1 Highlights

- Testing tholins as analogues of the dark reddish material covering Pluto's Cthulhu
 region
- M. Fayolle, E. Quirico, B. Schmitt, L. Jovanovic, T. Gautier, N. Carrasco, W. Grundy, V. Vuitton, O. Poch, S.
- 5 Protopapa,L. Young,D. Cruikshank,C. Dalle Ore,T. Bertrand,A. Stern,the New Horizons Surface Composi-
- ${\scriptstyle 6}$ ${\rm \ tion\ Science\ Theme\ Team.}$
- New Horizons' reflectance spectra of the Cthulhu dark belt of Pluto were modelled with tholins.
- Reflectance factors, phase function and optical constants of these tholins were numerically determined from tholins' reflectance measurements.
- Tholins do not reproduce the featureless spectra of Cthulhu.
- These results could suggest that this region is covered with a highly porous layer of organic aerosols.

Testing tholins as analogues of the dark reddish material coveringPluto's Cthulhu region

M. Fayolle^{a,b,*,1}, E. Quirico^a, B. Schmitt^a, L. Jovanovic^c, T. Gautier^c, N. Carrasco^c,

¹⁵ W. Grundy^d, V. Vuitton^a, O. Poch^a, S. Protopapa^e, L. Young^e, D. Cruikshank^f, C.

¹⁶ Dalle Ore^f, T. Bertrand^{f,g}, A. Stern^e and the New Horizons Surface Composition Science

17 Theme Team.

18 ^aUniversité Grenoble Alpes, CNRS, CNES, IPAG, France

19 ^b Delft University of Technology, 2629 HS Delft, The Netherlands

- 20 ^cUniversité Paris-Saclay, UVSQ, CNRS, Sorbonne Université, LATMOS, 78280, Guyancourt, France
- ²¹ ^dLowell Observatory Flagstaff, AZ 86001, USA

22 ^eSouthwest Research Institute Boulder, CO 80302, USA

^fAmes Research Center, Space Science Division, National Aeronautics and Space Administration (NASA), Moffett Field,
 CA, USA

^g Laboratoire de Météorologie Dynamique, IPSL, Sorbonne Universités, UPMC Université Paris 06, CNRS, BP99, 75005
 Paris, France.

Pluto's fly-by by the New Horizons spacecraft in July 2015 has revealed a dark

reddish equatorial region, named Cthulhu, covered by a dark, non-icy material

whose origin and composition have yet to be determined. It has been suggested

that this material could form from the sedimentation of photochemical aerosols,

originating from dissociation and ionisation processes in Pluto's high atmosphere

(similarly to aerosols forming Titan's haze). This hypothesis is here further in-

vestigated by comparing New Horizons spectra collected both in the visible and

the near-infrared to laboratory reflectance measurements of analogues of Pluto's

aerosols (Pluto tholins). These aerosols were synthesised in conditions mimicking Pluto's atmosphere, and their optical and reflectance properties were determined,

before being used in Hapke models. In particular, the single scattering albedo

and phase function of Pluto tholins were retrieved through Hapke model inversion,

performed from laboratory reflectance spectra collected under various geometries.

From reconstructed reflectance spectra and direct comparison with New Horizons

data, some of these tholins are shown to reproduce the photometric level (i.e. reflectance continuum) reasonably well in the near-infrared. Nevertheless, a misfit

of the red visible slope still remains and tholins absorption bands present in the

modelled spectra are absent in those collected by the New Horizons instruments.

Several hypotheses are considered to explain the absence of these absorption fea-

tures in LEISA data, namely high porosity effects or GCR irradiation. The forma-

tion of highly porous structures, which is currently our preferred scenario, could be promoted by either sublimation of ices initially mixed with the aerosols, or gentle

27

38

ARTICLE INFO

ABSTRACT

55 1. Introduction

Pluto is the largest of the Trans-Neptunian objects (TNOs). Before the flyby performed by the New Horizons' spacecraft in July, 2015, knowledge of Pluto's surface composition was limited to ground-based and Hubble Space Telescope (HST), disk-integrated observations. However, inferring Pluto's surface composition is of primary importance to gain insight into its bulk composition and to understand the interactions between the surface and Pluto's tenuous atmosphere. Before the New Horizons mission, CH₄ (Cruikshank et al., 1976), N₂ and CO ices (Owen et al., 1993) were identified from ground-based measurements, while the presence of water ice was expected but not firmly confirmed (Grundy and Buie, 2002). Ground-based

deposition under Pluto's weak gravity.

