

3Review of « A generalized photon-tracking approach to simulate spectral snow albedo and transmissivity using X-ray microtomography and geometric optics », by Theodore Lechter et al.

General comments

This paper describes a novel approach to extract relevant snow optical properties, namely the mean fractional ice path, extinction coefficient and phase function, from X-ray microtomography samples. Using these optical properties, a plane-parallel Monte-Carlo radiative transfer model is run to simulate the reflectance and transmittance of a multi-layer snowpack. This blended model is first applied to a single layer ideal snowpack, and then to a real, layered snowpack that was probed on 12 February 2021 at Union Village Dam in Thetford, Vermont. For this snowpack, along with the snow samples, spectral reflectance measurements were performed above the snowpack, including measurements with a black panel inserted at 2.5 and 4.75 cm below the surface. This model reproduces the expected sensitivity of transmittance and reflectance to snow SSA, as well as the strong anisotropy of snow reflectance. The comparison between simulated and observed reflectance is satisfactory, although large discrepancies remain in the near-infrared, which are attributed to deficiencies in the estimation of the phase function.

The paper is well written and the figures are clear. The topic perfectly fits in the scope of The Cryosphere, and estimating local optical properties from X-ray microtomography snow samples is certainly a question that deserves more research. The development of a new approach and its tentative validation with in situ measurements is a great contribution to tackling this question. In that sense this paper contains sufficient original material to be considered for publication. However, several critical issues remain, mostly regarding the estimation of snow optical properties, that preclude accepting the paper before major revisions are performed. The experimental validation step is not very convincing yet, and the discussion does not sufficiently dwell on the obvious limitations of the present study. As a result, the reader is left with poor confidence that the proposed model can reliably simulate snow optical properties, including transmittance which is the focus of the paper but is not supported by any experimental validation.

Specific comments

1) The phase function of the snow is estimated by first isolating individual snow grains, and using a ray-tracing code to estimate their single-scattering properties. Although there is probably no easy way to estimate the local phase function of a bicontinuous medium, this approach is very questionable. First there is no evidence that a snow sample can be separated into individual grains without making very arbitrary choices. Think for instance of old snow that resembles more a porous medium than an ancient collection of individual snow particles. Second, the number of such grains to be selected is not discussed while it is clearly a limitation of the approach. The approach proposed by Xiong et al. (2015) to estimate the phase function of a bicontinuous medium is more aligned with the strategy used to estimate the extinction coefficient, and could probably at least be compared to the current approach. Approaches used in other disciplines (scattering in any porous medium) may also provide interesting alternatives (see for instance Haussener et al., 2012). In addition, it would be great to provide the values of the asymmetry parameter computed for the estimated phase functions,

which would allow comparison with usual assumptions made on this hardly measurable quantity.

Response: We agree that the grain segmentation process and selection of individual grains to be included in the phase function sampling can be subjective. Upon further consideration and reflection and in response to comments from the other reviewer, we have decided to take your advice and use an approach more similar to Xiong et al. 2015 and Haussener et al. 2012. This approach better utilizes the intact snow sample representation allowed by X-ray microtomography. In this approach, which we refer to as the localized phase function, the phase function is computed through ray-tracing by binning the reflected and scattering angles at each air/ice boundary, and then integrating the binned power to get the phase function (i.e., equation 12 in this paper). Note that this method assumes a perfectly flat surface at the ice-air or air-ice boundary and ignores the aggregated effects of internal reflections within a particle on directional scatter. Since we are no longer computing the phase function for individual grains (i.e. the whole particle phase function method), we have cut figures 1 & 2 from the paper, and the text surrounding grain segmentation. Overall, this change substantially improves our results when compared to observations. We believe this is due to an increase in forward scattering over the previous computation method. We also note that the newly computed phase functions compare well to the “P11” functions shown in Xiong et al. 2015 and Haussener et al. 2012.

This localized phase function approach also helps to address comment #3 regarding the use of F_{ice} . In considering both the phase function and the extinction coefficient as determined by intersections with particle facets, rather than whole particles, we believe our approach of continuously depleting energy across the fixed distance is consistent with the larger model framework as the distance traveled each model integration is consistent with the distance between air/ice interfaces, rather than the distance between individual particles. This is addressed in more detail in the response to comment #3.

In response to your final comment here, our asymmetry parameters for rendered grains were lower than is often reported in the literature (generally between 0.6-0.7), however our values for the idealized rendered spheres and hexagonal plates were consistent with previous literature (e.g., 0.89 for a sphere with a size parameter of 1000).

2) A method is proposed to estimate the extinction coefficient of snow from the 3D images, which is based on sampling the probability to be scattered or absorbed when traveling a certain distance from a variety of locations chosen randomly. This strategy seems acceptable, but does not reproduce the dependence of γ_{ext} on SSA and density ρ expected for a collection of individual convex particles, that is $\gamma_{ext} = \rho \cdot SSA / 2$. This simple relation has been used in recent, similar, studies, though

(Malinka, 2014, Picard et al., 2016). Although this deviation from the expected behavior is already seen in the original paper by Xiong et al. (2015) (their figure 4c), it should be further investigated. For instance it would be worth checking that the present strategy reproduces the expected dependence in the case of a collection of spheres. If it were carefully confirmed that in real snow the relation $\gamma_{\text{ext}} = \rho \cdot \text{SSA} / 2$ does not hold, this would be an important result. Not also that Figure 14 should be recomputed, looking for a correlation between γ_{ext} and the product $\rho \cdot \text{SSA}$.

Response: This is an excellent comment and brings up an interesting issue which we had not considered. First, we have made a couple of minor adjustments to the curve fitting code to attain better curve fits for γ_{ext} , so the values are a little different, but still not consistent with $\rho \cdot \text{SSA} / 4$ (no diffraction). We had chosen to estimate the extinction coefficient following Xiong et al. 2015 to simply extend their approach from a 2D medium to a 3D rendered sample. In this approach, photons are initialized at random throughout the sample, both within and outside of the ice. Xiong et al. noted, without any further explanation, that this approach allowed for the inclusion of the microstructural features of the medium in the computation of γ_{ext} . We had not considered that this approach might not produce the $\gamma_{\text{ext}} = \rho \cdot \text{SSA} / 4$ relationship, which implies that the incident radiation is initialized outside of a particle (i.e., the geometric scattering cross section is simply the particle projected area). Accordingly, Xiong et al. does not reproduce the $\gamma_{\text{ext}} = \rho \cdot \text{SSA} / 4$ either (they also ignore diffraction).

