# GOST: A Geometric-Optical Model for Sloping Terrains 

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#### Abstract

GOST is a geometric-optical (GO) model for sloping terrains developed in this study based on the four-scale GO model, which simulates the bidirectional reflectance distribution function (BRDF) of forest canopies on flat surfaces. The four-scale GO model considers four scales of canopy architecture: tree groups, tree crowns, branches, and shoots. In order to make this model suitable for sloping terrains, the mathematical description for the projection of tree crowns on the ground has been modified to consider the fact that trees grow vertically rather than perpendicularly to sloping grounds. The simulated canopy gap fraction and the area ratios of the four scene components (sunlit foliage, sunlit background, shaded foliage, and shaded background) by GOST compare well with those simulated by 3-D virtual canopy computer modeling techniques for a hypothetical forest. GOST simulations show that the differences in area ratios of the four scene components between flat and sloping terrains can reach up to $50 \%-60 \%$ in the principal plane and about $\mathbf{3 0 \%}$ in the perpendicular plane. Two case studies are conducted to compare modeled canopy reflectance with observations. One comparison is made against Landsat- 5 Thematic Mapper (TM) reflectance, demonstrating the ability of GOST to model canopy reflectance variations with slope and aspect of the terrain. Another comparison is made against MODIS surface reflectance, showing that GOST with topographic consideration outperforms that without topographic consideration. These comparisons confirm the ability of GOST to model canopy reflectance on sloping terrains over a large range of view angles.


Index Terms-Canopy structure, geometric-optical (GO) modeling, radiative transfer, remote sensing, sloping terrains.

## NOMENCLATURE

| $A$ | Vertical projected area of a quadrat. |
| :--- | :--- |
| $B$ | Vertical projected domain area. |
| $D$ | Number of trees in domain $B$. |
| $G(\theta)$ | Projection of unit leaf areas. |
| $H$ | Effective height. |

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$h$
H
$H_{b}$
$H_{c}$
$L$
$L_{o}$

$L_{t}$

$m$
$m_{1}$
$m_{2}$
$n$
$N_{t}(\lambda)$
$P_{G}$
$P_{\text {gap }}(\theta)$
$P_{i g}$
$P_{v g}$
$P_{v g \_r}$
$P_{v g_{-} c}$
$P_{T}$
$P(x)$
$P_{N}\left(i ; m_{1} ; m_{2}\right)$
$r$
R
$R_{G}$
$R_{T}$
$R_{Z G}$
$R_{Z T}$
$S$
$\bar{s}(\theta)$
$t_{a}(\theta)$
V
$W_{s}$
$W_{t} \quad$ Characteristic mean width of tree crowns projected to the ground.
$\alpha \quad$ Half apex angle.
$\gamma_{E}$
$\Omega_{E}$
$\Omega_{t}$
$\lambda$
Tree height $H_{a}+H_{b}+H_{c}$.
Height of the lower part of the tree (trunk space).
$H_{b} \quad$ Height of cylinders.
$H_{c} \quad$ Height of cones.
$L \quad$ Leaf area index (LAI).
Mean LAI accumulated over the view or sun path within one tree crown.
$L_{t} \quad$ Clumping-adjusted projected tree crown area index.
Mean number of trees in a quadrat.
Mean number of cluster per quadrat.
Cluster mean size.
Number of quadrats in domain $B$.
Gap number density function between canopies.
Probability of sunlit ground area in the view directions.
Gap probability within a tree at angle $\theta$.
Probability of sunlit ground area.
Probability of viewing ground area.
Probability of viewing ground area for random tree distribution.
Probability of viewing ground area for clustered tree (Neyman distribution).
Probability of viewing sunlit foliage.
Poisson distribution.
Neyman type-A distribution.
Radius of the tree crowns.
Total reflectance.
Ground reflectance.
Tree reflectance.
Shaded ground surface reflectance.
Shaded tree surface reflectance.
The projected sloping quadrat area in the view direction.
Mean path length within a crown.
Tree crown surface area at $\theta$.
Volume of a tree.
Mean width of element shadows cast inside tree crowns.

| $\lambda_{\text {min }}$ | Minimum gap size for having an illuminated <br> surface. |
| :--- | :--- |
| $\phi_{g}$ | Azimuth angle of the sloping background. <br> $\phi_{v}$ <br> View azimuth angle. |
| $\phi_{g v}$ | Solar azimuth angle. <br> Relative azimuth angle between the viewer <br> and the sloping background. <br> Relative azimuth angle between the sun and <br> the viewer. |
| $\phi_{s v}$ | Relative azimuth angle between the sun and <br> the sloping background. |
| $\phi_{s g}$ | Slope of the sloping background or zenith <br> angle of the sloping background. |
| $\theta_{g}$ | Solar zenith angle to the horizontal back- <br> ground. |
| $\theta_{s}^{\prime}$ | Solar incidence angle to the sloping back- <br> ground. |
| $\theta_{s}$ | View zenith angle to the horizontal back- <br> ground. |
| $\theta_{v}^{\prime}$ | View zenith angle to the sloping background. |
| $\theta_{v}$ | Angle difference between the sun and the <br> viewer. |
| $S_{P T}$ | Percentage of sunlit points in viewed points. |

## I. Introduction

THE vegetation structure significantly affects its exchanges of matter and energy with the atmosphere, and therefore, vegetation structural parameters are important basic data for global change research. Geometric-optical (GO) models, as one kind of forest reflectance models, are suitable for developing algorithms for vegetation structural parameter retrieval because of their emphasis on vegetation structure and its interaction with radiative transfer processes in the canopy [1]-[4].

GO models have been well developed in the 1990s and early 2000s with the addition of radiative transfer schemes to address the complex multiple scattering issues in the canopy [5]-[7]. In recent years, the attention of many GO modelers have been turned to the applications of GO models for retrieving structural parameters such as LAI, clumping index, crown closure, and crown diameter [8]-[13]. Moreover, GO models are also used for canopy background reflectance retrieval [14]-[16], microwave modeling [17], and LiDAR analysis [18]-[20].

Many studies have shown that complex terrains strongly influence the canopy reflectance detected by sensors [21]-[23]. However, GO models are generally based on geometric relationships among solar zenith angle, view zenith angle, and relative azimuth angle between the sun and the viewer. They are only suitable for retrieving structural parameters of forests growing on flat terrains; however, forests are often found over complex terrains, which are particularly common in China.

A GO model consists of mathematical expressions of the canopy structure and within-canopy radiative transfer processes. Complex terrains influence both expressions [24], [25]. However, GO models usually only consider geometries of canopy structural components on a flat background [1], [2], [26]-[28]. Topographic corrections are generally used to reduce the topography effects on canopy bidirectional reflectance [22],
[29], [30]. However, these types of corrections aim only at image angular normalization [31] and are not based on fundamental mechanisms of the canopy radiative transfer and its interaction with the sloping background. Some studies have gone beyond these simple correction methods. For example, Schaaf et al. [24] attempted to establish a GO model suitable for sloping terrains based on the $\mathrm{Li}-$ Strahler GO model. This model transformed ellipsoidal crowns into spherical shapes in 3-D space to simplify the projection of these crowns on a sloping surface. However, this approach is not suitable for crowns that are different from the spherical shape. Combal et al. [31] pointed out that the model of Schaaf et al. [24] uses an implicit assumption that trees are perpendicular to the sloping surface and classified this type of models as Perpendicular to the Ground Vegetation Model. In reality, most trees grow vertically whether on a sloping surface. For applicability on complex terrains, it is necessary to establish a GO model considering the sloping canopy structure and radiative transfer mechanisms in the sloping canopy.

