

# JAXA Research and Development Memorandum

Path Planning for Rovers on the Moon Based on Shadow Estimation

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July 2017

Japan Aerospace Exploration Agency

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## Path Planning for Rovers on the Moon Based on Shadow Estimation

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#### ABSTRACT

In future lunar exploration, mobile robots (i.e., rovers) are required to travel long distances; thus, these rovers will experience severe power limitations. In such exploration missions, the power limitation on the Moon, i.e., the balance between consumed power and that generated by the rover, should be taken into account for motion/path planning. Power generated by solar panels is a possible resource, which is determined depending on the condition of shadows. From this possibility, this study evaluates the influence of these shadows on path planning for lunar rovers by using a proposed path planning method, in which the power limitation is introduced as a new evaluation index. For this evaluation, we developed a path-planning simulator based on a method using digital elevation models (DEMs) derived from Kaguya data. In the simulation, the terrain inclination and shadow on the Moon are estimated by using the DEMs. Using this simulation, path planning is conducted under various insolation (i.e., shadow) conditions corresponding to latitude, longitude, and time for a given terrain. The simulation results show that the power level can be increased in a planned path by considering the influence of the shadow. The effectiveness of the proposed path-planning method is quantitatively confirmed, particularly for an exploration mission conducted in the morning and evening at middle/high latitudes.

Keywords: Lunar rovers, Path-planning, Shadow

#### 1. Introduction

In future lunar and planetary explorations, with the expansion of the exploration area, mobile robots (i.e., rovers) are expected to travel long distances. However, rovers are required to travel efficiently during long-distance travel, but will experience severe power limitations. To this end, it is important to estimate and consider the power consumed and generated by the rover system during such exploration.

Power consumed by rover systems is determined depending on the rover's route; basically, the longer and bumpier the route, the higher the power consumption. Power generated by solar panels is considered as a possible power resource; however, this differs depending on the insolation (i.e., shadow) condition corresponding to the longitude, latitude, and time in a target region. To plan the path of the rover, a comprehensive evaluation index is required, which takes into account these factors regarding consumed and generated power.

Some studies have reported path/motion planning for rovers from the perspective of consumed and generated power. Regarding power consumption, Ishigami et al. conducted a path-planning simulation and evaluated planned paths based on power consumption<sup>2,3)</sup>. Our research group also conducted path-planning simulation for rovers having various locomotion mechanisms, and evaluated these paths based on power consumption<sup>9)</sup>. Regarding the generated power, Wettergreen et al.<sup>13)</sup> and Teti et al.<sup>10)</sup> presented the concept of a sun-synchronous lunar polar rover: the rover continuously remains in sunlight by traveling opposite to the planetary rotation and navigating with the Sun. Thus, the solar panels on the rover can always generate the necessary power. Tompkins et al. reported a mission planner based on the shadow and position of the Sun<sup>11)</sup>. In our previous study<sup>9)</sup>, our research group reported a path-planning simulation conducted under various insolation conditions and evaluated paths based on the amount of generated power. However, we did not extensively discuss the actual available power on the Moon or the balance between the consumed and generated power. Additionally, there are few studies focusing on those topics in terms of path planning.

As mentioned, power generated by solar panels can be determined, depending on the condition of shadows. That is, for discussion on the balance between consumed and generated power, the influence of shadows on path planning should be considered. Thus, in this study, we evaluate the influence of shadows by introducing the power limitation as a new evaluation index for path planning. For this evaluation, we developed a path-planning simulator using digital elevation models (DEMs) derived by using data obtained in a Japanese lunar orbiter mission, Kaguya (SELENE)<sup>5)</sup>. Using this simulation, path planning is conducted under various insolation (i.e., shadow) conditions corresponding to latitude, longitude, and time for a given terrain.

This paper is organized as follows. Section 2 describes the power limitations on the Moon from the viewpoint of rover systems. Section 3 explains a method for estimating the shadow on the Moon, along with the development of DEMs for the lunar terrain. Section 4 describes a path-planning method considering shadow estimation. Section 5 discusses path-planning simulations conducted under various insolation/shadow conditions. Finally, Section 6 concludes this work.

\* Received April 26, 2017

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**Fig. 1** Lunar rover being developed by our research group at Japan Aerospace Exploration Agency (JAXA).

#### 2. Rover power limitations on the Moon

In this section, available power resources are derived by considering on-board battery capacity, power generated by solar panels, and power consumed by the rover's subsystems.