To test this, we computed γ_{ext} following the Xiong et al. method applied to a collection of spheres with specified SSA and density, and found that these computed values match closely to the values of Xiong et al. (e.g., 4.58 mm⁻¹ vs. 4.66 mm⁻¹ for SSA = 32.7 and ρ = 250 and 960 mm⁻¹ vs. 940 mm⁻¹ for SSA = 6.54 and ρ = 250), suggesting that this specific method for computing the extinction coefficient is more responsible for the deviation from the expected relationship, rather than particle shape.

We further tested this by computing solid and air chord lengths for the spherical particle meshes via random ray sampling and estimated γ_{ext} following Malinka et al. 2014, since this expression for γ_{ext} is in part derived from the $\gamma_{\text{ext}} = \rho \cdot \text{SSA} / 4$ relationship. This resulted in γ_{ext} much closer to the $\rho \cdot \text{SSA} / 4$ relationship (e.g., 0.48 mm⁻¹ for SSA = 6.5 and ρ = 250, as compared to 0.96 mm⁻¹ following Xiong et al.). This discrepancy (i.e., tendency towards higher extinction coefficients) may help address your comment on F_{ice} and continuous absorption, since the extinction coefficient tends to higher values using the Xiong et al. method due to the particle initialization scheme.

We are aiming to add the following discussion on this point to a revised manuscript:

“Foundational work on light scattering in a collection of weakly absorbing particles indicates that, ignoring diffraction, γ_{ext} is given as $\gamma_{\text{ext}} = \rho \cdot \text{SSA} / 4$ (e.g., Van de Hulst, 1957, Kohkanovsky, 2004). This is substantially different than the relationship found between γ_{ext} , SSA and ρ illustrated in figure 14. We speculate that this is because the method for

determining γ_{ext} described in Xiong et al. (2015) and extended into three-dimensions here, initializes particles randomly throughout the sample which relaxes the assumptions regarding particle projected area implicit within the $\gamma_{\text{ext}} = \rho \cdot \text{SSA}/4$ relationship.”

Finally, we have taken your suggestion and computed the correlation between γ_{ext} and the product of ρ_{snow} and SSA for Figure 14, and have obtained substantially cleaner results. Thank you for an excellent suggestion. The written and visual results are now much cleaner and understandable.

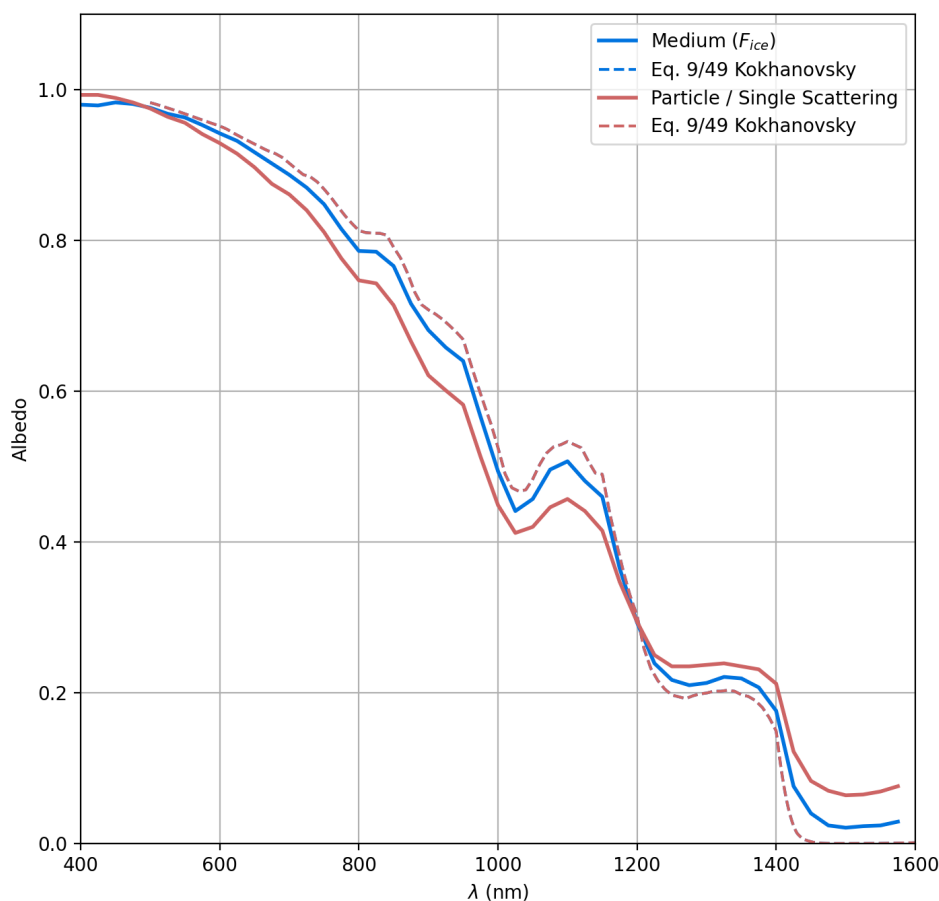
3) To my knowledge, the use of the mean fractional ice path F_{ice} is quite unique to this study. Generally, the medium is instead represented by its absorption efficiency, or equivalently by its single-scattering albedo. In Eq.18, the energy of the photon packet is decreased along the path s due to absorption within the ice. However the distance traveled in the snow is underestimated when using a continuous representation, because the distance l_{ext} between scattering (or absorption) events is less than the actual distance traveled, which should include internal reflections not accounted for in l_{ext} (see Malinka 2014). As a consequence I believe (this has to be verified) absorption is overall underestimated with the present method. This can be easily corrected by carefully taking into account internal reflections (as is made for the estimation of F_{ice}). Hence I'd encourage the authors to compare their approach to a more standard one based on single-scattering albedo (in which case absorption is seen as a probabilistic localized event rather than a continuous process). This would help validate the F_{ice} approach or point to fundamental and critical differences between both approaches. Also, it should be physically explained why a linear relation is expected between ρ and F_{ice} .

Response: This is another interesting comment, and while we cannot be certain that we are under-representing the distance traveled within ice, we think that F_{ice} is correct in this specific context. We believe that the justification for the use of F_{ice} is partially provided in the responses to comments #1 and #2. From comment #1, when using a localized scattering perspective (as is done in Xiong et al. / Haussener et al.), the scattering direction is determined by scattering at an air/ice boundary, rather than a particle, which characteristically increases scattering in the forward direction over that of scattering computed for a specific particle shape. Additionally, the Xiong et al. method for computing the extinction coefficient generates extinction coefficients that are broadly greater than those estimated by $\rho \cdot \text{SSA}/4$. It is tricky to understand exactly why this is the case, but we suspect that it is due to the snow “particle” perspective from which $\rho \cdot \text{SSA}/4$ is derived as compared to the semi-random two-phase medium used by Xiong et al. We speculate that combined with these approaches, the use of F_{ice} is appropriate here.