A GO model can be evaluated using observations against various outcomes of the model, including 1) modeled reflectance [2], [27], [32]; 2) inverted canopy parameters [1], [10], [33], [34]; and 3) modeled canopy gap fractions [2], [27], [35]. These outcome-based evaluations may not be sufficient because intermediate errors in producing an outcome could cancel each other. With the development of computer technology, 3-D virtual canopy modeling [36]-[38] could be an effective way to evaluate not only the outcome but also the intermediate modeling results, such as the fractions of the sunlit and shaded foliage and background. This new evaluation tool has allowed us to evaluate GOST in its various development stages.

In this paper, we focus on the development of a GO model suitable for sloping terrains (GOST) based on the four-scale GO model [27] developed for flat terrains. GOST considers a sloping canopy structure with trees growing vertically rather than perpendicularly to sloping surfaces. We make a comparison between GOST and a 3-D virtual computer model to prove that GOST has the ability to simulate the canopy gap fraction and area ratios of the four scene components (sunlit foliage, sunlit background, shaded foliage, and shaded background). The reflectance retrieved from a Landsat Thematic Mapper (TM) image and MODIS images are used to evaluate GOST performance.

## II. Model Description

The reflected signals received by sensors are assumed to be composed of signals from four scene components: sunlit foliage $\left(P_{T}\right)$, sunlit ground $\left(P_{G}\right)$, shaded foliage $\left(Z_{T}\right)$, and shaded ground $\left(Z_{G}\right)$. The total canopy reflectance is

$$
\begin{equation*}
R=R_{T} \cdot P_{T}+R_{G} \cdot P_{G}+R_{Z T} \cdot Z_{T}+R_{Z G} \cdot Z_{G} \tag{1}
\end{equation*}
$$

where $P_{T}$ and $P_{G}$ are the sunlit components that intercept the direct sunlight, and $Z_{T}$ and $Z_{G}$ are the shaded components receiving only the diffuse radiation from the sky and scattered radiation in the canopy. $R_{T}, R_{G}, R_{Z T}$, and $R_{Z G}$ are the reflectance factors of the four scene components in GOST.


Fig. 1. Coordinate system of photon interaction with a canopy on a sloping background. E, S, W, and N are the east, south, west, and north directions to the horizontal ground. Z is the vertical direction to the horizontal ground. Z ' is the vertical direction to the sloping ground.

Here, the vegetation and background components in the view direction will be first separated based on the gap fraction, and the four scene components will then be separated on sloping terrains.

## A. Determining the Coordinate System for a Sloping Canopy

GO models, such as the four-scale GO model, assume that trees are perpendicular to the background surface. The projection of tree crowns on the background is described using the solar zenith angle $\left(\theta_{s}^{\prime}\right)$, view zenith angle $\left(\theta_{v}^{\prime}\right)$, and relative azimuth angle between the sun and the viewer $\left(\phi_{s v}\right)$ for the horizontal surface. In GOST, the projection of forest scene components on sloping terrains is described using additional angles, including the solar incidence angle to the sloping surface $\left(\theta_{s}, \cos \left(\theta_{s}\right)=\cos \left(\theta_{g}\right) \cos \left(\theta_{s}^{\prime}\right)+\sin \left(\theta_{g}\right) \sin \left(\theta_{s}^{\prime}\right) \cos \left(\phi_{s g}\right)\right)$, view incidence angle to the sloping surface $\left(\theta_{v}, \cos \left(\theta_{v}\right)=\right.$ $\left.\cos \left(\theta_{g}\right) \cos \left(\theta_{v}^{\prime}\right)+\sin \left(\theta_{g}\right) \sin \left(\theta_{v}^{\prime}\right) \cos \left(\phi_{g v}\right)\right)$, and slope $\left(\theta_{g}\right)$ and aspect $\left(\phi_{g}\right)$ (see Fig. 1).

## B. Tree Distribution

The canopy gap size and gap fraction distributions are determined by the tree distribution. Chen and Leblanc [27] studied both the random Poisson distribution and the nonrandom Neyman type-A distribution [39] for describing the tree distribution. The results showed that the Neyman type-A distribution is better than the Poisson distribution in capturing a tree distribution pattern in a boreal forest. However, the Poisson distribution can be used as a backup approach when detailed tree distribution data are lacking. These two distributions are alternatively used in GOST, and other types of distributions can also be used to replace them. In GOST, a study area is divided into a number of quadrats in order to obtain a statistical tree distribution. The Poisson distribution is

$$
\begin{equation*}
P(x)=\frac{e^{-m} m^{x}}{x!} \tag{2}
\end{equation*}
$$

where $P(x)$ is the probability of finding $x$ trees in a quadrat. $m$ is the mean number of trees in a quadrat. In order to avoid overly


Fig. 2. Projections of tree crown and background. (a) Projection area $t_{a}$ of a tree crown in the sunlight or viewer direction. (b) Projection area $S$ of the sloping background in the sunlight or viewer direction. The arrow directions are the sunlight or viewer directions.
populated quadrats that could be difficult to handle numerically, Chen and Leblanc [27] gave an example: For a $100 \times 100 \mathrm{~m}$ domain with 3000 trees, it is preferable to divide the domain into at least ten quadrats.

The Neyman type-A distribution assumes that trees are first combined in clusters, and the spatial distribution of the center of a cluster follows the Poisson process, that is

$$
\begin{align*}
P_{N}\left(i ; m_{1} ; m_{2}\right)=e^{-m_{1}} \frac{m_{2}^{i}}{i!} \sum_{j=1}^{\infty} \frac{\left[m_{1} e^{-m_{2}}\right]^{j}}{j!} & \cdot j^{i} \\
& i=0,1,2, \cdots \tag{3}
\end{align*}
$$

where $P_{N}\left(i ; m_{1} ; m_{2}\right)$ is the probability of finding $i$ trees in a quadrat, $m_{1}$ is the mean number of clusters per quadrat, $m_{2}$ is the cluster mean size, and $j$ is the cluster number in a quadrat.

The tree crown distribution on sloping terrains is assumed to be the same as that on a flat terrain at nadir, and the number of tree crowns projected in the vertical direction is assumed to be invariant on different slopes.

## C. Projection of Tree Crowns on the Sloping Background

In GO models, a tree is generally assumed to be an ideal 3-D geometric shape according to the geometric characteristics of tree species, such as cone [1], [32], ellipsoidal [28], [40], and "cone + cylinder" [27]. Rautiainen et al. [41] indicated that the shape of tree crowns is one of the key parameters for determining the canopy bidirectional reflectance. The "cone + cylinder" shape is used in GOST for coniferous tree crowns. However, other geometric shapes can also be used to replace it as needed

The projection of tree crowns on the background is the basis to model the scene components using a GO approach. For the purpose of designing the new projection relationship, the "cone + cylinder" projected area $t_{a}$ [see Fig. 2(a)] and sloping background projected area $S$ [see Fig. 2(b)] in the viewer and sunlight directions should be considered. Therefore, tree crowns are projected onto the sloping background in GOST using $t_{a} / S$ in the sunlight and view directions, separately.


Fig. 3. Topographic effects on the gap size. (a) If the sunlight or view direction is facing the sloping background, the gap fraction and gap size between crowns increase with the increasing slope. (b) If the sunlight or viewer direction is not facing the sloping background, the gap fraction and the gap size between crowns decrease with the increasing slope.