#### 2.1. Power resources available

Storage batteries and power generated by solar panels are considered as possible power resources on the Moon. The power available for a rover,  $P_{ava}$ , changes depending on the power generated by the solar panels and that consumed by various electronic devices on the rover. Thus,  $P_{ava}$  is derived as

$$P_{ava.} = P_{bat.} + \int_0^t (P_G(t) - P_C(t))dt.$$
(1)

Here,  $P_{bat.}$  denotes the capacity of the battery (Wh) mounted on the rover;  $P_G$  and  $P_C$  denote the power generated by solar panels and that consumed by on-board electronic devices at time *t*, respectively.

Eq. (1) suggests that if  $P_G$  is smaller than  $P_C$ , the difference between  $P_G$  and  $P_C$  is deducted from  $P_{bat}$ . When  $P_{ava}$  becomes less than 0, the rover can no longer execute its mission.

#### 2.2. Amount of generated power

In the case that a solar panel is fixed on a rover horizontal to the flat ground, the power generated,  $P_G$ , by the solar panel is derived using the solar elevation angle relative to the solar panel,  $\alpha_s$ ', as

$$P_G = (1 - C_s) A \mu I_0 \sin \alpha'_s, \tag{2}$$

where A denotes the solar panel area;  $\mu$  denotes the power generation efficiency constant; and  $I_0$  denotes the solar constant.  $C_s$  is defined as 0 in a sunlit region and 1 in a shadowed region. Thus, Eq. (2) indicates that the solar panel can only generate power when it is in a sunlit region.

If the solar vector relative to the solar panel is defined

as 
$$S' = [x'y'z']^T$$
,  $\alpha_s$  is expressed as

$$\tan \alpha'_s = \frac{z}{\sqrt{x'^2 + y'^2}}.$$
(3)

If the solar vector, S, defines when the solar panel is horizontal to the flat ground, S' can be derived as

$$S' = R_z(\theta_z) R_y(\theta_y) R_x(\theta_x) S.$$
(4)

Here,  $\theta_x$ ,  $\theta_y$ , and  $\theta_z$  denote the rover's roll, pitch, and yaw angles, respectively;  $R_x$ ,  $R_y$ , and  $R_z$  denote the rotation matrices around the x-, y-, and z-axes, respectively:

$$R_x(\theta) = \begin{bmatrix} 1 & 0 & 0\\ 0 & \cos\theta & -\sin\theta\\ 0 & \sin\theta & \cos\theta \end{bmatrix},$$
 (5)

$$R_y(\theta) = \begin{bmatrix} \cos\theta & 0 & \sin\theta \\ 0 & 1 & 0 \\ -\sin\theta & 0 & \cos\theta \end{bmatrix},$$
 (6)

$$R_z(\theta) = \begin{bmatrix} \cos\theta & -\sin\theta & 0\\ \sin\theta & \cos\theta & 0\\ 0 & 0 & 1 \end{bmatrix}.$$
 (7)

Using the solar elevation angle,  $\alpha_s$ , and azimuth angle,  $\beta_s$ , the solar vector, *S*, is expressed as

$$S = \begin{bmatrix} \cos \alpha_s \cos \beta_s & \cos \alpha_s \sin \beta_s & \sin \alpha_s \end{bmatrix}^T.$$
 (8)

In general, by using Eqs. (2)-(8), the amount of generated power is calculated from the shadow condition, solar angles, and terrain inclination.

By controlling a solar panel to be directed vertically to the sunlight, the generated power can be maximized for a given latitude and time. This control is equivalent to  $\alpha_s$ = 90° in Eq. (8). In this study, we assumed that this control strategy is utilized and that the generated power is constant, regardless of the latitude and time. That is, the generated power is considered as a function of shadow condition and terrain inclination.

#### 2.3. Amount of consumed power

The rover system consists of various subsystems, such as spacecraft-bus and mobility systems, as listed in Table 1. In the table, the power consumption of each subsystem is defined as an average value throughout an exploration mission. The table indicates that the characteristics of power consumption differ depending on the subsystems.

In this study, we divide the power consumption,  $P_C$ , of the rover into two groups: one determined from the mobility system,  $P_{CMov}$ , and the other determined from the other subsystems,  $P_{Cothers}$ . Thus,  $P_C$  is expressed as

$$P_C = P_{C_{Mov.}} + P_{C_{others}}.$$
(9)

For the subsystem configuration listed in Table 1,  $P_{Cothers}$  is derived as 70 W<sup>7</sup>.