To support this assertion, we performed a sensitivity simulation for a collection of spheres with $d=0.6$ whereby we used an estimated single scattering albedo through ray-tracing following Grundy et al.: $\text{Single_Scat} = 1 - \text{absorbed/total}$. We combined this with an analytic extinction coefficient of $\rho \cdot \text{SSA}/4$, and the phase function of a sphere at 1000nm. We used

these optical properties to run the medium model to get spectral albedo, and compared that to the method that uses the extinction coefficient from Xiong et al. and F_{ice} with continuous absorption (see results in figure below). Note that in this method, the phase function is localized as in Haussener et al. 2012 / Xiong et al. 2015. While not exact, these methods produce results that are generally close to eqs. 9/49 from Kokhanovsky and Zege 2004. We suspect that localizing the phase function helped make the methods for generating the optical properties consistent with each other, and the medium model, and that our earlier more substantive differences can be traced to this.

Finally, we note that a linear relationship between ρ and F_{ice} is a good approximation, at least for densities greater than 150 kg m^3 . The simplest physical explanation for this is that as density increases, there is simply more ice available for the photon to travel through. Assuming, that the proportion of internal reflections taking place throughout the sample is similar across the samples, then one would expect a generally linear relationship with density. This fits with the equation you've provided that relates F_{ice} , density, and B .



4) Related to the previous point, I stress that some work has been focused in the past decade on the estimation of the absorption enhancement parameter B of snow (Libois et al., 2013, 2014, 2019), which is actually directly related to the proposed definition of F_{ice} . Estimations of B from the joint values of F_{ice} and ρ provide results quite different from those obtained elsewhere, which at least

deserves comments, if it does not help pointing to deficiencies of the present study. Although this could in itself form relevant material for an independent, complementary study, it appears necessary to at least clarify this point.

Response: This is a great comment and we have additionally responded to a similar technical comment below. We hypothesize that our results aren't actually significantly different than the results elsewhere, but rather the apparent discrepancy is associated with the non-linear relationship between F_{ice} and B and photons that do not accurately sample the snow sample during the ray-tracing algorithm. For instance, a track that interacts with only a single particle and then exits the sample after some internal reflections, F_{ice} approaches 1, as compared to a track that traverses many grains yielding an F_{ice} value that is more consistent with the sample density. Further, because B is a non-linear function of F_{ice} , any shift towards higher values of F_{ice} due to these odd tracks would lead to a much larger than expected B parameter. If, we instead compute B from Equation 4 in Libois et al. 2019, instead of from F_{ice} and density, we obtain values generally between 1.2 and 1.6. We agree that a deeper dive into looking at how B varies with F_{ice} for different snow samples and types would make for an interesting complementary study.

5) The paper tries to differentiate from previous similar studies by focusing on transmissivity, in complement to more widely explored reflectance properties. However, only a few observations (practically, 3 reflectance spectra) are used to validate the model, which do not correspond to the primary focus of the work. Since these measurements are not very well simulated (compared for instance to those reported by Carmagnola et al., 2013), it does not give confidence in the transmissivity simulations, in particular in the near-infrared. We also note that in the visible some differences remain that could be partly explained by the presence of light-absorbing impurities, which is not really discussed.

Response: We have spent considerable time and effort in reframing the paper to include more observational comparisons. We had initially chosen to limit this evaluation to keep the paper length manageable and focused on introducing the framework. However, reworking the model phase function (see comments #1 & #3) and eliminating the grain segmentation, has substantially shortened the methods section which allows for a greater focus on observations. Further, the results obtained with a localized phase function computation more like the Xiong et al. method produces substantially more accurate results in the NIR. Finally, we have recast some of the wording to indicate less of a focus on transmissivity than the initial manuscript, while retaining an analysis and discussion on transmissivity.

Lastly, the snow was clean and free of contamination. Specifically, we can say with some confidence that the snow was not contaminated with dust or black carbon, which is clear in the measured visible spectrum.

6) One of the main problems of this paper is that it lacks a proper, critical discussion. In the current version the discussion is 15 lines long and does not really question the whole results of the paper. I'm convinced that given the uncertainties arising from the chosen method to estimate local optical

properties, the issues related to the spatial representativity of the very small samples, and the very limited number of observations that unsuccessfully try to support the model, a much longer discussion would be very useful.

Response: In light of many of the larger issues that you brought up in your thorough review, we have made large changes to the paper, including in the scope, methods, and focus. Accordingly, we have included a more robust discussion to better contextualize our results and uncertainties with some of the suggested literature. Including discussion on the relationship between F_{ice} and the B parameter, the relationship between p^*SSA and γ_{ext} as compared to the relationships discussed in Kokhanovsky and Zege 2004, and sample representativeness of the snow layers.

Technical corrections

I.3 : “based on X-ray microtomography” is unclear → “reflectivity of snow samples based on X-ray microtomography images ?

Response: Updated to “*reflectance of snow based on X-ray microtomography images,..*” as suggested.

I.6 : is really the focus more on transmissivity than albedo?

Response: See response to Specific Comment #5 above for further details. We have reworded this sentence to “... *this study’s effort is focused on simulating reflectance and transmittance in the visible and near-infrared (NIR) through thin snowpacks...*”.

I.7 : sub-nivean hazard detection is mentioned in the abstract but not later on

Response: We thank the reviewer for pointing this out. As this is not a focus for this particular paper, we have removed it from the abstract. However, we briefly link this application to the 5% transmissivity contours shown in Fig 12 in the discussion.

I.8 : should snow grain size be replaced by SSA? Because the advantage of having 3D images of snow samples is to get rid of the simple, unrealistic, granular approach

Response: We have replaced grain size with SSA.

I.10 : not clear whether in the field transmissivity and/or reflectivity measurements were performed

Response: We only refer to the reflectance data in the results and so have updated the text here to specify that.

I.13 : “is limited to the top 5 cm” and “can penetrate” is awkward. Transmissivity is a property. Should be rephrased.

I.14

Response: We agree and have rephrased to make the point more clear. “...*indicate that snow transmittance is greatest in the visible wavelengths, limiting light penetration to the top 5 cm of the snowpack for fine grain snow but increasing to 8 cm for coarse grain snow.*”

I.15 – 15 : I think this result is quite obvious. Maybe consider providing another more specific result.