The "cone + cylinder" projected area in the view direction is

$$
t_{a}\left(\theta_{v}^{\prime}\right)= \begin{cases}\pi r^{2}+2 r \sin \left(\theta_{v}^{\prime}\right) H_{b} & \theta_{v}^{\prime}=0  \tag{4}\\ \pi r^{2} \cos \left(\theta_{v}^{\prime}\right)+2 r \sin \left(\theta_{v}^{\prime}\right) H_{b} & \theta_{v}^{\prime}<\alpha \\ \pi r^{2} \cos \left(\theta_{v}^{\prime}\right)+t_{a c t}+2 r \sin \left(\theta_{v}^{\prime}\right) H_{b} & \theta_{v}^{\prime}>\alpha\end{cases}
$$

where $r$ is the radius of the tree crowns, $H_{b}$ is the height of cylinders, $\alpha$ is the half apex angle, and $t_{\text {act }}$ is the top part of the tree crown projected area in the view direction (see the Appendix). Using $\theta_{s}^{\prime}$ instead of $\theta_{v}^{\prime}$, (4) gives the "cone + cylinder" projected area in the sunlight direction.

The projected sloping quadrat area in the view direction is

$$
\begin{equation*}
S=A \cdot \cos \left(\theta_{v}\right) / \cos \left(\theta_{g}\right) \tag{5}
\end{equation*}
$$

where $A$ is the projected quadrat area at nadir, and $A / \cos \left(\theta_{g}\right)$ is the sloping background area. Using $\theta_{s}$ instead of $\theta_{v}$, (5) gives the projected sloping area in the sunlight direction.

## D. Separating Foliage and Background on Sloping Terrains

The gap fraction is used to separate foliage and background on sloping terrains in GOST. In forest canopies, leaves are clumped within tree crowns, and trees are grouped rather than randomly distributed. Therefore, the gap fraction within a canopy is composed of those between and within tree crowns.

Fig. 3 shows that the gap fraction of a canopy is strongly influenced by sloping terrains. The new projection $t_{a} / S$ is used for calculating the gap fraction between crowns on sloping terrains. In the view direction, the gap fraction between crowns in a sloping quadrat is described using the Poisson distribution, i.e.,

$$
\begin{equation*}
P_{v g \_r}=\left[1-\frac{t_{a}\left(\theta_{v}^{\prime}\right)}{S}\right]^{D / n} \tag{6}
\end{equation*}
$$

and the gap fraction between crowns calculated using the Neyman type-A distribution $P_{N}\left(i ; m_{1} ; m_{2}\right)$ on sloping terrains is

$$
\begin{equation*}
P_{v g_{-} c}=\sum_{i=0}^{k} P_{N}\left(i ; m_{1} ; m_{2}\right)\left[1-\frac{t_{a}\left(\theta_{v}^{\prime}\right)}{S}\right]^{i} \tag{7}
\end{equation*}
$$

where $D$ is the number of trees in domain $B, n$ is the number of quadrats in domain $B$, and $k$ is an integer that should be large enough to consider all overlapped trees in a quadrat and is equal to 350 here. Using $\theta_{s}^{\prime}$ instead of $\theta_{v}^{\prime}$, (6) and (7) give the gap fractions between crowns corresponding to the Poisson $\left(P_{i g_{-} r}\right)$ and Neyman type-A $\left(P_{i g_{\_} c}\right)$ distributions in the sunlight direction, separately.

Lambert-Beer's law is generally used for describing the transmission of beam radiation [42]-[44]. Chen and Leblanc [27] used an equation similar to that used by Li and Strahler [35] but modified it to consider the foliage clumping effect [45] for simulating the gap fraction within a tree. In GOST, the function used in the four-scale model to calculate gap fraction for a tree is modified. Different from the gap fractions between tree crowns, the gap fraction within a tree does not change with the slope of the background. Therefore, the gap fraction in a tree in the view direction is

$$
\begin{equation*}
P_{\mathrm{gap}}\left(\theta_{v}^{\prime}\right)=e^{-G\left(\theta_{v}^{\prime}\right) L_{0} \Omega_{\mathrm{E}} / \gamma_{\mathrm{E}}} \tag{8}
\end{equation*}
$$

where $G\left(\theta_{v}^{\prime}\right)$ is the projection of unit leaf area, which is equal to 0.5 for a spherical leaf angle distribution [27], [46]. $\Omega_{E}$ is the clumping index for shoots, quantifying clumping at scales larger than the shoot. $\gamma_{E}$ is the ratio of half total needle area in a shoot to half total shoot surface area [46]. $L_{0}$ is the LAI in the view direction and calculated as $L_{0}=\mu \cdot \bar{s}$, where $\mu$ is the foliage volume density $(\mu=L /[V \cdot D / B])$. For sloping terrains considered here, $L$ is defined as one half the total leaf area per unit horizontally projected ground surface area (LAI). Therefore, according to the assumption that the tree crown is vertically grown, LAI does not change with the slope of background at nadir. $B$ is the vertically projected domain area at nadir, and $V$ is the volume of a tree crown. $\bar{s}$ is the mean of path length through a tree. In the view direction, it is calculated as $\bar{s}\left(\theta_{v}^{\prime}\right)=V / t_{a}\left(\theta_{v}^{\prime}\right)$.

The total gap fraction over a sloping terrain is

$$
\begin{equation*}
P_{v g}=\sum_{j=1}^{k} P_{t j}\left(t_{a}\right) P_{\text {gap }}^{j}\left(\theta_{v}^{\prime}\right)+P_{v g_{-} c} \tag{9}
\end{equation*}
$$

where $P_{\text {gap }}^{j}\left(\theta_{v}^{\prime}\right)$ is the gap probability within a canopy with $j$ trees overlapping along the view line and calculated as

$$
\begin{equation*}
P_{\text {gap }}^{j}\left(\theta_{v}^{\prime}\right)=\prod_{1}^{j} P_{\text {gap }}\left(\theta_{v}^{\prime}\right) . \tag{10}
\end{equation*}
$$

In (9), $P_{t j}\left(t_{a}\right)$ is the probability of $j$ trees intercepting the view line and calculated using the binomial distribution, i.e.,

$$
\begin{align*}
& P_{t j}\left(t_{a}\right)=\sum_{i=j}^{k} P_{N}\left(i ; m_{1} ; m_{2}\right) \frac{i!}{(i-j)!j!} \\
& \times\left[1-\frac{t_{a}\left(\theta_{v}^{\prime}\right)}{S}\right]^{i-j}\left[\frac{t_{a}\left(\theta_{v}^{\prime}\right)}{S}\right]^{j} \tag{11}
\end{align*}
$$

With $\theta_{s}^{\prime}$ instead of $\theta_{v}^{\prime}$, (9) can also be used to calculate the gap fraction in the sloping canopy in the sunlight direction $P_{\mathrm{i} g}$.