**Fig. 2** Lunar coordinate system  $(\psi, \phi, z)$  and rover coordinate system (X, Y, Z).

The power consumed by the mobility system,  $P_{CMov}$ , changes depending on maneuvers along a traveling path.  $P_{CMov}$  is derived from the power required for driving and steering maneuvers as

$$P_{C_{Mov.}} = V_{in_d} I_d + V_{in_s} I_s, \tag{10}$$

where  $V_{in}$  and I denote the input voltage and current to the driving/steering motor, respectively. For a mobility system with constant input voltage,  $I_d$  and  $I_s$  are derived by using the climbing slope angle,  $\theta_y$ , and steering angle,  $\theta_s$ , as

$$I_d = A\theta_y + B, \quad I_s = C\theta_s + D. \tag{11}$$

Here, A, B, C, and D are constants determined from the motion behavior of the rover on a given terrain <sup>9)</sup>. Using Eqs. (10)-(11), the power consumed by the mobility system is calculated from the climbing slope and steering angles in a given terrain.

#### 3. Shadow estimation on lunar surface

As mentioned above, data for the shadow on a given terrain are required to derive the power limitations of the rover. In this section, we first develop DEMs of the lunar terrain by using data obtained in the SELENE project. Subsequently, an estimation method for the shadows on the Moon is explained in detail, along with the solar elevation and azimuth angles.

#### 3.1. Digital elevation model of lunar terrain

We develop DEMs of lunar terrain by using data obtained from Lunar Imager/SpectroMeter (LISM) mounted on the Japanese lunar orbiter SELENE. These

 Table 1 Rover subsystem and power consumption breakdown.

Subsystem	Power consumption [W]
Spacecraft-bus systems	45
Navigation and control system	10
Mobility system	$P_{C_{Mov}}$
Mission equipment	15
Total $(P_C)$	$P_{C_{Mov.}} + 70$

data can be downloaded from the Kaguya data archive <sup>4</sup>) as a file containing  $4096 \times 4096$  elevation data for almost all areas of latitude 1° by longitude 1° on the Moon. In the file, the elevation data are obtained in intervals of 7.403 m in latitude.

Using the data from this file, to convert the 4096 × 4096 data set of elevation z[n] for a given lunar coordinate system ( $\psi_m$ ,  $\phi_m$ ) into those for the rover coordinate system (*X*, *Y*, *Z*), we used the following relationship (see Fig. 2):

$$X = 7.403 \times i,$$
  

$$Y = 7.403 \cos \phi_m \times j,$$
  

$$Z = z[i \times 4096 + j].$$
  

$$(i, j) = 0, 1, \dots, 4096)$$
  
(12)

Using Eq. (12), the DEM can be developed around any point on the Moon.

On the basis of this method, we developed three types of DEMs for the lunar terrains, as shown in Fig. 3. The DEMs were developed by using randomly selected data set in low-latitude (0°S, 0°W), middle-latitude (40°S, 0°W), and high-latitude regions (80°S, 0°W), respectively. In the figure, the color represents the differences in the elevation; the elevation increases as the color changes from purple to red. From the changes in color, it is found that the elevation is obtained at high resolution for given areas on the Moon.

#### 3.2. Estimation of shadowed region

For a given terrain, the length and direction of a shadow can be estimated by considering the solar elevation and azimuth angles: the length of a shadow cast by a landform is expressed by using the elevation of the landform, *z*, and solar elevation angle,  $\alpha_s$ , as  $z/tan \alpha_s$ . Meanwhile, the direction of the shadow is opposite to the solar azimuth angle,  $\beta_s$ .

According to the above, a shadow cast by a landform, which is located at point  $(x_p, y_p)$  and has an elevation of  $z(x_p, y_p)$ , is derived as

$$y - y_p = \tan \beta_s (x - x_p),$$
  

$$x_p \le x \le x_p + R \cos \beta_s.$$
(13)

Here, R is the minimum value that satisfies the following relationship:

$$R = \frac{z(x_p, y_p) - z(R\cos\beta_s, R\sin\beta_s)}{\tan\alpha_s}.$$
 (14)

Considering Eqs. (13) and (14) over an entire DEM, the shadow is estimated for a given area on the Moon.