Response: We agree and have replaced this sentence with the following: “*These results suggest that the 5% transmission depth in snow can vary by over 6 cm according to the snow type*”

I.28 : “aggregate” is unclear

Response: While we were referring to spatially-averaged, we believe that is implied and have simply removed the term.

I.42 : to state that geometric optics works well some hint should be given about the typical size of scatterers in snow (or referring to a paper stating why it works well)

Response: We have modified this sentence to read:

“The scattering of visible and NIR light in snow is well approximated with the geometric optics approximation because snow particles are much larger than wavelength (e.g., Kokhanovsky and Zege, 2004).”

I.43 : I think the interaction between a “snow particle” and light is far from being well understood. Because we essentially don’t know what a snow particle is. Consider rephrasing the sentence.

Response: We have rephrased this to: *“While the physics behind scattering and absorption are well understood for the geometric optics limit, ...”*

I.47 : Here Mie theory is mentioned which seems to contradict the fact that geometric optics is used. Outside of the Mie regime, using a Mie code is probably useless.

Response: We have clarified this sentence to state that, as a simplification, snow is often represented as a collection of spherical particles and that Mie theory is used to determine the albedo in this case.

I.49 : I’d say that Mie theory CAN ONLY BE (by definition) applied to spherical particles

Response: We agree and have reworded these sentences to make that assertion clearer.

I.53 : please double-check that the errors highlighted by Dang et al. (2019) indeed result from the spherical hypothesis, and not from the two-stream approximation

Response: Thank you for calling our attention to this. Since we cannot confidently parse out the source of error in Dang et al. (2019), we have removed this sentence and instead focus on the variation in single scattering properties with grain shape as noted by Ishimoto et al. (2018) and reference additional studies attributing errors to the spherical assumption (Picard et al. (2009), Libois et al. (2013), Neshyba et al. (2003)).

I.59 : Is it similar to the approach of Malinka (2014), which could then be cited as well?

Response: We did not cite Malinka (2014) here as our focus was on previous ray tracing studies and Malinka (2014) uses a stereological approach. We will specify this at the beginning of that paragraph and plan to mention Malinka and several other studies in additional text in the introduction.

I.62 : I’m not sure in Dumont et al. (2021) they used ray-tracing on numerical samples to simulate optical properties.

Response: The editor has requested that we include this reference here.

I.65 : I'd encourage the authors to use reflectance/transmittance (the measured quantity) or transmissivity/reflectivity (the material property), but not a mixture of both.

Response: Thank you for pointing out the inconsistency. We have adjusted our text to use reflectance/transmittance.

I.72 : I understand that the main difference of this study with the previous ones upon which it builds is the special focus on transmissivity. If it's the case, consider being even more specific on this point.

Response: See response to Specific Comment #5 above for further details.

I.75 : what does "semi-quantized" mean?

Response: The phrase "semi-quantized" is in reference to the fact that the model tracks individual photon packets in a quantized method, however it uses a continuous depletion of energy through $F_{ice: Absorbed} = 1 - \exp(-K_{\lambda} s F_{ice})$.

I.89 : "RT through non-spherical properties" is unclear. Do you mean to simulate single scattering properties of such particles?

Response: Yes, we are referring to single scattering properties of non-spherical particles. We have updated the text to clarify.

I.83 : again, is the reference to Dumont et al. (2021) appropriate?

Response: Again, the editor has requested that we include this reference here.

I.90 : remove "medium"

Response: Removed, thank you.

I.92 : how does this resolution compare with previous studies? Is it estimated to be sufficient to represent small-scale snow features that can have an impact on snow optical properties?

Response: Other snow optical studies that have employed micro-CT data (Donahue et al., 2021; Ishimoto et al., 2018; Gergley et al., 2013; Kaempfer et al. 2007) have used voxel resolutions ranging from 7 to 175 microns, depending on the minimum grain size being imaged in the study, 0.025 mm to 0.5 mm in the case of previous studies. The grain size of the smallest samples we collected was estimated to be between 0.25 and 0.5 mm as determined from measurements of grain sizes made in the field using a hand lens and standard grain size measurements. Based on these estimates of grain size made in the field with the hand lens, the resolution of the micro-CT, at 20 microns, is roughly on the order of 10 times (12.5 times) the linear size of the minimum grain size we are imaging. We used the commonly employed Nyquist sampling criterion, which requires a minimum of 2.3 pixels per linear feature, to determine that the resolution was sufficient for the grain sizes we had sampled. The Donahue et al. 2021 study used the same resolution for grain sizes similar to our study (the authors also used the same make and model micro-CT, a Skyscan 1173, that we use).

I.92 : does “1D” mean plane-parallel, that is horizontally homogeneous layers? Maybe clarify this

Response: Yes, we have clarified.

I.99 : Doesn't the 1D model need single-scattering albedo ω ? Would it be more appropriate to introduce first the 1D model (reverse 2.1 and 2.2) to highlight what properties are needed? Maybe consider to make the link between F_{ice} and ω as follows (valid for weakly absorbing media):

$F_{ice} = B \cdot \rho / (\rho_{ice} + (B-1)\rho)$, where B is the absorption enhancement parameter (see Libois et al., 2019)
And $1 - \omega = 2Bk / (\rho_{ice} SSA)$ (Picard et al., 2016)

Response: We do not think that the medium model needs single scattering albedo since energy is depleted using F_{ice} , and not a medium absorption coefficient. There is some nuance in computing the B parameter directly from the mean F_{ice} and the sample density (see responses to other comments) that makes it difficult to estimate single scattering albedo directly from F_{ice} as described above. However, we can estimate the single scattering albedo directly from the ray-tracing following Grundy et al. 2000. That said, because the Xiong et al. method for estimating the extinction coefficient yields substantially different γ_{ext} than the $\rho \cdot SSA / 4$ (see responses to other comments), the single scattering albedo estimated from following the above equation would be inconsistent with this framework.

I.102 : unclear. Should it be the distance between extinction events (which can either be scattering

or absorption)? And the relation is simply the inverse, no? Could you use there the more straightforward expression of extinction coefficient as density \times SSA / 2 (depending on whether you include diffraction or not in scattering). See for instance Malinka (2014).

Response: We have reworded this sentence to be the following:

“In considering a photon of light traveling through the snow medium along a path, the photon is considered extinct when it intersects and is scattered along an air/ice boundary or is absorbed within the ice. The extinction coefficient is then inversely proportional to mean distance traveled between these scattering and absorption events.”

I.115 : could you comment on this wavelength dependence. Is it a default of the method, or something expected?