## E. Separating Sunlit and Shaded Backgrounds on Sloping Terrains

$P_{\mathrm{i} g}$ represents the sunlit background fraction, and $P_{\mathrm{v} g}$ is the viewed background fraction. If the view line and solar beam penetrations through the canopy are independent of each other, the fraction of sunlit background in the view direction is simply the product of $P_{\mathrm{i} g}$ and $P_{\mathrm{v} g}$. However, when the view line is near the solar beam direction, it can penetrate through the same gap in the canopy as the solar beam and increases the probability of observing the sunlit background. A hotspot occurs when the view line is in the same direction as the solar beam. Chen and Leblanc [27] proposed a hotspot function on a horizontal surface. In GOST, the form of the hotspot function is the same as that of the four-scale model. However, some variables are modified here to be suitable for sloping terrains. The hotspot function is

$$
\begin{equation*}
F_{t}(\xi)=\frac{\int_{\lambda_{\min }}^{\infty}\left[1-\frac{\xi}{\tan ^{-1}(\lambda / H)}\right] N_{t}(\lambda) d \lambda}{\int_{\lambda_{\min }}^{\infty} N_{t}(\lambda) d \lambda} \tag{12}
\end{equation*}
$$

where the angle between the sun and the viewer (phase angle) is

$$
\begin{equation*}
\xi=\arccos \left(\cos \left(\theta_{v}^{\prime}\right) \cos \left(\theta_{s}^{\prime}\right)+\sin \left(\theta_{v}^{\prime}\right) \sin \left(\theta_{s}^{\prime}\right) \cos \left(\phi_{s v}\right)\right) \tag{13}
\end{equation*}
$$

$H$ is the effective height given as $\left(H_{a}+H_{b}+H_{c} / 3\right) \times$ $\cos \left(\theta_{g}\right) / \cos \left(\theta_{s}\right), H_{a}$ is the height of the lower part of the tree (trunk space), $H_{b}$ is the height of cylinders, and $H_{c}$ is the height of cones.
$N_{t}(\lambda)$ is the gap number density given as

$$
\begin{equation*}
N_{t}(\lambda)=\frac{L_{t}}{W_{t}} e^{-L_{t}\left[1+\left(\lambda / W_{t}\right)\right]} \tag{14}
\end{equation*}
$$

The characteristic mean width of a tree projected in the sunlight direction is

$$
\begin{equation*}
W_{t}=\sqrt{t_{a}\left(\theta_{s}^{\prime}\right)} \tag{15}
\end{equation*}
$$

The clumping-adjusted projected crown area index on sloping terrains is

$$
\begin{equation*}
L_{t}=\Omega_{t} t_{a}\left(\theta_{s}^{\prime}\right) D /\left(B \cos \left(\theta_{s}\right) / \cos \left(\theta_{g}\right)\right) \tag{16}
\end{equation*}
$$

$\Omega_{t}$ is a tree clumping index, determined by the Neyman distribution defined as

$$
\begin{equation*}
\Omega_{t}=\log \left(P_{i g_{-} c}(\text { Neyman })\right) / \log \left(P_{i g_{\_} r}(\text { Poisson })\right) \tag{17}
\end{equation*}
$$

For a given angle difference between the sun and the viewer, there is a minimum gap size $\lambda_{\text {min }}$ in which the view line penetrates through the same gap as the solar beam, determined by

$$
\begin{equation*}
\lambda_{\min }=H \tan (\xi) \tag{18}
\end{equation*}
$$

$\lambda$ is the gap size of the canopy between $\lambda_{\text {min }}$ and $\infty$.
Therefore, the total probability of seeing the sunlit background on sloping terrains is

$$
\begin{equation*}
P_{G}=P_{i g} P_{v g}+\left[P_{i g}-P_{i g} P_{v g}\right] F_{t}(\xi) \tag{19}
\end{equation*}
$$

The first term on the right-hand side represents the probability of observing the sunlit background when the view line penetration is independent of the solar beam penetration, and the second term is the enhanced probability due to the hotspot.

The probability of seeing the shaded background on sloping terrains is

$$
\begin{equation*}
Z_{G}=P_{v g}-P_{G} \tag{20}
\end{equation*}
$$

It is the difference in the probabilities of observing the total background $\left(P_{v g}\right)$ and the sunlit background $\left(P_{G}\right)$.

## F. Separating Sunlit and Shaded Foliage on Sloping Terrains

The separation of sunlit and shaded foliage in the view direction presents a challenge in forest GO modeling. There is still no perfect geometric description for this purpose. In GOST, a simplified ray tracing method is developed for separating sunlit and shaded foliage on sloping terrains. The basic idea of this method is first to describe the foliage spatial and angular distributions and then to penetrate a view line into the canopy. If the view line can touch any foliage in the canopy, we need to determine whether the sunlight can reach the same point of the foliage. Through repeating these aforementioned steps many times, the probability of viewing sunlit foliage can be separated from the viewed foliage.

A variety of foliage shapes and crown shapes can be used for separating sunlit and shaded foliage using straightforward geometric formulas of the simplified ray tracing method depending on forest types. Specific distributions of foliage and crowns can also be used here according to the measured data in forests. However, large amounts of needle foliage of conifer trees need large computer memory space, which greatly exceeds the capacity of a personal computer. For this reason, a shoot is treated as the minimum foliage element. The shape of foliage can be treated not only to be planar shapes, such as circular, square, rectangle, rhombus, and so on, but also 3-D shapes, such as cylinder, cuboid, hexagonal prism, and so on. In order to reduce the number of facets of a forest scene, the planar shape of foliage is used for both the broad leaved and conifer forest scenes in the simplified ray tracing method. In general, the planar shape of foliage is suitable for broadleaf forests. For conifer forests, the projection coefficient of flat leaves in a given direction is the same as that of spheres (representing shoots) as long as they are all randomly distributed in space, and the definition of half the total area is used [45]. This means that the results of ray tracing based on the planner shape are directly applicable to the shoots when half of the total plane area (both sides) is used to represent half the total shoot area (average projected shoot area $\times \pi$ ). The needle-to-shoot area ratio is then used to convert this half the total needle area to half the total shoot area. In this way, the ray tracing results for the planner leaf shape can be used for both broadleaf and needleleaf forests.

An example is used to explain how to use the simplified ray tracing method for separating sunlit and shaded foliage. This method needs to determine the forest scene on slopes first. In describing the foliage spatial and angular distributions, we assume crowns to be randomly distributed in space and leaves
to be randomly distributed within each crown. The crown is assumed to be "cone + cylinder," and the foliage is assumed to be circular and flat plates. A vector normal to the plate is used for describing the foliage angular distribution [47]. The foliage spatial distribution in a tree is expressed using the random centers of these plates. According to the center and normal vector of a plate, the direction and position of it can be determined. In the ray tracing procedure, the view azimuth angle $\phi_{v}$ is set to zero. The sunlight direction, slope and aspect of the terrain, and the view zenith angle $\theta_{\mathrm{v}}^{\prime}$ are varied to simulate multiangular views. In these simulations, a plane, which is perpendicular to the direction vector of the view line, can be determined by any specific point far from the top of the forest canopy. In order to make all the view lines penetrating into the forest scene, only a rectangle region in the plane is used as the launch positions of the view lines according to the range of the forest scene. The number of the incident view lines can be determined by the foliage density in a specific forest scene. In general, the denser the foliage in a forest scene, the more incident view lines are required. For this reason, the number of the incident view lines can be related to LAI. In general, we recommend that the number of the incident view lines is no less than 10000 for each forest scene, which contains no more than 100 crowns with LAI of about 3. Second, the view lines are sent from the launch positions of the plane to the forest scene one by one. If a view line does not touch any plates in the forest scene, it is not considered. Otherwise, the first intersection point (FIP) of the view line and the plate could be found. To eliminate the edge effect, only the incident view lines that reach a relatively small square center area of the forest scene are preserved. Third, if the sight line intersects with a plate, we need to decide whether the FIP can be touched by the sunlight according to the direction vector of the sunlight and the normal vector of the plate. If there exists another plate between the sun's position and the FIP or the FIP is not in the same side of the plate hit by the sunlight, the FIP is a shaded point in the view direction. Otherwise, it is a sunlit point in the view direction.

