

## 1      **Forest Stand Height Estimation using Inversion of RVoG 2      Model over Forest of North-Eastern India**

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12     **Abstract.** Multiple studies have been carried in recent years to estimate forest  
13     height using remote sensing techniques. The forest height is an essential forest  
14     resource parameter that is usually used in biomass estimation contributing to car-  
15     bon sequestration studies. Polarimetric Interferometric SAR (PolInSAR) is a re-  
16     mote sensing technique that combines SAR Polarimetry (PolSAR) with SAR In-  
17     terferometry (InSAR) and has demonstrated tremendous ability for forest height  
18     extraction as it is sensitive to the vertical arrangement of the scattering media. In  
19     this paper, we examine the Random Volume over Ground (RVoG), the polari-  
20     metric canopy scattering model, for the forward modeling, and the three-stage  
21     inversion (TSI) for retrieving vegetation stand height. We investigate the perfor-  
22     mance of the inversion algorithm for forest height estimation using single base-  
23     line L-band ALOS-2 PALSAR data collected on December 17, 2018, and De-  
24     cember 31, 2018, over the Saipung Reserve Forest, Meghalaya, over North-East-  
25     ern India. Correlation between the field measured forest height, and the estimated  
26     tree height using the TSI technique is 0.81 with RMSE of 5.05 m. The study  
27     suggests that the PolInSAR approach has significant potential for retrieval of for-  
28     est biophysical parameters such as stand height.

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30     **Keywords:** Synthetic Aperture Radar (SAR), Forest Height Estimation, Polari-  
31     metric Interferometric SAR (PolInSAR)

### 32     **1      Introduction**

33     Vegetation parameter estimation (using remote sensing techniques), at large scale, is  
34     very critical to perform ecosystem modeling effectively and to address essential science  
35     questions related to climate change, global warming, etc. [1]. In this short paper, we  
36     showcase an algorithm based on single-baseline Polarimetric SAR Interferometry  
37     (PolInSAR) to retrieve one of the vital vegetation parameters, viz., the canopy height.

38 PolInSAR combines the utilities of two SAR technologies: Polarimetry and Interferometry. PolSAR (Fully Polarimetric Synthetic Aperture Radar) provides the three complex scattering matrices at each image pixel, which provides insight into the structural information of the scatterer (geometry, shape, and dielectric constant). InSAR (Interferometric SAR) leads to interferogram generated out of SAR images acquired with an appropriate baseline (spatial or temporal). A common problem for all estimation techniques emerges from the nature of the scattering process. In terms of the interferometric observables, it does not provide an effective separability of the physical forest parameters. This limits a straightforward parameter estimation and requires the inversion of a scattering model, which relates the interferometric observables to the physical parameters of the scattering process [2, 3]. This is where combining PolSAR with InSAR becomes advantageous. In this paper, we examine the Random Volume over Ground (RVoG), the polarimetric canopy scattering model, for the forward modeling, and the three-stage inversion (TSI) for retrieving vegetation stand height. This inversion also estimates other forest parameters such as canopy extinction, ground-to-volume amplitude, and ground topographic phase [4].

54 The study was conducted in Saipung Reserve Forest, East Jantia Hills district  
 55 (25°11' E to 25°18' E Latitude to 92°34' N to 92°52' N Longitude) covers 144 km<sup>2</sup>,  
 56 located in Meghalaya, a state situated in the north-eastern corner of India.

## 57 2 Methodology

58 A realistic scattering model has to consider both the vegetation layer and ground interactions in the case of forest scattering at L-band. A standard model to describe such a scenario is the Random Volume over Ground (RVoG) scattering model [3]. This model containing six unknown parameters is optimally inverted using the three complex coherences from the monostatic PolInSAR system, viz.,  $\tilde{\gamma}_1$ ,  $\tilde{\gamma}_2$ , and  $\tilde{\gamma}_3$ . In this model, the vegetation layer is modeled as a layer of thickness  $h_v$  containing a volume with randomly oriented particles and scattering amplitude per unit volume  $m_v$ . This cloud of particles is located above a ground scatterer with scattering amplitude  $m_g$ . The complex interferometric coherence  $\tilde{\gamma}$ , after range spectral filtering, written as [5, 6],

$$67 \quad \tilde{\gamma}(\omega) = e^{j\phi} \frac{\tilde{\gamma}_v + m(\vec{\omega})}{1 + m(\vec{\omega})} \quad (1)$$