Response: It's a default of the method (see Xiong, et al. 2015), and we expect it since the extinction coefficient includes both scattering and absorption events. However, in practice, there is no wavelength dependence until $\sim 1300\text{nm}$ when the ice absorption coefficient is larger. This fits with the weakly absorbing particle assumption that yields $\gamma_{\text{ext}} = \rho_s \cdot \text{SSA}/2$ (i.e., no wavelength dependence).

Eq. (4) : typo sign error; also, sin and cos should not be italic (same think throughout the paper)

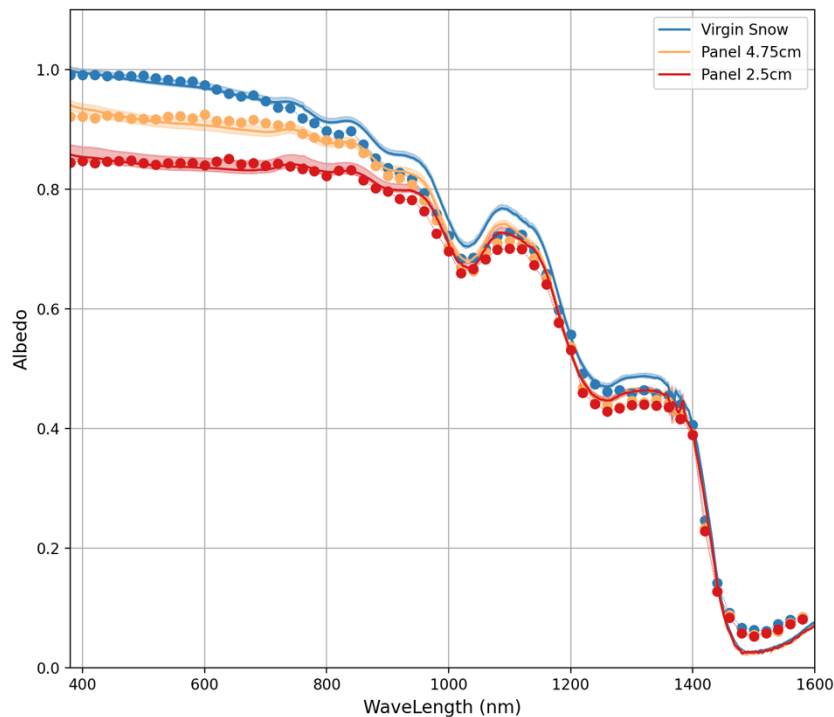
Response: We corrected all, thank you.

I.137 : add v_r and v_t in parentheses here, and remove the end of the sentence I.141

Response: Thank you for pointing this out, we have edited as suggested.

I. 142 : this sounds very awkward to mention individual snow grains here, while the advantage of working with X-ray microtomography images is to get rid of the particular representation of snow. Also, it is obvious that isolating grains from such an image is very arbitrary and isolated grains can behave very differently than the same grains being slightly sintered. Definitely it's not tricky to define the phase function of a porous medium based on local characterization (see for instance Haussener et al., 2012). This deserves more caution. The approach of Xiong et al. (2015) might be more appropriate than isolating “snow grains”. An illustration of the segmentation process would be useful if this strategy is maintained. Could you also provide (where it best suits) the values of the asymmetry parameters obtained with this approach?

Response: Upon further reflection, we have decided to take your suggestion and use a local phase function characterization following closely to Xiong et al. and Haussener et al., 2012. This approach eliminates the subjective method of isolating grains, improves our results, and fits better with the broader plane-parallel framework that uses F_{ice} instead of an absorption coefficient. See responses to comments 1 and 3 for more elaboration and see below for an updated figure comparing the spectral albedo for the fresh snow.



I.170 : this grain selection seems very arbitrary and would deserve more attention or explanations. Also, how many grains should be averaged to have something representative? What's the variability of the phase function across grains from a same sample?

Response: We agree that the grain selection is somewhat arbitrary. While no longer wholly relevant since we have removed this section from the methods (see responses to other comments), we had been choosing grains to ensure that they were not located on a sample boundary and had no clearly artificial boundaries. The number of grains averaged to generate the phase function were dependent on the sample. For example, some of our very large grain samples only had a handful of grains to average, whereas the fine grain samples had several hundred grains to sample from.

I.172 : some comment is needed on the relevance of using the properties of a very small sample to represent a whole (necessarily heterogeneous) snowpack. Said differently, what is the representativity of the sample?

Response: We agree on this point and have added some quantitative content in the discussion section to address this point.

I.175 : reference to Picard et al. (2016) might be relevant

Response: We have added a reference to Picard et al. (2016).

I.176 : problem with the beginning of the sentence

Response: Fixed, thank you.

I.198 : could you double-check the equation for μ_y . There might be a sign error. Also didn't you forget the last terms for μ_x and μ_y ?

Response: In revisiting this formula as it relates the cartesian directions to the scattering angle, we do not see a sign error for μ_y . However, the last terms for μ_x and μ_y were left out of the text and have been added. Fortunately, this oversight was limited to the paper text, and the code in the model was correct. Thank you for catching this!

I.202 : is this approach the initiative of the authors, or was it taken from another paper? I'm afraid it's wrong because it overall underestimates the total distance traveled by a photon (the distance

traveled between scattering events does not include enhancement in the ice phase), hence the total absorption. This is probably tricky.

Response: This approach to use F_{ice} to continuously deplete energy was the initiative of the authors (as far as we know). We agree that this is tricky, however, we think that the use of F_{ice} instead of a medium absorption coefficient is consistent with the framework whereby the extinction coefficient is computed using the probabilistic form of Beer's Law at varying distances from the particle initiation. We note that using this method, the scattering coefficient is larger than expected by $p \cdot SSA/4$ for rendered spheres by a factor on the order of 1.3 - 1.8. We expect that this scattering coefficient is consistent with the F_{ice} based continuous energy depletion. Finally, the lack of absorption noted in the original paper was entirely corrected once localizing the phase function such that it was oriented at air/ice boundaries, rather than to individual segmented grains. We did a brief comparison of methods to support this hypothesis. Please refer to the more detailed response for specific comment #3 provided above.

I.207 : the "Russian roulette" should probably be better explained. What happens to the photon packets that are not killed?

Response: Photons that are not killed are provided additional energy proportional to " m " which supplies a small bit of additional energy to the model to account for the energy removed when a photon is killed. We added some additional text that we hope clarifies this point.

"In this formulation, energy removed from the model by killing photons is compensated for by adding a comparable amount of energy to the photons below the prescribed threshold which are not killed, thereby preserving statistical energy conservation."