After all the ray tracing procedure, we can get the percentage of sunlit points that are reached by the view lines $S_{P T}$ in the view direction. The total probability of seeing the sunlit foliage in the sloping canopy is

$$
\begin{equation*}
P_{T}=S_{P T} /\left(1-P_{v g}\right) . \tag{21}
\end{equation*}
$$

The total probability of seeing the shaded foliage in the sloping canopy is

$$
\begin{equation*}
Z_{T}=1-P_{v g}-P_{T} . \tag{22}
\end{equation*}
$$

## III. Results and Analysis

The area ratios of the four scene components of a sloping forest are conceptual quantities, which are difficult to observe in real forest canopies. Therefore, the 3-D virtual canopies are constructed using a computer graphics technique to evaluate the simulated area ratios by GOST. Then, the reflectance simulated by GOST is compared with the reflectance data retrieved from a TM image and from a MODIS multiangle surface reflectance

TABLE I
Canopy Parameters for Simulating the Area Ratios of the Four Scene Components by the 3-D Virtual Model and GOST

| LAI | Ha | Hb | r | a | WS | $\Omega_{\mathrm{E}}$ | $\gamma_{\mathrm{E}}$ | $\mathrm{G}(\theta)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 2.7 | 0.5 m | 2.5 m | 0.85 m | $30^{\circ}$ | 0.17 m | 1 | 1 | 0.5 |



Fig. 4. Example of a 3-D virtual canopy on a $20^{\circ}$ slope. This 3-D virtual canopy is produced using the 3-D max software and the Maxscript computer language. The rendered scenes are classified as the four scene components in multiangle directions. (a) Perspective view. (b) Nadir view. (c) Side view.
product over a mountainous area in China for the purpose of evaluating the performance of GOST.

## A. Model Comparison

In GOST, the sunlit and shaded foliage fractions that are seen in a given direction are separated based on the geometrical shape of the tree crown and the probability of solar beam and view line penetrations within the crown. The separation of the four scene components is a fundamental part of GO modeling and is checked against ray tracing in 3-D virtual canopies. As the principles of GO modeling for broadleaf and conifer canopies are similar, we choose broadleaf virtual canopies for this purpose, which are structurally less complex and require less computation than conifer canopies.

1) Virtual Canopy Modeling: The 3-D max software and the Maxscript computer language are used for constructing 3-D virtual canopy models to compare the area ratios of the four scene components on sloping terrains calculated using GOST. A 3-D virtual canopy consists of broad leaves that are randomly distributed within a crown. The virtual tree crowns are distributed on a sloping quadrat randomly in the vertical direction. A virtual forest scene is then separated into sunlit and shaded parts under the virtual parallel sunlight in the 3-D max camera view. The multiangle images of the virtual canopy are rendered using axonometric projection through moving the positions and changing the view angles of the 3-D Max camera. Finally, the four scene components are classified in each of the rendered multiangle images of a virtual canopy. The regions that are not influenced by edge effects are artificially selected to classify the four scene components in these rendered multiangle images.


Fig. 5. Comparison of the classified and simulated gap fractions of the sloping canopies $\left(\phi_{g}=0\right)$ in the principal and perpendicular planes. 3D_0, 3D_10, $3 \mathrm{D} \_20,3 \mathrm{D} \_30,3 \mathrm{D} \_40,3 \mathrm{D} \_50$, and $3 \mathrm{D} \_60$ are the simulated results of the $3-\mathrm{D}$ virtual canopy model with the slope of the background at $0^{\circ}, 10^{\circ}, 20^{\circ}, 30^{\circ}$, $40^{\circ}, 50^{\circ}$, and $60^{\circ}$. GOST_0, GOST_10, GOST_20, GOST_30, GOST_40, GOST_50, and GOST_60 are the simulated results of GOST with the slope of the background at $0^{\circ}, 10^{\circ}, 20^{\circ}, 30^{\circ}, 40^{\circ}, 50^{\circ}$, and $60^{\circ}$.
2) Forest Site Example: A set of broadleaf canopy parameters in reasonable ranges is shown in Table I as the inputs to the 3-D virtual canopy model and GOST. Because it is time consuming to simulate the detailed forest scenes, only $1 / 4$ of a quadrat $\left(125 \mathrm{~m}^{2}\right)$ with 50 tree crowns is simulated. In this example, a virtual leaf is assumed to be a circular and flat plate with diameter $W_{s}$. The solar zenith angle $\theta_{s}^{\prime}$ and solar azimuth angle $\phi s$ are set to $30^{\circ}$ and $180^{\circ}$, respectively. The azimuth angle $\phi_{g}$ of the sloping background is set to zero. An example of the 3-D virtual canopy on a $20^{\circ}$ slope is shown in Fig. 4.

Fig. 5 shows how the gap fraction changes with background slope from $0^{\circ}$ to $60^{\circ}$ in $10^{\circ}$ intervals in the principal and perpendicular planes. The relative azimuth angle between the sun and the viewer equals $0^{\circ}$ or $180^{\circ}$ in the principal plane and $90^{\circ}$ in the perpendicular plane. The comparison shows that the gap fractions simulated by GOST agree well with the outputs from the 3-D virtual canopy model. It indicates the ability of GOST to separate the foliage components and the background components on sloping terrains.

Different from trees growing on flat terrains, sloping canopies cannot be observed from all view angles of the hemisphere (see Fig. 3). For example, the range of the view zenith angle decreases with increasing slope of the inclined background in the principal plane (see Fig. 5). In the perpendicular plane, the absence of the gap fraction simulated by the 3-D virtual canopy model is because the tree-covered regions are too small to be classified in the rendered images at large $\theta_{v}$.

Both GOST and the 3-D virtual canopy model assume that the number of tree crowns does not change with the slope of terrains in the vertical direction. Therefore, the simulated gap fraction also does not change with the slope at nadir (see Fig. 5). In the principal plane, the gap fraction increases on the backscattering side (negative $\theta_{v}^{\prime}$ ) and decreases on the forwardscattering side (positive $\theta_{v}^{\prime}$ ) with the slope of the inclined background because $\theta_{v}$ values are different on both sides of the vertical direction. The gap fractions are also not the same on different slopes in the same view direction. On the backscat-
tering side, the gap fraction increases with slope in the same view direction. On the contrary, on the forwardscattering side, the gap fraction decreases with increasing slope in the same view direction. Gap fractions on both sides of the perpendicular plane are the same because the forest scene components are symmetric on both sides of the vertical direction when the relative azimuth angle equals $90^{\circ}$. The gap fraction reaches a maximum at nadir in the perpendicular plane because the overlapping of tree crowns is minimum in this view direction. With the increase in the view zenith angle, the overlapping of tree crowns increases, and the gap fraction decreases with slope. Moreover, the gap fraction does not change with slope of the inclined background at the same $\theta_{v}^{\prime}$ on both sides of the perpendicular plane because $\cos \left(\phi_{g v}\right)=0$ and the projected area of background $S$ and the projected area of a tree crown $t_{a}\left(\theta_{v}^{\prime}\right)$ do not change with slope.

Different from the outputs of GOST, the classified gap fractions by the 3-D virtual canopy model are unsmooth (see Fig. 5). Such as the sudden rise in gap fractions at $0^{\circ}$ and $10^{\circ}$ slopes in the principal plane and the unsmooth gap fractions at large slopes in the perpendicular plane. There are also unsymmetric gap fractions that are simulated by the 3-D virtual forest on both sides of the vertical direction in the perpendicular plane. These unsmooth and unsymmetric results are caused by the insufficient number of trees included in the simulation where a few tree crowns can have unproportionally large contributions to the view in certain directions. However, the simulated gap fractions by GOST are smooth and symmetric both in the principal and perpendicular planes. This model comparison demonstrated that the results of the 3-D virtual canopy model and GOST have no systematic deviation, and GOST has the ability to separate foliage and background area ratios (gap fraction) of forest on slopes.