# 3.3. Solar elevation and azimuth angles on the Moon

The solar elevation angle,  $\alpha_s$ , and azimuth angle,  $\beta_s$ , are expressed by using the latitude,  $\phi$ , and longitude,  $\psi$ , on the Moon as



**Fig. 3** Digital elevation models (DEMs) of various lunar terrains obtained from SELENE data: terrains A, B, and C are derived by using data from low-latitude (0°S, 0°W), middle-latitude (40°S, 0°W), and high-latitude regions (80°S, 0°W), respectively.



**Fig. 4** Solar azimuth and elevation angles over a cycle of 29.5 days in various latitude regions: low latitude (0°S, 0°W), middle latitude (40°S, 0°W), and high latitude (80°S, 0°W).

$$\sin \alpha_s = \sin \delta \sin \phi + \cos \delta \cos \phi \cos(\gamma - \psi),$$
$$\tan \beta_s = \frac{\cos \delta \sin(\gamma - \psi)}{-\sin \delta \cos \phi + \cos \delta \sin \phi \cos(\gamma - \psi)}. (15)$$

Here,  $\delta$  and  $\gamma$  denote the latitude and longitude, respectively, on the surface of the Moon where the Sun is directly overhead.  $\delta$  takes a value between -1.5° and 1.5° because the Moon's rotational axis is almost vertical to the plane containing the Sun. On the other hand,  $\gamma$  changes approximately 12.2° every day. That is, on the Moon, the solar angles roughly change over a cycle of 29.5 days.  $\delta$  and  $\gamma$  are accurately calculated based on the relative positions of the Sun, Earth, and Moon and the axial tilt of the Moon for a given date <sup>1,8</sup>.

Using Eq. (15), we derived the solar elevation and azimuth angles over a cycle of 29.5 days in various latitude regions, as shown in Fig. 4: low (0°S, 0°W), middle (40°S, 0°W), and high-latitude regions (80°S, 0°W). The figure shows that the elevation angle dramatically changed and the culmination altitude was

high in the low-latitude region. On the other hand, in the high-latitude region, the elevation angle changed slightly and the culmination altitude was low. This means that even in the same exploration time/period, the shadow condition differs depending on exploration regions.

Fig. 5 shows the shadow cast over terrain B, shown in Fig. 3 (b), at different times. The figure shows that the shadow shape changed depending on the time. According to the figure, while the shadow is long in the morning/evening, it disappears during the day. This is because the solar elevation angle is low in the morning/evening and high during the day.

#### 4. Path-planning method considering shadow

#### estimation

On the basis of the shadow estimation presented in the previous section, we propose a path-planning method for rovers considering the estimation of shadows. In this section, the path-planning algorithm and cost functions are described in detail.

#### 4.1. Path-planning overview

A grid-based path-planning algorithm was adopted to confirm the effectiveness of our proposed method. In this algorithm, the target environment is first divided into an equally spaced grid, and each intersection of the grid lines is labeled as a node. We assumed that a rover can move in eight directions between adjacent nodes (see Fig. 6). In path planning, the start and goal nodes are first identified, and a rover's path is defined by the lines connecting the nodes from the start to goal nodes.

A cost, which is the value for a rover to move from one node to another, is assigned to all edges connecting each pair of nodes. The optimum path for the rover is calculated by minimizing the summation of the cost (i.e., total cost) for the rover to move from the start node to the goal node.

Dijkstra's algorithm is used to derive the path with the minimum total cost. Many algorithms have been proposed to solve grid-based path planning <sup>6)</sup>, and the path-planning method in this study is applicable not only to Dijkstra's algorithm but also to other algorithms.



**Fig. 5** Shadow on the surface of the Moon, on terrain B, under different times (i.e., insolation conditions). (a), (b), and (c) represent the shadow in the morning, daytime, and evening on the Moon, respectively. The figures show the change of the shadow occurring over a cycle of 14 days on the Moon.



**Fig. 6** Node  $n_i$  and its adjacent nodes,  $n_j$ ; nodes are defined as the intersections of grid lines. Edges are defined as pairs of nodes <sup>9</sup>.