Figure 3 : labels should be larger (also for Figs. 9, 10, 13). Why using markers? Why not simply having two layer with different shades?

Response: We will increase all axes labels and tick marks for the noted figures. For Figure 3, we felt that the markers better allow the reader to imagine the photon hitting and interacting with individual air/snow interfaces, as occurs in a real snowpack.

I.227 : I did not understand "is used to simplify the complex reflectance properties of a rough surface"

Response: We have simply removed this text as it did not add a whole lot to the sentence. Thank you.

I.238 : not clear whether samples are taken from the surface or in the pit (to sample various layers)

Response: The samples were taken from the surface, 0-7 cm, in the case of the small grained

sample, and from 14-19 cm depth in the case of the large grained sample.

I.241 : how later (compared to snow sampling) were the images taken?

Response: The small grained sample was imaged 18 days after snow sampling, while the large grained sample was imaged 53 days after snow sampling due to limits in access to the laboratory due to COVID-19 concerns. All samples were stored at -30 degrees C to limit metamorphic change in the intervening timeframe.

I.245 : “optimization” is unclear

Response: The FieldSpec 4 requires optimization which adjusts and improves the detector sensitivities for the probe and light source currently in use. We have included this clarification in the text.

I.247 : was it nadir observations?

Response: Yes.

I.255 : what’s the size of the aluminium panel? How was it practically inserted? How did you ensure that it is horizontal under the snow? What’s the precision of the depth position (transmissivity greatly varies with depth)? 4.75 cm seems very (too) accurate for a depth measurement! Typo for “aluminium”

Response: The aluminum panels were 16x16 inches. They were inserted into a snow pit sidewall, carefully to disturb the above snow as little as possible. In practice we started from the bottom and worked up through the snowpack so the “slot” left behind after pulling out the panel wasn’t included in the following measurement. We had no way to ensure that it was perfectly horizontal beneath the snow, though we think a likely bigger contribution to variations in depth between the panel and the snow surface are minor ($<0.25\text{cm}$) variations in the actual snow depth. Snow depth measurement precision was likely on the order of 5mm, but considering minor fluctuations in snow surface depth, or the possibility of subtle tilts in the panel, we have revised this precision to 10mm. With regards to the typo, “aluminum” is the typical US spelling and we will leave it to the editor to select which spelling is preferable within this journal’s standard.

Figure 4 : maybe not very useful.

Response: We have cut figure 4 from the paper.

Figure 5 : An indicative scale would be helpful

Response: We have included the size of the panels in the text. However, we disagree that adding a scale at this point to the image will be beneficial since it would require a

considerable approximation, would likely be visually unappealing, and wouldn't provide any additional information.

I.271 : Is the cylinder still 7 cm high for the detailed analysis, or limited to a cubic sample?

Response: As noted on I.285, a cubic sub-sample is used for the detailed analysis.

I.281 : totally agree, and this should be further discussed. Does this literature correspond to optical studies? If not, I see no reason that this approach is satisfying for optical issues.

Response: We agree that there is some amount of subjectivity in the grain segmentation process. In fact, improving grain automated segmentation from uCT for both optical and structural mechanics is an ongoing topic of research we are pursuing. We also note that Ishimoto et al. (2018) used a subjective grain segmentation algorithm on snow as part of an optical study, although they didn't use watershed. However, in response to previous comments, we have recast the phase function to be localized (e.g., Xiong et al., Hausner et al.) and no longer rely on segmented grains. So, this subjectivity is no longer relevant to this specific study.

I.313 : what is the underlying albedo? Visible light can indeed reach the ground

Response: Underlying surface albedo was treated as a 100% absorptive lower boundary. Transmissivity was simulated at ~ 1% for the visible wavelengths.

I.317 : "of the each"

Response: Typo has been fixed, thank you.

I.318 : how is albedo computed? What are the illuminating and viewing angles?

Response: The illumination was downward diffuse (e.g., random incident vector directions). Albedo is approximated by simply tracking the ratio between the photon energy escaping the top of the model over the input energy. While it is more correct to compute it by hemispherically integrating the BDRF / DCRF, it's quite a bit more computationally expensive to do so, and we find the differences between these two methods were negligible until higher zenith angles.

I.320 : "that favors" reads awkward → "it shows the strong sensitivity of NIR albedo to snow microstructure"

Response: We have reworded as suggested.

I.323 : it's more a dependence than a relationship

Response: We have further specified the relationship as a dependence, as recommended.

I.325 : is exponential qualitative or confirmed? Consider referring to Eq. 9 of Kokhanovsky and

Zege (2004)

Response: This was qualitatively similar to what is seen in the literature. We have added citations to that effect (e.g., Xiong et al.). Further, we show the plot from eq. 9 from Kokhanovsky and Zege to contextualize the results noting that eq.9 approaches an albedo of one for all wavelengths more rapidly due to the $\cos(\text{zenith}) \rightarrow 0$, and that our results are more consistent with those from Xiong et al., particularly for the NIR wavelengths.

Figure 10 : 25000 photons per wavelength (how many by the way?) or for all wavelengths?

Response: 25000 photons per wavelength.

I.326 : what “observed” behavior? Your work or from the literature?

Response: We have clarified this sentence to read:

“consistent with the results from previous studies on the relationship between snow albedo and zenith angle (e.g., Li and Zhou, 2003; Kokhanovsky and Zege, 2004; Xiong et al. 2015).

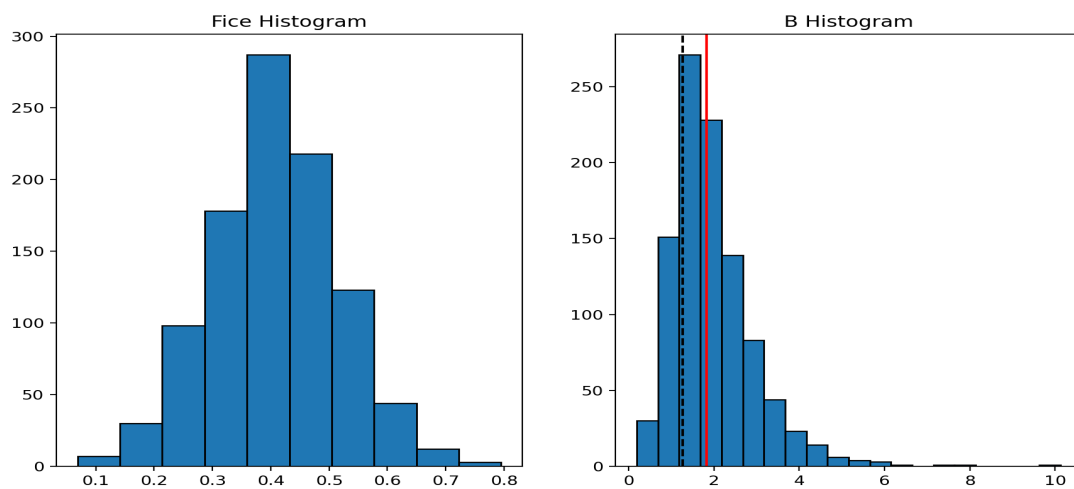
I.326 : “with good fidelity” is not justified. What do you compare to? More generally your model could not but reproduce that, so it’s not a proof of the model being “good”.