The area ratios of the four scene components modeled by GOST are very close to those simulated by the 3-D virtual canopy model in both principal and perpendicular planes (see Figs. 6 and 7). It indicates that both models have no systematic


Fig. 6. Comparison of the classified and simulated four scene components area ratios of the sloping canopy in the principal plane. 3D_0, 3D_10, 3D_20, 3D_30, $3 \mathrm{D} \_40,3 \mathrm{D} \_50$, and $3 \mathrm{D} \_60$ are the simulated results of the 3-D virtual canopy model with the slope of the background at $0^{\circ}, 10^{\circ}, 20^{\circ}, 30^{\circ}, 40^{\circ}, 50^{\circ}$, and $60^{\circ}$. GOST_0, GOST_10, GOST_20, GOST_30, GOST_40, GOST_50, and GOST_60 are the simulated results of GOST with the slope of the background at $0^{\circ}, 10^{\circ}$, $20^{\circ}, 30^{\circ}, 40^{\circ}, 50^{\circ}$, and $60^{\circ}$.
deviation, and GOST has the ability to separate the four scene components area ratios of sloping canopies. In addition, a total of 8500 view lines are emitted from the launching plane to the forest scene by GOST for separating sunlit and shaded foliage on each slope and in each view direction. The average computing time for separating the four scene components is only 8 s , and therefore, GOST is a useful method despite the fact that it contains a simplified ray tracing process. GOST can explicitly represent the topographic effects on area ratios of foliage components because it considers the sloping canopy structure in any view directions. These simulations show that the differences in the area ratios of the four scene components between flat and sloping terrains can reach up to $50 \%-60 \%$ in the principal plane and about $30 \%$ in the perpendicular plane (see Figs. 6 and 7). Therefore, without considering the effects of sloping terrains in GO models, it might cause significant errors in the area ratios of the four scene components, and the errors are consequently passed to the simulated canopy reflectance.

When the view and sunlight directions are the same, the "hotspot" occurs in the principal plane (see Fig. 6). The hotspot is an important phenomenon that can be used for retrieving canopy structural parameters, such as clumping index [8], [48]. GOST successfully simulates significant increases in the area
ratios of sunlit foliage and background components at the hotspot. The shaded foliage and background area ratios are $0 \%$ at the hotspot because these two scene components cannot be observed at the hotspot. In the hotspot direction, the gap fraction increases with slope, and therefore, the sunlit and shaded foliage area ratios decrease.

The variation of the sunlit foliage area ratio reaches the minimum at different slopes at nadir at which the overlapping of tree crowns reaches the minimum. The gap fraction increases with slope in the backscattering side of the principal plane. Therefore, foliage area ratios decrease with increasing slope. On the contrary, the gap fraction decreases, and foliage area ratios increase with slope in the forwardscattering side. Fig. 6 also shows that both the classified and simulated foliage area ratios are unsmooth in the principal plane, particularly at large view zenith angles $\theta_{v}$. The reason of the unsmooth results classified by the 3-D virtual canopy model is the small portion of the image that can be rendered at large view zenith angles at which it is difficult to class the foliage area ratios. However, the unsmooth foliage area ratios simulated by GOST are caused by the small forest scene that contains an insufficient number of trees to be statistically representative at all angles. The gap fraction increases with slope in the backscattering direction,


Fig. 7. Comparison of the classified and simulated four scene components area ratios of the sloping canopy in the perpendicular plane. 3D_0, 3D_10, 3D_20, $3 \mathrm{D} \_30,3 \mathrm{D} \_40,3 \mathrm{D} \_50$, and $3 \mathrm{D} \_60$ are the simulated results of the $3-\mathrm{D}$ virtual canopy model with the slope of the background at $0^{\circ}, 10^{\circ}, 20^{\circ}, 30^{\circ}, 40^{\circ}, 50^{\circ}$, and $60^{\circ}$. GOST_0, GOST_10, GOST_20, GOST_30, GOST_40, GOST_50, and GOST_60 are the simulated results of GOST with the slope of the background at $0^{\circ}$, $10^{\circ}, 20^{\circ}, 30^{\circ}, 40^{\circ}, 50^{\circ}$, and $60^{\circ}$.
and therefore, the sunlit background area ratio increases with slope. The gap fraction does not change with slope in the nadir view direction; as a consequence, the sunlit background area ratio increases, and the shaded background area ratio decreases with increasing slope. The sunlit background area ratio has the least influence at about $20^{\circ}$ view zenith angle $\left(\theta_{v}^{\prime}\right)$. This is because the sunlit background area ratio increases with slope and decreases with increasing view zenith angle, and the balance is achieved at this $\theta_{v}^{\prime}$. In the 3-D virtual canopy, the uncertainty of the shaded background area ratio comes from the accumulative error because the shaded background area ratio is equal to the gap fraction minus the sunlit background area ratio.

Fig. 7 also shows the unsmooth foliage area ratios classified by the 3-D virtual canopy model in the perpendicular plane, particularly the sudden decrease in the sunlit foliage area ratio at large $\theta_{v}$. The sunlit background area ratio increases with slope in the perpendicular plane because more sunlight reaches the background through a canopy. Therefore, the shaded background area ratio decreases with increasing slope. In the perpendicular plane, the gap fraction decreases with increasing $\theta_{v}^{\prime}$, and therefore, sunlit and shaded foliage area ratios increase with $\theta_{v}^{\prime}$. Despite the unsymmetric and unsmooth sunlit and shaded
background area ratios on both sides of the vertical direction in the perpendicular plane, the classified background area ratios by the 3-D virtual canopy model are close to the simulated results by GOST. It indicates that GOST can separate sunlit and shaded backgrounds on slopes with reasonable accuracy.

## B. Model Validations

In order to prove the ability of GOST to model canopy reflectance variations with slope and aspect of the terrain, two experiments are designed for validating the reflectance simulated by GOST. Considering the difficulty in observing the canopy parameters on slopes, we use best estimates of common canopy parameters to fit the observed reflectance acquired from remote sensing images.

1) Comparison of the Modeled and Landsat Reflectance: In this experiment, the reflectances of many pixels in a Landsat TM5 image are needed to enhance the regularity of the reflectance variation with slope. Therefore, a rectangle forest region ( $94581 \mathrm{~m} \times 123375 \mathrm{~m}$ ) northeast of China (near 53N, 124 E ) is selected as the study site. The vegetation cover is predominantly conifer forest in this region. The corresponding Landsat TM5 image is acquired on August 30, 2009, and


Fig. 8. Observed reflectance in the TM5 image (the red and NIR reflectance) varies with slope and aspect of the terrain. The blue, green, and red dots represent the slope between $0^{\circ}$ and $10^{\circ}$, between $10^{\circ}$ and $20^{\circ}$, and between $20^{\circ}$ and $30^{\circ}$, respectively.
a total of $3153 \times 4113$ nadir view pixels are selected for this study. However, no ground observations are available for the sloping canopy parameters corresponding to these selected pixels. Therefore, the direct comparisons of the statistical results from the Landsat TM5 image and the model simulated results cannot be made. In this experiment, the quantitative analysis of the topographical effects on the sloping canopy reflectance is based on model simulated results, and the observed Landsat TM reflectance data are used to support the model simulated results.

Spectral reflectance in the red and NIR bands is retrieved from the original digital number of the Landsat TM5 image. The solar azimuth angle is $154^{\circ}$, and the solar zenith angle is $46^{\circ}$ of this TM5 image. The digital elevation model (DEM) data sets for this study site are used to produce images of the slope and aspect. The slope is divided into three intervals: from $0^{\circ}$ to $10^{\circ}$, from $10^{\circ}$ to $20^{\circ}$, and from $20^{\circ}$ to $30^{\circ}$. The aspect ranges from $0^{\circ}$ to $359^{\circ}$ in $1^{\circ}$ intervals. Then, the mean values of reflectance are computed for each slope and aspect interval. The statistical results of the TM5 image are shown in Fig. 8.