68  
 69 Where  $\vec{\omega}$  is a unit vector that describes the polarization,  $\tilde{\gamma}_v$  is the volume coherence,  
 70  $\phi$  is the phase related to the ground topography, and  $m$  is the effective ground-to-volume  
 71 scattering ratio.  $\tilde{\gamma}_v$  is defined as [5, 6],

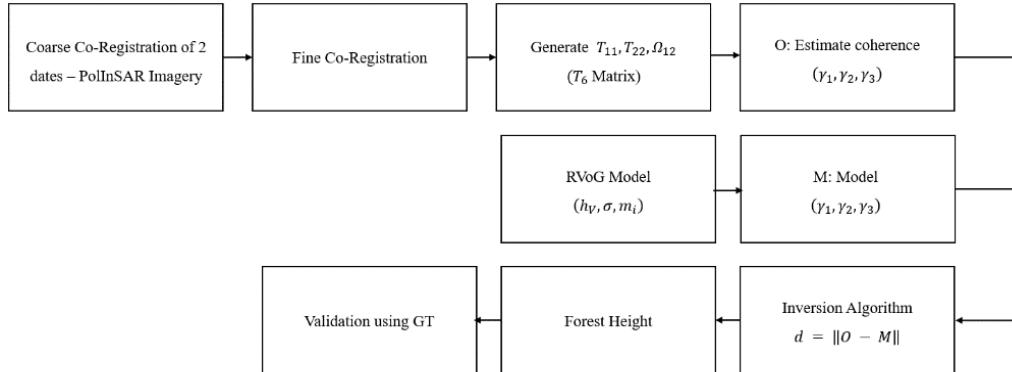
$$\tilde{\gamma}_v = \frac{I}{I_0} \begin{cases} I = \int_0^{h_v} \exp\left(\frac{2\sigma x}{\cos\theta_0}\right) \exp(i\kappa_z x) dx \\ I = \int_0^{h_v} \exp\left(\frac{2\sigma x}{\cos\theta_0}\right) dx \end{cases} \quad (2)$$

72

73 Where  $\sigma$  is the wave mean extinction,  $\kappa_z$  is the vertical wavenumber, and  $\theta_0$  is the  
74 mean incidence angle.

75 Inversion on Equation (1) involves taking observations of the complex coherence at  
76 several different polarizations and minimizing the difference between the model pre-  
77 dictions and observations in the least square manner. Three-stage Inversion (TSI) fol-  
78 lows three stages, according to [4] is (1) Least square line fitting, (2) Vegetation bias  
79 removal, and (3) Height Estimation. The end-to-end workflow of the forest height esti-  
80 mation technique is given in Fig. 1.

81



82

83 **Fig. 1.** PolInSAR processing flow for the forest height retrieval using RVoG model

84 For this analysis, a pair of fully polarimetric ALOS-2 PALSAR data is procured over  
85 the Saipung forest region of Meghalaya state in North-East India. We follow the meth-  
86 odology outlined in Fig. 1. The pre-processing involves co-registration of the two Pol-  
87 SAR imagery, up to sub-pixel level accuracy. The complex coherences are estimated  
88 for the PoInSAR data and plotted on the complex plane. To invert the model, the three-  
89 stage strategy introduced earlier is employed.