Response: Agreed, we have reworded this sentence. *“This indicates that the model is capable of reproducing the surface anisotropy of snow described in the literature (e.g. Aoki et al. 2000; Hudson et al. 2006; Kaempfer et al. 2007; Dumont et al. 2010; Xiong et al. 2015).”*

Table 1 : would be useful to provide the parameter B as well (see Libois et al., 2014). In particular the values would be 1.95 for fine grain and 2.05 for coarse grain (TBC). Also γ_{ext} is quite different from $\rho \cdot \text{SSA}/2$ (see Libois et al. 2013 or Picard et al., 2016), which would certainly deserve some comment. Have you applied your technique to a collection of isolated spheres (with known ρ and SSA) to check whether you can obtain the exact (known) value of γ_{ext} ?

Response: To answer the first part of this question, computing B from mean F_{ice} and sample density here is a little tricky, and we suspect isn’t providing an accurate answer. We think that this is because B increases non-linearly as a function of F_{ice} for a given density and, as a result, the mean F_{ice} (or mean B parameter) for several different photon tracks through the medium would be weighted towards a higher-than-expected value. Specifically, individual B values for photon paths with F_{ice} less than the average would be outweighed by overly high B values for higher F_{ice} values, which we expect are photon paths that enter and exit the medium rather quickly interacting with perhaps only 1 “particle.” We can show this by comparing sampled histograms of F_{ice} to histograms of B, and indeed, the mean value of B

is shifted to the left of the most frequent value, which is typically in the 1.3-1.6 range (see figure below). We propose a better way to estimate B from this framework is to follow equation 4 from Libois et al. 2019, and simply compare the solid ice fraction from a photon path that reflects and refracts throughout the medium to the solid ice fraction following a straight chord through the medium. Following this method, we get values closer to those reported within the literature, and we find that that B converges to 1.26 for a collection of spheres. We suspect that these two methods do not yield equivalent values for B because the sample density may not be representative of the density for each photon track that passes throughout the medium. Please see our response to an additional comment below for more information on this point.



Red line = B from mean Fice, Black dashed line = B = 1.26

Yes, we have computed extinction coefficients for several collections of spheres. Please see response to specific comment #2 above for details.

I.332 : it's not clear what transmissivity is here. Is it the flux at a particular depth within the snow layer of 20 cm? Or is it the transmittance of a snow layer of thickness X (with black surface beneath), where X is varying. Without precision I'd assume it's option 2. This makes a big difference and should be clarified.

Response: It is option 2, we have made some clarification in the text to clarify this:

"Finally, we use the model to provide an initial assessment of the impacts of snow microstructure on simulated spectral transmittance at specified depths within a homogenous snowpack."

I.336 : an optical thickness is unitless. The penetration depth is a length, though

Response: Fixed, thank you for this correction.

Figure 12b: shouldn't the Fice lines be removed, and the red line added to 12a? Because they correspond

to transmissivities, not differences in transmissivities

Response: We have chosen to keep the lines on 12a, since they correspond to the penetration depth for each simulation, and we think that the difference in penetration depths nicely compliments the difference in transmittance show in the shaded contours.

Table 2 : as for Table 1, I found B values ranging from 2.3 to 2.8, which are somehow much larger than previous estimates. Again γ_{ext} is quite different (30%) from $p\text{-SSA}/2$ (or even $p\text{-SSA}/4$ if diffraction is not considered). Also, depth seems to start from the ground, which is surprising (looks more like height). Finally, I doubt that SSA estimation can reach $0.01 \text{ m}^2 \text{ kg}^{-1}$ precision.

Response: We have updated the SSA values in the table to be precise down to the 10, not the 100s decimal place. Please see above comment for table one discussing the $p\text{-SSA}/4$ relationship and differences between how the scattering (extinction) coefficient is computed here vs. elsewhere. Again, see additional comments related to computing B from mean F_{ice} vs. computing it directly from the ray-tracing following eq. 4 from Libois et al. 2019.

I.345 : why not using the 4% reflectance mentioned earlier?

Response: This may be a mistake in the paper. Regardless, we have rerun the simulations with the 4% reflectance lower boundary. Thank you for catching this!

I.347 : I don't understand what "remarkably good" means, given that substantial differences are seen in Fig. 13. Why are the differences in the NIR so large?

Response: We have reworded this to be quantitative. Specifically, we have quantified "good" by stating the RMSE for the visible (300-850) and NIR (850+) ranges, in addition to the figure. We have also updated this result to reflect the change in the phase function, which yields a much better result, and especially improved the comparison in the NIR. Thank you for the suggestion.

Figure 13 : why is there a line in between points?

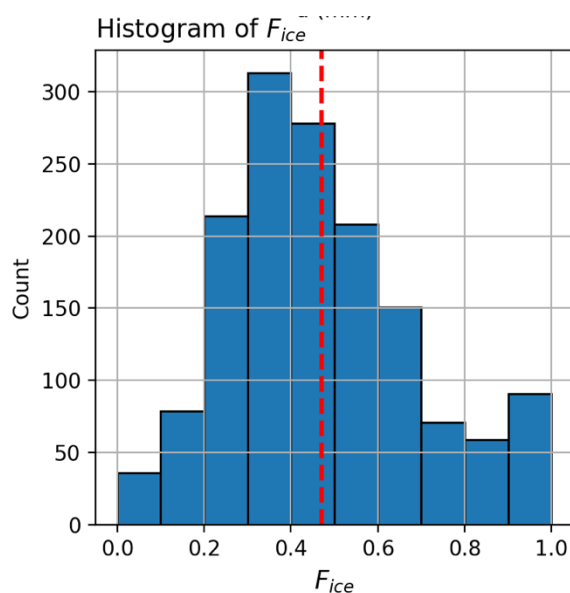
Response: We feel that the lines help make the figure easier to read and more visually appealing, and have chosen to keep them.