[🗟] m.s.fayolle@tudelft.nl (M. Fayolle) ORCID(s): 0000-0003-4407-5031 (M. Fayolle)

spectra also contain indications of the presence of C_2H_6 ice (Nakamura et al., 2000; Sasaki et al., 2004; Cruikshank et al., 2006; DeMeo et al., 2010; Holler et al., 2014), and possibly of nitriles (Protopapa et al., 2008). Not only the spectrophotometric data collected during Pluto's flyby confirmed the presence of CH₄, N₂, CO and H₂O-ice on the surface (Grundy et al., 2016; Schmitt et al., 2017; Protopapa et al., 2017), but they also showed possible evidence for methanol CH₃OH ice (Cook et al., 2019).

In addition to bright terrains covered by volatile ices, dark regions were already detected by ground-based 68 and HST observations (e.g. Buie and Tholen, 1989; Buie et al., 2010; Grundy and Buie, 2002) and were later 69 confirmed by the New Horizons' flyby (Grundy et al., 2016; Olkin et al., 2017; Protopapa et al., 2020). These 70 regions are extremely low reflectance terrains showing a steep red slope in the visible. This advocates for 71 the presence of a non-icy, dark material on Pluto's surface which has not yet been firmly identified. Most of 72 these low reflectance terrains are dark red patchy regions located along Pluto's equatorial belt. The largest 73 of these dark red patches, which extends from about 20° east to 160° east in longitude, is referred to as the 74 Cthulhu region, and presents some of the reddest colors of Pluto's surface. Three main scenarios currently 75 coexist to explain the presence of this dark material on the surface of Pluto. 76

First, this material could originate from the formation of the planet itself (Sekine et al., 2017). Pluto 77 is thought to have formed from a giant impact that might have also created its satellite Charon (Canup, 78 2010; Desch, 2015; McKinnon et al., 2017). The extremely high energy delivered by such a collision between 79 the proto-Pluto and the impactor is suspected to have triggered the melting of a significant part of the 80 surface and icy-bedrock, creating a warm liquid water ocean. It has been shown that dark reddish, organic 81 material can be synthesised in warm liquid water from simple organic compounds (e.g. formaldehyde) 82 that are typically found in comets and could have been present on the proto-Pluto or brought in by the 83 impactor (Sekine et al., 2017). Polymerization of the simple organic compounds would lead to the formation 84 of complex macromolecular compounds, responsible for the darkening and reddening of the water solution. 85 Sample materials formed in warm water solution showed a steep red slope in the visible and no strong spectral 86 feature in the near-infrared, which seems consistent with the New Horizons spectra collected over the dark 87 red equatorial regions of Pluto (Sekine et al., 2017). Moreover, hydrodynamics simulation conducted in 88 Sekine et al. (2017) shows that significant melted basins could have been created by a giant impact, the size 89 of the largest one being comparable to that of the Cthulhu region. 90

Second, it has also been proposed that the red material could originate from the irradiation of ices on 91 Pluto's surface by solar ultraviolet (UV) light and galactic cosmic rays (GCR), with a small contribution 92 from charged solar wind particles (Cruikshank et al., 2015). As Pluto's tenuous atmosphere may have 93 blocked most of the UV flux in the past, GCR was considered a more likely candidate, even if its energy 94 flux at Pluto's distance is significantly lower than that of UV light. Laboratory experiments showed that 95 both UV and charged particles irradiation of a mixture of the different ices present on Pluto (CH₄, N₂, CO, 96 C_2H_6) can trigger a rich chemistry and form a complex refractory residue that might account for the dark, 97 non-icy material on the surface (see review in Cruikshank et al., 2015). 98