We have made a best estimate of the model inputs using common parameter values of forest within reasonable ranges. In this case, conifer trees are simulated as "cone + cylinder" with the Neyman distribution. The slopes of $5^{\circ}, 15^{\circ}$, and $25^{\circ}$ are used for simulating the reflectance to represent the slope between $0^{\circ}$ and $10^{\circ}$, between $10^{\circ}$ and $20^{\circ}$, and between $20^{\circ}$ and $30^{\circ}$, respectively. The other input parameters of this canopy are listed in Table II. Then, the reflectance is simulated within the aspect range from $0^{\circ}$ to $359^{\circ}$ in $1^{\circ}$ intervals.

Fig. 9 is the reflectance and its corresponding area ratios of the four scene components simulated by GOST. Both the statistical results (see Fig. 8) and the simulated results (see Fig. 9) show that the topographic factors have obvious impacts on the reflectance of sloping canopies. They also show that the

TABLE II
Model Inputs for Simulating the TM Reflectance

| Domain size | 1 ha |
| :---: | :---: |
| $\theta_{s}{ }^{\prime}$ | $46^{\circ}$ |
| $\phi_{s}$ | $154^{\circ}$ |
| $\theta_{v}{ }^{\prime}$ | $0^{\circ}$ |
| $\phi_{v}$ | $0^{\circ}$ |
| LAI | 4 |
| Tree density | 2480 trees/ha |
| Grouping(m2) | 4 |
| Quadrat size | $125 \mathrm{~m}^{2}$ |
| Ha | 9.0 m |
| Hb | 4.8 m |
| r | 1.7 m |
| $\alpha$ | $45^{\circ}$ |
| $\mathrm{G}(\theta)$ | 0.5 |
| $\mathrm{~W}_{\mathrm{S}}$ | 0.08 m |
| $\gamma_{\mathrm{E}}$ | 1.1 |
| $\Omega_{\mathrm{E}}$ | 0.82 |
| $\mathrm{R}_{\mathrm{T}}($ red $)$ | 0.08 |
| $\mathrm{R}_{\mathrm{ZT}}$ (red) | 0.0002 |
| $\mathrm{R}_{\mathrm{T}}$ (nir) | 0.48 |
| $\mathrm{R}_{\mathrm{ZT}}(\mathrm{nir})$ | 0.0398 |
| $\mathrm{R}_{\mathrm{G}}($ red $)$ | 0.04 |
| $\mathrm{R}_{\mathrm{ZG}}($ red $)$ | 0.0002 |
| $\mathrm{R}_{\mathrm{G}}(\mathrm{nir})$ | 0.2 |
| $\mathrm{R}_{\mathrm{ZG}}$ (nir) | 0.0284 |

simulated reflectance by GOST compares well with that in the TM5 image with the variations of slope and aspect.

The reflectance of shaded foliage and background are assumed as constants because multiple scattering schemes are not yet considered in GOST. Therefore, the simulated reflectance of sloping canopies depends on the area ratios of the four scene components at different slopes and aspects. According to a preamble analysis, the gap fraction is invariant at nadir. As a consequence, the area ratio of shaded foliage moves in the opposite direction to the area ratio of sunlit foliage at different aspects, so does the relationship between the sunlit and shaded backgrounds. Furthermore, the simulated reflectance of sloping canopies depends on the area ratios of the sunlit components because the reflectance of the sunlit components is considerably larger than those of the shaded components in both the red and NIR bands. Therefore, the simulated results by GOST show positive correlations between the reflectance of sloping canopies and the area ratios of the sunlit components (see Fig. 9). The negative correlations between the reflectance of sloping canopies and the area ratios of the shaded components are also shown. Although the absolute values of the observed reflectance in the TM5 image and the simulated reflectance of GOST are different, the patterns of the angular variations of the two results are similar, particularly in the NIR band. In the red band, the observed reflectance at slopes from $0^{\circ}$ to $10^{\circ}$ has no significant difference from those from $10^{\circ}$ to $20^{\circ}$ because their specific canopy structures are not considered in this experiment. The preamble analysis indicates that the angular variation pattern of the simulated results is compatible with the observed reflectance in theTM5 image (see Fig. 8).


Fig. 9. Simulated four scene components area ratios, red reflectance and NIR reflectance vary with slope and aspect of the terrain by GOST. Slope_5, Slope_15, and Slope_25 are the simulated results of GOST with the slope of the background at $5^{\circ}, 15^{\circ}$, and $25^{\circ}$, respectively.

Fig. 9 also shows that the area ratios of the sunlit foliage and background reach their maximum values, respectively, and the area ratios of the shaded foliage and background reach their minimum values, respectively, at certain angles on the sunlit slope. (The aspect $\phi_{g}$ is about $154^{\circ}$, and the relative azimuth angle between the sun and the sloping background is about $0^{\circ}$.) On the contrary, the area ratios of the shaded foliage and background reach their maximum values and the area ratios of the sunlit foliage and background reach their minimum values at certain angles on the shaded slope. (The aspect $\phi_{g}$ is about $334^{\circ}$, and the relative azimuth angle between the sun and the sloping background is about $180^{\circ}$.) Therefore, the maximum and minimum values of reflectance simulated by GOST in both the red and NIR bands appear on the sunlit and shaded slopes for each canopy, respectively. This result is supported by the observed reflectance of the TM5 image.

Furthermore, sunlight can reach more foliage and background on the sunlit slope and less foliage and background on the shaded slope with the increasing slope. Therefore, the canopy reflectance on the sunlit slope increases with slope due to the increasing area ratios of the sunlit foliage and background. On the contrary, the canopy reflectance on the shaded slope decreases with increasing slope due to the increasing area ratios of the shaded foliage and background. It indicates that the variation of the canopy reflectance at a steeper slope is bigger than those at a gentler slope. Both the area ratios of the four scene components and its corresponding reflectance are minimally affected by the topographic factors when the relative azimuth angle between the sunlight and background aspect $\phi_{s g}$ is about $90^{\circ}$. It is because the topographic factors have the least effects on the area ratios of the four scene components at about
$90^{\circ} \phi_{s g}$. The observed reflectance also supports that bigger and smaller variations of the reflectance are caused by the steeper and gentler slopes, respectively, and the reflectance is minimally affected by the topographic factors at about $90^{\circ} \phi_{s g}$ (see Fig. 8).

The dynamic range of the simulated reflectance is smaller than that in the remote sensing image. This is because 1) the simulation of GOST in this case only considers the topographical variations rather than the variations of canopy parameters, such as LAI and 2) the reflectance of the shaded foliage and background are assumed to be constants in GOST. However, with the support of the observed reflectance in the TM5 image, the simulated results suggest that GOST can capture the major angular variation of the reflectance of sloping canopies.
2) Comparison of the Modeled and MODIS Multiangle Surface Reflectance: In order to further prove the ability of GOST to simulate sloping forest reflectance, an experiment is designed for comparing the simulated multiangle reflectance by GOST with the MODIS surface reflectance. In this experiment, the simulated reflectances with or without considering the topographic factors are compared against MODIS multiangle surface reflectance.

MODIS MOD09GA reflectance data at the $500-\mathrm{m}$ spatial resolution are used for this purpose. A sloping forest location is selected according to slope and aspect maps generated using DEMs downloaded from the U.S. Geological Survey. Cloudfree reflectance values in the red and NIR bands over the course of one month at this location as well as the corresponding solar and view angular data with $1-\mathrm{km}$ spatial resolution are collected for evaluation purposes. The study site is located in Chongqing City, China ( $29^{\circ} 37^{\prime} 18.12^{\prime \prime} \mathrm{N} / 107^{\circ} 22^{\prime} 47.28^{\prime \prime} \mathrm{E}$ ).