### 90 3 Results and Discussion

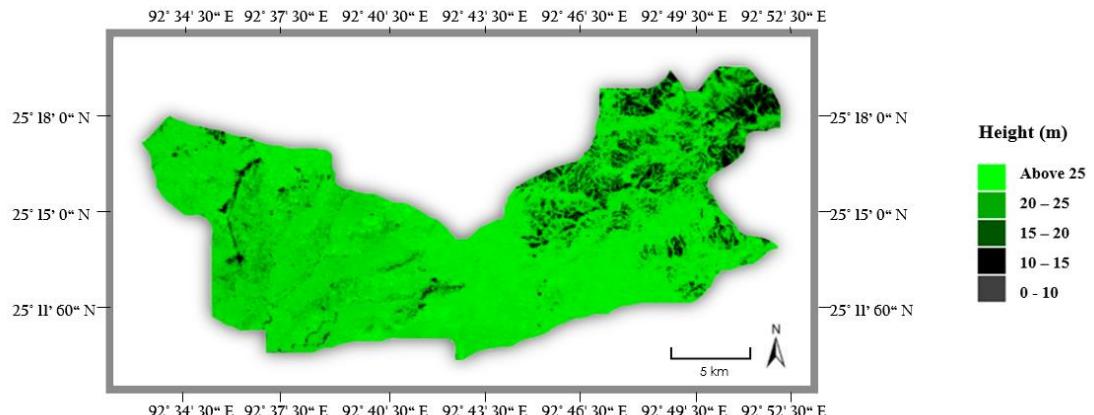
91 The results of TSI are shown in Table 1 for a subset of ground truth points. It shows the  
92 estimated height for different field locations in meters collected during the December  
93 2018 expedition to the national reserve forest (carried out through the Principal Chief  
94 Conservator of Forests, Meghalaya). It is clear from the table that TSI performs well

95 for our study area with enough sensitivity to the low and high end of the vegetation  
 96 stand height.

97 **Table 1.** Estimated height in meters for the study area  
 98

Lat	Long	Field Height (m)	Retrieved Height (m)
92.74064	25.352757	24	24.76
92.74287	25.34275	27	28.88
92.74774	25.39293	4.3	6.4
92.7491	25.38815	6.1	6.36
92.70664	25.34185	14.6	13.94
92.72391	25.32471	21.2	21.01
92.71197	25.32915	24.4	19.45
92.64638	25.41916	20	21.08
92.63165	25.31202	11.8	4.75
92.64669	25.2713	8.7	5.72

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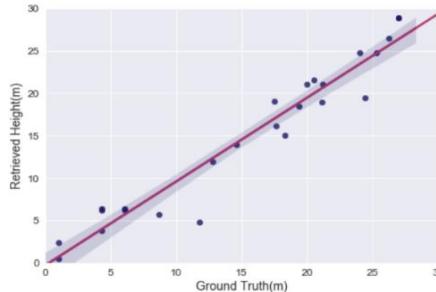


100

101 **Fig. 2.** Saipung Reserve Forest height map derived using the PolInSAR based technique outlined  
 102 in the paper. It shows the sensitivity of retrieval to the varying height zones of the reserve forest.  
 103

104 The algorithm has been run for the whole study area to prepare the height map. Fig.  
 105 2 shows the forest stand height map for Saipung Reserve Forest over the North-Eastern  
 106 part of India. As can be seen, most of the reserve forest is quite dense with average  
 107 height shooting above 25 m.

108 This research's primary purpose is to estimate forest height from the PolInSAR in-  
 109 version. A regression analysis was carried out to appraise the accuracy of the TSI  
 110 method. For this, we use the ground truth data of field-measured height, some of which  
 111 were already shown in Table 1. The correlation coefficient between estimated and field-  
 112 measured tree height is 0.81 for three-stage inversion. It indicates that the modeled  
 113 height provides a statistically significant relationship with the field measured height.



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116 The RMSE of the retrieval is found to be approximately 5 meters. This is in agree-  
 117 ment with other studies reported in the literature using single-baseline PolInSAR. This  
 118 figure can be improved by using multi-baseline techniques or using more sophisticated  
 119 canopy scattering models.

120

## 4 Conclusions

121 In this work, PolInSAR forest height estimation is established from the L-band dataset  
 122 acquired from ALOS-2 PALSAR system. The RVoG canopy scattering model and the  
 123 three-stage inversion have been implemented (Python 3) to estimate vegetation stand  
 124 height. This study suggests that the PolInSAR technique has significant potential for  
 125 retrieving forest biophysical parameters such as stand height, and can substantially aug-  
 126 ment the biomass estimation over areas like reserve forests where accessibility for field  
 127 data collection remains difficult.

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