Finally, the last hypothesis identifies the dark red material covering the low reflectance terrains of Pluto 99 as haze particles deposited onto the surface. A layered haze extending up to about 350 km above the surface 100 has been discovered by the New Horizons spacecraft during its flyby (e.g. Gladstone et al., 2016; Grundy 101 et al., 2018; Young et al., 2018). Haze particles originate from the dissociation and ionisation of Pluto's 102 upper atmosphere gases $(CH_4, N_2, and CO)$ due to radiolysis and photolysis processes. Different energetic 103 sources are possible drivers for the haze production (e.g. Cheng et al., 2017; Grundy et al., 2018). First, 104 photons originating from the Sun are an important energy source. Ly- α photons are energetic enough to 105 break C-H bonds in CH_4 and their fluxes are relatively high. Although more energetic photons are present in 106 smaller quantities than $Ly - \alpha$ photons, they also contribute to photolysis and are able to break the stronger 107 triple bonds in N_2 and CO gases. In addition to photons, protons and electrons originating from the Sun 108 are also expected to trigger gases dissociation in Pluto's upper atmosphere. Finally, cosmic rays also play a 109 role despite their low fluxes at Pluto's distance, as they deliver highly energetic particles. 110

The formation of haze particles starts in the upper layers of Pluto's atmosphere, where dissociation products (ions, radicals) accrete and build larger and more complex molecules. Other gases like HCN, C_2H_2 , or H_2O can stick to the haze particles, either being adsorbed, chemically bonded, or directly condensed around the haze particle (*e.g.* Luspay-Kuti et al., 2017; Gao et al., 2017; Wong et al., 2017). When growing, the haze particles also become heavier and start falling down. The temperature rises as they reach lower altitudes, initiating sublimation of the most volatile constituents of the haze particles.

The analysis of combined MVIC and LEISA over both Cthulhu and Lowell regions by Protopapa et al. (2020) showed that a single colouring agent could account for the diversity of Pluto's surface colours. The different colours are likely to be caused by changes in abundance and particle size of a single material, quite similar to Khare's Titan tholins. Although this does not discard the other scenarios, it supports the hypothesis of an atmospheric origin for Pluto's dark material.

This paper further investigates this hypothesis, by analysing whether analogues of the haze particles forming in Pluto's atmosphere could reproduce the reddest colours observed on the surface. The spectral reflectance properties of the analogues (so-called tholins, as introduced in Sagan and Khare, 1979) were measured through spectro-gonio-radiometry, and were then fitted to the spectra collected by the Ralph instrument of the New Horizons spacecraft during its flyby of Pluto.

The New Horizons spectrophotometric observations are first presented in Section 2, while the experimental setups used to synthesise the analogues of Pluto's haze particles and measure their reflectance spectra are described in Section 3. The numerical models used to simulate the surface reflectance are then detailed in Section 4. The experimental results are provided in Section 5, where the optical properties of the Pluto tholins are analysed. Section 6 presents the comparison with respect to New Horizons data. Finally, results are discussed in Section 7 and the main concluding points are summarised in Section 8.

133 2. New Horizons observations

Pluto's flyby performed by the New Horizons spacecraft occurred in July 2015, the point of closest approach having been reached on July, 14th after about 10 years of travel in space (Stern et al., 2015). The composition of Pluto's surface was investigated through observations collected by the Ralph instrument (Reuter et al., 2008). It combines a visible and near-infrared camera (MVIC) and an infrared imaging spectrometer (LEISA).

139 2.1. Measurements

¹⁴⁰ MVIC possesses four spectral channels, the first three being referred to as the BLUE filter (covering ¹⁴¹ a spectral range extending from 0.40 μ m to 0.55 μ m), the RED filter (from 0.54 μ m to 0.70 μ m), and ¹⁴² the NIR (near-infrared) filter (from 0.78 μ m to 0.98 μ m), respectively. Additionally, one channel covering ¹⁴³ wavelengths from 0.86 μ m to 0.98 μ m is dedicated to the detection of the narrow CH₄ band present in this ¹⁴⁴ specific spectral range.

The LEISA instrument covers a spectral range going from 1.25 μ m to 2.50 μ m. Most of the chemical components expected to be present on Pluto's surface show absorption features in this spectral range, thus making LEISA data able to verify their identification. The spectral resolution of the LEISA instrument is $\lambda/\Delta\lambda = 240$ between 1.25 μ m and 2.50 μ m. A higher spectral resolution ($\lambda/\Delta\lambda = 560$) was supposed to be available from 2.1 μ m to 2.25 μ m, but this higher resolution segment turned out to be difficult to calibrate properly. Therefore, this work focuses on the lower spectral resolution segment only.