#### 4.2. Cost function

In path planning, the derived path can differ depending on the way the measure of the cost is defined. Thus, the definition of the cost is key to the path-planning method. We derive the cost,  $c(n_{ij})$ , for an edge between node  $n_i$  and adjacent node  $n_i$ :

$$c(n_{ij}) = W_{dist}C_{dist} + W_{slope}C_{slope} + W_{shadow}C_{shadow},$$
(16)

where  $C_{dist}$ ,  $C_{slope}$ , and  $C_{shadow}$  denote the costs depending on the distance, terrain inclination, and shadow, respectively;  $W_{dist}$ ,  $W_{slope}$ , and  $W_{shadow}$ , are the weighting factors corresponding to each cost, which are set so that  $W_{dist} + W_{slope} + W_{shadow} = 1$ .

Using Eq. (16), the total cost, C(path), for a path is expressed as

$$C(path) = \sum_{path} c(n_{ij}). \tag{17}$$

From Eqs. (16) and (17), a decrease in individual cost reduces the total cost. In other words, a path that minimizes Eq. (17) is the optimum path for a rover in

terms of the traveling distance, terrain inclination, and shadow.

#### 4.3. Cost function index

In this subsection, each index in the cost function (i.e., distance cost,  $C_{dist}$ ; terrain inclination cost,  $C_{slope}$ ; and shadow cost,  $C_{shadow}$ ) is explained in detail.

#### 4.3.1. C<sub>dist</sub>: distance cost

If a rover travels a long distance, the necessary power consumption will simply increase. From the viewpoint of energy, the distance along a rover's traveling path should be as short as possible. Thus, we adopted distance as one element to determine the rover's traveling path.

The distance cost,  $C_{dist}$ , for each edge is defined as follows:

$$C_{dist}(n_{ij}) = \frac{D_{ij}}{D_{max}}, \qquad (18)$$

where  $D_{ij}$  denotes the distance between adjacent nodes and  $D_{max}$  denotes the maximum  $D_{ij}$  for all of the edges.  $D_{ij}$  is derived as follows:

$$D_{ij} = \sqrt{(x_j - x_i)^2 + (y_j - y_i)^2 + (z_j - z_i)^2},$$
(19)

where  $(x_i, y_i, z_i)$  and  $(x_j, y_j, z_j)$  are the three-dimensional positions of  $n_i$  and  $n_j$ , respectively.

#### **4.3.2.** *C*<sub>slope</sub>: terrain inclination cost

When a rover traverses/climbs over steep slopes, the wheels of the rover slip and power consumption increases. To decrease the power consumption, the rover should avoid steep crater rims and ridges, and travel along paths with gentle terrain. Thus, terrain inclination (i.e., slope) is considered as another element determining the rover's traveling path.

The terrain inclination cost,  $C_{slope}$ , for each edge is defined as follows:

$$C_{slope}(n_{ij}) = \frac{1}{2} \left[ \frac{\theta_{x_{ij}}}{\theta_{x_{max}}} + \frac{\theta_{y_{ij}}}{\theta_{y_{max}}} \right], \tag{20}$$

where  $\theta_{xij}$  and  $\theta_{yij}$  denote the terrain inclination angles in the rover's lateral and longitudinal directions (i.e., the rover's roll and pitch angles), respectively;  $\theta_{xmax}$  and  $\theta_{ymax}$  denote the maximum  $\theta_{xij}$  and  $\theta_{yij}$  for all edges in a given DEM.  $\theta_{xij}$  and  $\theta_{yij}$  are calculated by using the three-dimensional information of the DEM.

In the case that a solar panel is fixed on a rover to be directed vertically to the sunlight over flat terrain, which is assumed in this study, the terrain inclination along a path should be as gentle as possible in terms of an increase in the generated power. In this context,  $C_{slope}$  is an element related not only to the consumed power but also to the generated power.

#### 4.3.3. C<sub>shadow</sub>: shadow cost

Although the inclination of a solar panel is one factor determining the power generated, as mentioned previously, the solar panel must be sunlit to behave as a power supply. In other words, to generate power, the rover is required to avoid shadowed areas and allow the Sun to light the solar panel. Thus, the shadow is considered as the other element determining the rover's traveling path.

The shadow cost,  $C_{shadow}$ , for each edge is defined as follows:

$$C_{shadow}(n_{ij}) = \begin{cases} 0 & \text{(if } SP \text{ is sunlit on } n_j\text{)}, \\ 1 & \text{(if } SP \text{ is shadowed on } n_j\text{)}. \end{cases}$$
(21)

Here, *SP* stands for solar panel. We determine whether the solar panel is sunlit/shadowed on  $n_j$  on the basis of shadow estimation by using the three-dimensional information and the solar angles in the target environment, as explained in the previous section. The solar panels on the rover are usually elevated off the surface and will not be in shadow from low terrain.

