and M5 and the last one is inversely proportional. These identifications were presented by similarity between the selected model and pH relating to some parameter (location and pH).

4. CONCLUSION
The surface roughness derived by pin-meter after detrending and interleaving processes could reduce influence of topographic undulation effect. It was confirmed by correlation determination $R^2$ that surface roughness model derived by Sentinel-1A is higher than DEM SRTM 30 m. The optimum Sentinel-1A surface roughness model was obtained by the incorporating VV and VH polarization type and local incidence angle. The local incidence angle contributed significantly to improving the correlation. According to the obtained model, we observed that surface roughness at geothermal surface manifestation is inversely proportional to the soil pH. Further study is necessary to separate surface roughness mode to classify geothermal surface manifestation type.
Figure 5. M5 surface roughness model derived by Sentinel-1A data and location of field measurements using pin-meter (a), spatial distribution of geothermal surface manifestation including mud pools (b), altered surfaces (c), hot springs (d).
Figure 6. Scatter plot classification of all collected field data (a), location (b), and pattern (c).
Figure 7. Classification map of surface roughness based on correlation pattern in Figure 6C for class 1 (a), class 2 (b), and class 3 (c).

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