The maps generated by the LEISA instrument comprise a spectral dimension and a spatial one. The 151 near-infrared spectrum from 1.25 μm to 2.5 μm is obtained along the in-track direction. The reflectance of 152 different parts of the surface is theoretically measured at the same wavelength in the cross-track direction. 153 By scanning the image in the in-track direction, and thus at different wavelengths, the full spectrum of a 154 given region of Pluto can be constructed. However, due to slight instrumental effects, the measurements 155 are not exactly conducted at the same wavelength in the cross-track direction. A so-called "spectral smile" 156 of a few spectels is present over the 256 pixels array along the cross-track direction. During the scanning 157 of the target by LEISA, the spacecraft kept rotating around its z-axis so that Pluto's surface is scanned in 158 the transmission band pass direction (in-track direction). It also tries to compensate any shift of the scan 159 in the perpendicular direction with brief thruster bursts. These zig-zag scans have to be corrected during 160 data projection. 161

¹⁶² 2.2. Data pre-processing

Both photometric and spectral calibrations of the Ralph instrument were conducted before the launch of the spacecraft and completed with in-flight calibrations with respect to stars. An additional "flat-field" calibration was performed, based on a rapid scan of Pluto's surface in the cross-track direction (as opposed
to the in-track direction which is the nominal orientation of the instrument when collecting observations).
Each pixel of the 256 pixels array thus covers almost the same part of the surface. The overall calibration of
LEISA data is based on a combination of those ground-based and in-flight stellar calibrations, spectral smile
corrections, and flat fielding. Nonetheless, some calibration issues remain in New Horizons data. The LEISA
reflectance values are overestimated by an amount of 26% and should therefore be scaled down accordingly
(Protopapa et al., 2020).

Several scans of Pluto's surface by the LEISA instrument were conducted, and data cubes were reconstructed with the Integrated Software for Imagers and Spectrometers (ISIS) software from the United States Geological Survey (USGS). Two of the close-encounter data cubes were calibrated, and projected onto LORRI Pluto-sized spherical data map (orthographic projection at same observation geometry). Sharp geological features identifiable in both LORRI and LEISA data were finally used for slight mismatch corrections in LEISA data projection, with respect to the higher resolution LORRI base map. Together, the two calibrated LEISA data cubes cover the whole visible disk of the planet.

In this work, we used the same calibrated data cube covering Cthulhu region as in Schmitt et al. (2017). 179 This data cube does not consist of raw data but follows from a Principal Component Analysis (PCA), 180 described in more details in Schmitt et al. (2017). This post-processing step aims at identifying the main 181 surface components, as well as mapping their distribution, and removing most of the instrumental effects 182 and noise. The result of the PCA was that the first nine Principal Components account for almost 95% of 183 the variance, demonstrating the good quality of LEISA data. Reduced-noise data cubes were reconstructed 184 from a PCA inversion, by assuming that the first Principal Components account for the major part of the 185 variance. Using these reduced-noise data cubes instead of the raw ones allows for a sharper analysis of New 186 Horizons spectra collected over the Cthulhu region. 187

The LEISA data from the reconstructed cube covering Cthulhu region were scaled down by 26% to correct the calibration issues previously mentioned. A precise and reliable value for the uncertainty of this calibration factor is hard to determine. We however used 7% as a conservative estimate for MVIC data error bars. This value is based on the comparison of two independent calibration methods for MVIC data in Howett et al. (2017). Discrepancies in the correction factor are limited to 3-7%, such that 7% seemed a reasonable upper limit for the uncertainty value. Finally, MVIC data were corrected to LEISA geometry, following the method presented in Protopapa et al. (2020).

¹⁹⁵ 2.3. Cthulhu spectra

To identify the red dark material covering Cthulhu, New Horizons spectra collected over this specific region were extracted from the data cube described above. The main focus of this study is on the core of the Cthulhu region, where the dark organic material is supposed to be the most concentrated. A spatial average was then computed over several pixels which were identified as the end-member of the red material in Schmitt et al. (2017). Using the averaged spectrum as a reference for comparison with laboratory reflectance measurements allows to further reduce the pixel-to-pixel noise of the New Horizons spectrum.