In Eq. (21), defining  $C_{shadow}$  as 0 or 1 permits a rover to travel over shadow. This is acceptable because the rover can use the power of on-board batteries in the shadow and is not always required to travel by generating power. If  $C_{shadow}$  were defined as 0 or  $\infty$ depending on the condition of the shadow, which is a popular definition method used in various path-planning algorithms <sup>6)</sup>, the proposed path-planning method would always let a rover avoid the shadowed area. In this case, however, a path may not be derived in a region mostly covered with shadows (e.g., high-latitude regions on the Moon where the sunlight comes from a nearly horizontal direction, as shown in Fig. 4).

#### 5. Path-planning simulation

On the basis of the above path-planning method, we developed a path-planning simulator for lunar rovers. In this simulator, the power limitation is considered as an evaluation index. In this section, we first derive the power level as an evaluation index, then explain the simulation condition and results in detail.

#### **5.1. Evaluation index**

From the viewpoint of power limitations on the Moon,

the power level,  $P_{ava.}$ , over a path is defined as an evaluation index for path planning. After a rover traveled over a *path*, the remaining  $P_{ava.}$  is expressed as

$$P_{ava.} = P_{bat.} + \sum_{path} (P_{G_{ij}} - P_{C_{ij}}) t_{ij}, \qquad (22)$$

where  $P_{Gij}$  and  $P_{Cij}$  denote the power generation and consumption between adjacent nodes, respectively, and are calculated by using Eq. (2) and (9), respectively.  $t_{ij}$  denotes the time required to travel the distance between adjacent nodes and is derived by using the slip ratio, *s*, and slip angle,  $\beta$ :

$$t_{ij} = \frac{D_{ij}}{v \cos \beta_{ij} (1 - s_{ij})}, \qquad (23)$$

where v denotes the input linear speed of the rover. Here, s and  $\beta$  are estimated based on the terrain inclination angles (i.e.,  $\theta_x$  and  $\theta_y$ ), as previously reported <sup>9,12</sup>).

#### 5.2. Simulation conditions

Path-planning simulations were conducted on three types of DEMs shown in Fig. 3 under different insolation conditions. In the simulations, three different times were used: morning, daytime, and evening. The weighting factors in Eq. (16) were set to  $W_{dist} = 0.8$ ,  $W_{slope} = 0.1$ , and  $W_{shadow} = 0.1$  for path A and to  $W_{dist} = 0.1$ ,  $W_{slope} = 0.1$ , and  $W_{shadow} = 0.8$  for path B. The input speed of the rover and voltage were set to 1.4 cm/s and 10 V, respectively.

For the power conditions in the simulation, the rover is equipped with four batteries of 120 Wh/kg capacity and a solar panel having an area of 800 mm × 500 mm. The battery capacity was assumed based on the energy density of a general space-hardened rechargeable battery. We assumed that the inclination of the solar panel is actively controlled so that the generated power is constant, regardless of latitude and time. The power generation efficiency constant,  $\mu$ , and solar constant,  $I_0$ , were set to 0.15 and 1368 W/m<sup>2</sup>, respectively, corresponding to the conditions on the Moon <sup>13)</sup>. The characteristics of the rover power consumption are listed in Table 1.

#### 5.3. Simulation results and discussion

Fig. 7 shows the path-planning simulation results on terrain B under the insolation condition of evening. In the simulation, the nodes at opposite vertices in the DEM were established as the start and goal nodes. The figure shows that the derived paths differ depending on the weighted factor: the rover travels over a straight line connecting the start and goal nodes along path A. On the other hand, path B is a winding route that avoids the shadow inside the crater.



Fig. 7 Simulated paths for rover on terrain B under the insolation condition of the evening; the blue and red lines represent path A ( $W_{dist} = 0.8$ ,  $W_{slope} = 0.1$ ,  $W_{shadow} = 0.1$ ) and path B ( $W_{dist} = 0.1$ ,  $W_{slope} = 0.1$ ,  $W_{shadow} = 0.8$ ), respectively.