TABLE III
Model Inputs for Simulating the Multiangle MODIS Surface Reflectance

| Domain size | 1 ha |
| :---: | :---: |
| Aspect $\left(^{\circ}\right)$ | $89^{\circ}$ |
| Slope $\left(^{\circ}\right)$ | $20^{\circ}$ |
| $\theta_{s}{ }^{\prime}$ | $27^{\circ}$ |
| $\phi_{s}$ | $121^{\circ}$ |
| $\phi_{v}$ | $95^{\circ}$ |
| LAI | 4.5 |
| Tree density | 1440 trees/ha |
| Grouping (m2) | 4 |
| Quadrat size | $125 \mathrm{~m}^{2}$ |
| Ha | 6.0 m |
| Hb | 8.5 m |
| r | 1.0 m |
| $\alpha$ | $45^{\circ}$ |
| $\mathrm{G}(\theta)$ | 0.5 |
| Ws | 0.09 m |
| $\gamma_{\mathrm{E}}$ | 1.1 |
| $\Omega_{\mathrm{E}}$ | 0.8 |
| $\mathrm{R}_{\mathrm{T}}($ red $)$ | 0.06 |
| $\mathrm{R}_{\mathrm{ZT}}($ red $)$ | 0.0001 |
| $\mathrm{R}_{\mathrm{T}}($ nir $)$ | 0.5 |
| $\mathrm{R}_{\mathrm{ZT}}($ nir $)$ | 0.18 |
| $\mathrm{R}_{\mathrm{G}}($ red $)$ | 0.15 |
| $\mathrm{R}_{\mathrm{ZG}}($ red $)$ | 0.0001 |
| $\mathrm{RG}(\mathrm{nir})^{\mathrm{R}_{\mathrm{ZG}}(\text { nir })}$ | 0.25 |
|  | 0.08 |

Pine (Pinus massoniana) is the major conifer species at this study site. Nine cloud-free days from August 1 to 31 of 2011 are selected. The slope is $20^{\circ}$ and aspect is $89^{\circ}$ from the north.

The input parameters of GOST for this sloping canopy are listed in Table III. In fact, it is difficult to give observation data sets exactly for these $250000 \mathrm{~m}^{2}$ ( $500-\mathrm{m}$ spatial resolution) pixels in the remote sensing images. We have made a best guess to determine the model input using common parameter values of forest within reasonable ranges. The same input parameters are used to simulate the reflectance using GOST with or without considering topographic factors. Therefore, the differences of these modeled results are not derived from these input canopy parameters.

Within these nine cloud-free MODIS observations, there exist one kind of combination of the view azimuth angle, solar azimuth angle, and solar zenith angle. The combination is that the view azimuth angles approximately equaling $95^{\circ}$, the solar azimuth angles approximately equaling $121^{\circ}$, and solar zenith angles approximately equaling $27^{\circ}$. The variation of the view zenith angle is from $1^{\circ}$ to $62^{\circ}$. Therefore, with or without considering topographic factors, reflectance values in this plane are simulated according to this angle combination and compared with the MODIS multiangle surface reflectance.

Fig. 10 shows the comparison between the simulated reflectance and MODIS surface reflectance in the red and NIR bands. Generally, the MODIS surface reflectance is closer to the simulated reflectance with considering the topographic factors (slope is $20^{\circ}$ ) than those without considering the topographic


Fig. 10. Simulated multiangle reflectance compared with MODIS surface reflectance at multiple view angles in the red and NIR band. Slope_0 and Slope_20 are the simulated results of GOST with the slope of the background at $0^{\circ}$ and $20^{\circ}$, respectively.
factors (slope is $0^{\circ}$ ). The dynamic range of the simulated reflectance with considering the topographic factors is close to that of the observed results. However, the dynamic range of the simulated reflectance without considering the topographic factors is underestimated in the red band and overestimated in the NIR band. In the red band, the simulated reflectance without considering the topographic factors is also underestimated. However, it is overestimated in the NIR band at large view zenith angles (view zenith angles larger than $30^{\circ}$ ). The simulated reflectance with considering the topographic factors appears within reasonable ranges. However, there are still slight differences between the simulated reflectance and MODIS surface reflectance after considering the topographic factors. This can be related to inexact angular matching between the model and the observation, and the approximation of the complex topographical variations within the $500-\mathrm{m}$ pixels with 2-D (smooth and extensive) slopes. This comparison further confirms the ability of GOST in simulating the multiangle reflectance of sloping canopies.

## IV. Conclusion

Based on the four-scale GO model developed for flat terrains, the GOST model in this study is developed to describe the effect of the sloping canopy structure on the reflectance. The following conclusions are drawn from this study.

1) GOST is able to simulate the gap fraction and the ratios of the four scene components (sunlit and shaded canopy fractions and sunlit and shaded background fractions) on sloping terrains. The simulation compares well with the 3-D virtual canopy using a computer graphics technique.
2) GOST provides a useful tool for analyzing remote sensing images over complex terrains. It considerably improves the simulated reflectance in a mountainous area after considering the topographic factors. Model


Fig. 11. Projection area $t_{a c t}$ in the sunlight or viewer directions. $t_{a c t}$ is in the top part of the "cone + cylinder." $A\left(x_{a}, y_{a}\right), B\left(x_{b}, y_{b}\right)$, and $D\left(x_{d}, y_{d}\right)$ are used for calculating projection area $t_{\text {act }}$.
evaluations against Landsat and MODIS observations demonstrate that the simulated reflectance of GOST over sloping terrains does not have obvious systematic biases. The evaluation against MODIS data also suggests that GOST can simulate multiangle reflectance on sloping forests.
Although it can be improved to include a within-canopy multiple scattering scheme, GOST presented here already has a unique ability to model the bidirectional reflectance distribution of vegetation over sloping terrains. It can also be a useful tool for retrieving canopy parameters using remote sensing images on complex terrains.

## Appendix <br> $t_{a c t}$ Geometry

Projection area $t_{\text {act }}$ can be computed by integrating twice from the ellipse to segment $\overline{B D}$ from 0 to $y_{d}$ (see Fig. 11). Thus

$$
\begin{align*}
t_{a c t}= & 2 \int_{0}^{y_{d}}\left(\frac{y-b_{B D}}{m_{B D}}-\frac{x a}{r} \sqrt{r^{2}-y^{2}}\right) d y \\
= & 2 x_{b} \cdot y_{d}-\frac{y_{d}^{2} \cdot \sqrt{x_{b}^{2}-x_{a}^{2}}}{r} \\
& -\frac{x_{a}}{r}\left[y_{d} \cdot \sqrt{r^{2}-y_{d}^{2}}+r^{2} \cdot \arcsin \left(\frac{y_{d}}{r}\right)\right] \tag{23}
\end{align*}
$$

where $b_{B D}$ is the intercept of segment $\overline{B D}$, and $m_{B D}$ is the slope of segment $\overline{B D} . x_{a}, x_{b}$, and $y_{d}$ can be calculated as follows:

$$
\left\{\begin{array}{l}
x_{a}=r \cdot \cos \left(\theta_{v}^{\prime}\right)  \tag{24}\\
x_{b}=r \cdot \sin \left(\theta_{v}^{\prime}\right) / \tan (\alpha) \\
y_{d}=r \cdot \frac{\sqrt{x_{b}^{2}-x_{a}^{2}}}{x_{b}}
\end{array}\right.
$$

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