The MVIC data and LEISA reflectance spectrum of the red material's end-member are reproduced in Figure 1. In addition to the dark material end-member spectrum, we also used an average spectrum collected in the eastern periphery of Cthulhu. This spectrum exhibits strong absorption bands at 1.5 μ m and 2.0 μ m, demonstrating the presence of water ice mixed with the dark material. Evidences of a gradient in H₂O concentration from the center to the periphery of Cthulhu were already brought in Schmitt et al. (2017).

Because the reflectance level is highly dependent on the illumination and observation geometry under which a spectrum is collected, the average geometries corresponding to our two spectra of interest were retrieved. They are reported in Table 1, along with the average coordinates of the two regions over which these spectra were obtained.

211 3. Experimental setup

The way Pluto tholins are synthesised is first described in Section 3.1, before presenting the experimental setup used to conduct the laboratory reflectance measurements in Section 3.2.



Figure 1: New Horizons reflectance spectra. The light and dark blue curves correspond to New Horizons LEISA spectra collected over H_2O -rich and H_2O -poor eastern regions of Cthulhu, respectively. They are retrieved from the reconstructed data cube described in Section 2.2. MVIC data are corrected to LEISA geometry (see Protopapa et al., 2020).

	Nb pixels [-]	Lat. [°]	Long. [°]
H ₂ O-poor region	47	158.8 E	2.6S
H ₂ O-rich region	30	$152.9\mathrm{E}$	13.8S
	i [°]	e [°]	g [°]
H ₂ O-poor region	58.6	41.0	22.6
H ₂ O-rich region	67.7	52.6	22.5

Table 1: Average coordinates and viewing geometry of the two regions of interest for this study (H_2O -poor and H_2O -rich regions of Cthulhu), over which the New Horizons spectra displayed in Figure 1 were retrieved and averaged.

214 3.1. Tholins synthesis

Pluto tholins were synthesised in LATMOS (French acronym for Laboratoire Atmospheres, Milieux, 215 Observations Spatiales), with the PAMPRE experimental setup (Production d'Aérosols en Microgravité par 216 Plasma REactif, for more details see e.g. Szopa et al., 2006; Alcouffe et al., 2009; Jovanović et al., 2020). It 217 was first designed to synthesise laboratory analogues for Titan's haze particles, from an initial gas mixture 218 of N₂ and CH₄. For this study, it was used to produce analogues of Pluto's haze particles, by adding CO to 219 the N_2 :CH₄ gas mixture (Lellouch et al., 2017; Young et al., 2018). PAMPRE simulates the dissociation of 220 gases molecules as it occurs in Titan's or Pluto's high atmospheres, due to UV light or energetic particles. 221 In the PAMPRE setup, the molecules are dissociated in a cold plasma discharge between two electrodes. 222 Dissociation products evolve into more complex products. As they grow, they become heavier and are finally 223 recovered as a dusty material made of small spherical particles. The synthesis is conducted at low pressure 224 $(0.9 \pm 0.1 \text{ mbar})$ and room temperature. 225

To synthesise Pluto tholins, two initial gas compositions were used: $N_2:CH_4 = 99\%:1\%$ and $N_2:CH_4 = 95\%:5\%$, with 500 ppm of CO being added to each of them. They are thought to be representative of Pluto's atmosphere composition at altitudes of 400 and 650 km, respectively (Lellouch et al., 2017; Young et al., 2018). Their chemical composition was studied in Jovanović et al. (2020), and their optical properties in Jovanović et al. (2021).

In the following, for the sake of conciseness, these two types of Pluto tholins are referred to as 5%CH₄ and 1%CH₄ tholins, since the relative amount of CH₄ drives the reflectance differences between them (see discussion in Section 6.1.2). Small quantities of these Pluto tholins were also mixed with pyrrhotite, an opaque mineral used here as a darkening agent to model the effect of contamination by dark interplanetary

²³⁵ dust (see discussion in Section 7).

²³⁶ 3.2. Laboratory reflectance measurements

The spectrophotometric properties of the tholins samples were investigated by measuring their reflectance at various geometries with a spectro-gonio-radiometer developed at IPAG: the Spectro-photometer with cHanging Angles for Detection Of Weak Signals (SHADOWS) (Potin et al., 2018). This instrument operates in the 0.4-4.8 μ m spectral range and thus covers the full spectral range of the New Horizons observations both in the visible and in the near-infrared (from 0.4 μ m to 2.5 μ m), with an absolute photometric accuracy better than 1%. It therefore allows for a direct comparison between laboratory measurements and spectra collected by the New Horizons spacecraft.