For each path shown in Fig. 7, histories of the power consumed, power generated, and power level were obtained along with time, as shown in Fig. 8. Fig. 8 (a) shows that there is a slight difference in the power consumed by the rover on each path. This suggests that the power consumed by the mobility system ( $Pc_{Mov}$ ) was almost the same along each path. In Fig. 8 (b), although the rover generates power almost all the way along path B, it cannot generate power at all from 8 h to 14 h, when the rover travels in shadow along path A. As a result, although the power level remains high along path B, it gradually decreases to 82 Wh at the end along path A (see Fig. 8 (c)).

From the simulation conducted on terrain B under different insolation conditions, the traveling time, average power consumption, and average power generation were derived, as shown in Fig. 9. According to Fig. 9 (a), traveling time was longer along path B than path A. This is because the rover avoids the shadow and travels a longer distance along path B. In Figs. 9 (b) and (c), although there is a slight difference in the average power consumption on each path in all cases, the average power generated along path B is greater than that along path A, particularly in the morning and evening; along path A, the large difference between the average consumed and generated power is deducted from the power level. From the viewpoint of power, path B was more energy efficient than path A.

By conducting the simulation on the three types of DEMs shown in Fig. 3 under different insolation conditions, the power levels of the rover were obtained, as shown in Fig. 10. According to Fig. 10 (a), for all times, there is a slight difference in the value of power level along each path in the low-latitude region. This is because the solar elevation is high and the shadowed area is small in this region. Meanwhile, in the middleand high-latitude regions where solar elevation is low and the shadowed area is large, the power level along path B is larger than that along path A, particularly in the morning and evening. It is noteworthy that along path A, the power level reaches less than 0 on terrain C in the evening; that is, the rover completely stopped moving along this path. This simulation study quantitatively suggested that the proposed path planning method is effective, particularly for an exploration mission conducted in the morning and evening at middle/high latitudes.

In our path-planning method, the cost function derives different paths depending on the weighting factors in Eq. (16). In this study, to clearly present the influence of the shadow on path planning, we compared the simulation results by using two combinations of weighting factors  $(W_{dist}, W_{slope}, W_{shadow})$ : path A with (0.8, 0.1, 0.1) and path B with (0.1, 0.1, 0.8). We discovered that if the terrain inclination is weighted  $(W_{dist}, W_{slope}, W_{shadow}) = (0.1, 0.8, 0.1)$ , the path is derived as similar to that weighted in the shadow, although the former path is not as energy efficient as the latter. During an exploration mission, weights for path planning should be determined on a case-by-case basis. An effective method for determining the weights of various situations in the mission may be an interesting topic for future study.

#### 6. Conclusion

The influence of shadows on path planning was evaluated for lunar rovers by introducing the power limitation on the Moon as an evaluation index. For this evaluation, a simulation was conducted that considers traveling distance, terrain inclination, and shadow as cost indices for path planning. In the simulation, the shadow on the lunar terrain was estimated by using DEMs obtained from SELENE data. The simulation results show that the power level can be increased in a planned path by considering the influence of the shadow. The effectiveness of the proposed path-planning method was quantitatively confirmed, particularly for an exploration mission conducted in the morning and evening at middle/high latitudes.



**Fig. 8** Histories of power consumption, power generation, and power level along with time on terrain B under the insolation condition of evening: path A ( $W_{dist} = 0.8$ ,  $W_{slope} = 0.1$ ,  $W_{shadow} = 0.1$ ) and path B ( $W_{dist} = 0.1$ ,  $W_{slope} = 0.1$ ,  $W_{shadow} = 0.8$ ).



Fig. 9 Traveling time, average power consumption, and average power generation on terrain B under various insolation conditions.



**Fig. 10** Power level remaining on various terrains under different insolation conditions. Terrains A, B, and C are derived by using data in low- (0°S, 0°W), middle- (40°S, 0°W), and high-latitude regions (80°S, 0°W), respectively.

During the simulation case study, the amount of consumed and generated power were tentatively assumed rather than derived from detailed specifications of a rover. In the future, after defining these factors from actual mission requirements, the path-planning method proposed in this study can be used as an effective tool to optimize the mission and/or to determine whether a planned exploration mission is realistic.

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## JAXA Research and Development Memorandum JAXA-RM-17-001E

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Edited and Published by:	Japan Aerospace Exploration Agency					
	7-44-1 Jindaiji-higashimachi, Chofu-shi, Tokyo 182-8522 Japan					
	URL: http://www.jaxa.jp/					
Date of Issue:	July 28, 2017					
Produced by:	Matsueda Printing Inc.					
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