I.350 : errors in the phase function are mostly impacting the NIR, but they also affect the visible range, which is why it deserves much more attention.

Response: We agree, and we have replaced the particle phase function in the framework with a localized phase function that does not rely on grain segmentation or individual particles, more like the phase function in Xiong et al. & Haussener et al. This phase function approach is more consistent with the approaches for determining the extinction coefficient and the absorption within the snow. Accordingly, this change alone results in dramatic improvement in model performance.

I.363 : according to the formula presented above ($F_{ice} = B \cdot p / (p_{ice} + (B-1)p)$) it's no surprise to have a linear-like behavior in the explored range of snow densities. However the 0.25 residual is surprising. I'd be worth computing B for all available data based on your approach.

Response: See above comment regarding how we chose to compute B. In response to your suggestion, we are working on calculating B for all of the samples following eq.4 from Libois et al., 2019. We note that while the relationship between F_{ice} and density is well approximated by a linear function for the mid-range densities, there is a visible convex inflection in the scatter plot, which is consistent with the relationship between F_{ice} and density in the above formula. The 0.25 relationship is interesting, and we suspect that this is due to a general propensity for the mean F_{ice} averaged over all photon tracks to fall to the right of the most frequent value of F_{ice} in the histogram (see figure below). We suspect that this is due to some photon tracks that interact with only a single particle within the same, and bounce out, leading to F_{ice} that approaches 1. Accordingly, the linear relationship between F_{ice} and density appears as expected, though is shifted towards higher values than would be expected, leading to a y-intercept of 0.25. This is likely related to your other comment regarding the abnormally high B values. Note that in the below histogram, if the peak of the histogram is used (0.35) instead of the mean (0.5), the B parameter for the sample density of (275) is ~1.26 vs. 2.4.



I.372 : this has been known for a while (Eq. 23 of Bohren and Barkstrom, 1974)

Response: This section will be updated and revised based on the major comments above. We will ensure that the relevant references are included in that discussion.

I.368 : again, use the product $p \cdot SSA$ instead of a bilinear regression. Again a residual in such regression should be commented.

Response: We have replaced the bilinear regression with a regression against $p \cdot SSA$, which is a much cleaner result. Thank you.

I.372 : what does a r^2 of 0.25 mean in terms of correlation?

Response: The correlation coefficient in this case is 0.5, meaning there is a positive correlation but it is not significant.

I.380 : suggest → confirm

Response: Corrected, thank you.

I.387 : can you clarify what “we pair” means

Response: We have removed the first part of this sentence as it is unnecessary and may be confusing. To be more succinct, it now reads “*We note that high values of γ_{ext} are more likely to coincide with high values of F_{ice} due to the shared dependence of these variables on snow density in most snowpacks.*”

I.390 : not clear why the highly scattering nature of snow explains the different sensitivities to F_{ice} and γ_{ext} . I'd use an analytical expression of the penetration depth (see for instance Libois et al., 2013) to show that the dependence on γ_{ext} is linear, while the dependence on B is square root

(changes in F_{ice} are proportional to changes in B if density is unchanged). The ~ 3 scaling of γ_{ext} results in a ~ 3 scaling of penetration depth. The ~ 2.3 scaling in F_{ice} results in a ~ 1.5 scaling, which is consistent with your simulations.

Response: Thank you for another insightful comment. The original sentence on the highly scattering nature of snow was included to reflect that the most influential variable driving penetration depth within the snow was the one related to scattering (γ_{ext}) and not the one related to absorption (F_{ice}). In our original reading of Libois et al. (2013), we had not made the analytical connection between the penetration depth and γ_{ext} . In accordance with this comment, we have replaced this sentence to refer to the analytical expressions for the e-folding depth as a function of γ_{ext} to show that a linear scaling is expected, and commented on the square root dependence of B :

“The simulated relationship between γ_{ext} and penetration depth (L) is consistent with the analytical expressions showing a linear relationship between L and γ_{ext} discussed in Libois et al. (2013). Specifically, the factor of 3 decrease in the extinction coefficient corresponds to a factor of 3 increase in penetration depth. Additionally, in showing a muted impact of F_{ice} on L that increases with wavelength, the relationship between F_{ice} and penetration depth is also consistent with the $L \sim \text{SQRT}(B \cdot k_{abs})$ relationship discussed in Libois et al. (2013). For instance, at 1300nm, the simulated increase penetration depth is proportional to square root of the increase in F_{ice} .”

I.392 : never exceeds 2.5 cm, no?

Response: Yes, however this specific answer has changed once we localized the phase function.

I.393 : leading to an increase

Response: Great catch! Thank you.

I.398 : for crust layers, how would you isolate grains from the 3D image?

Response: Using the same method as before, though with a larger minimum threshold distance for the Euclidian difference partitioning. Certainty, this was a lot trickier to get realistic grains, and resulted in less grains available for the phase function computation. Which goes to one of your points made earlier. However, because we have made the shift away from using isolated grains to compute the phase function, this is no longer relevant.

I.404 : at what wavelength were the phase function and γ_{ext} estimated?

Response: 1000nm

I.407 : unit missing

Response: Fixed, thank you.

I.422 : I don't agree with "high accuracy"

Response: See response to specific comment #1. Improvements have been made to the model that result in better agreement between simulated and observed spectral albedo (Figure 13).

I.425 : at what wavelength?

Response: It is stated at the beginning of the sentence that we're referring to the visible portion of the spectrum here but we have further clarified by adding mainly in the 400 nm – 650 nm range.

I.426 : was the reduction of albedo mentioned earlier?

Response: We have rephrased to specifically reference transmittance, and not albedo, since an explicit relationship between albedo and transmission was not referenced earlier.

I.428 : again, this is obvious

Response: We have removed this sentence, thank you.

I.435 : consider reading Hagenmuller et al. (2019)

Response: Thank you for the suggestion.

Additional suggestion :

Here is a procedure to test the validity of the 1D ray-tracing code (although I don't particular believe it does not work):

- Consider an homogenous (horizontally semi-infinite) layer of thickness L , non absorbing
- Illuminate it with diffuse light
- Record the path lengths of escaping (reflected and transmitted) photons
- Check that the average path length equals $2L$, **whatever the chosen phase function**
- If it does not work there is an issue somewhere
- See Blanco and Fournier (2003) for more details

Response: Thank you for this constructive suggestion to test the validity of the ray-tracing code. In performing this test for a small variety of depths without absorption we find that the mean pathlength $\langle L \rangle$ /depth approaches ~ 2 . So, we believe the random walk ray-tracing code meets the criteria of this test.

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