The spectro-gonio-radiometer can perform reflectance measurements under various illumination and observation geometries. The geometry under which the spectrophotometric measurements are conducted significantly affects both the reflectance level and the spectral contrast (Hapke, 2012b). To compare the spectra measured in the laboratory on synthesised samples with those collected by New Horizons, the illumination and observation geometries must therefore be as similar as possible. This is necessary to remove any variation of the reflectance induced by a geometry difference and not by the reflectance properties of the material itself.

Nonetheless, first measuring the reflectance spectra of the tholins samples under a larger range of illumination and observation geometries allows to characterise the photometric function of the samples, as well as the evolution of their absorption features as a function of the geometry. This is crucial to retrieve tholins' optical properties from their reflectance measurements for modelling purposes (see Section 5.5). The reflectance measurements were conducted under incidence angles of 0°, 30°, and 60°, and emergence angles ranging from -70° to 70° with a step of 10° .

Some additional measurements were carried out under vacuum and with progressive heating of the samples (up to 100°C), to verify that the observed absorption features were not caused by adsorbed water. All data are made available through the GhoSST database in SSHADE infrastructure of solid spec-

All data are made available through the GhoSST database in SSHADE infrastructure of solid sptroscopy: https://doi.org/10.26302/SSHADE/EXPERIMENT_BS_20201201_001 (Fayolle et al., 2018).

261 4. Numerical models

Complementing the laboratory reflectance measurements, an analytical model was used to simulate the reflectance spectra of Cthulhu's surface. Section 4.1 first discusses the reflectance model, while Section 4.2 describes the modelling of the surface itself.

²⁶⁵ 4.1. Reflectance model

266 4.1.1. Nominal Hapke model

In this work, the Hapke model was selected, as one of the most complete theoretical model currently available to simulate surfaces' reflectance (*e.g.* Hapke, 1986, 1993, 2002, 2008, 2012a,b). The complete formulation of the Hapke model is given as follows:

$$r(i, e, g, \lambda) = K \frac{\omega(\lambda)}{4\pi} \frac{\mu_{0e}}{\mu_{0e} + \mu_{e}} \\ \times \left[P(g, \lambda) \left(1 + B_{SH}(g) \right) + H\left(\frac{\mu_{0e}}{K}\right) H\left(\frac{\mu_{e}}{K}\right) - 1 \right] \\ \times \left(1 + B_{CB}(g) \right) S(i, e, g, \bar{\theta}),$$

$$(1)$$

with $\mu_{0e} = \cos(i_e)$ and $\mu_e = \cos(e_e)$. The reflectance r is given as a function of the illumination and observation geometry angles i, e, and g (incidence, emergence, and phase angles respectively), and of various parameters describing the surface properties. The angles i_e and e_e refer to the incidence and emergence angles corrected for roughness. The porosity and macroscopic roughness of the surface are both taken into account (parameters K and $\bar{\theta}$, respectively). The shadowing function S describes how shadows are cast on the surface particles, and the resulting change in the total reflectance. It accounts for the effect of the macroscopic roughness $\bar{\theta}$ at a given illumination and observation geometry. The brightness growth observed at very small phase angles is described by the two opposition effect terms: $B_{\rm SH}$ and $B_{\rm CB}$, representing the shadow hiding and coherent backscattering opposition effects, respectively. Multiple scattering is accounted for in the *H* function. Finally, the phase function $P(g, \lambda)$ describes the dependency of the photometric level to the phase angle *g*.

The spectral information is carried out by the single scattering albedo ω . Its value depends on the mean particle diameter D, wavelength λ , and optical constants n and k (real and imaginary parts of the dielectric constant ϵ , respectively), as follows (Hapke, 2012b):

$$\omega = Q_S/Q_E = S_e + (1 - S_e) \frac{1 - S_i}{1 - S_i \Theta} \Theta, \tag{2}$$

with
$$S_e = \frac{(n-1)^2 + k^2}{(n+1)^2 + k^2} + 0.05,$$
 (3)

$$S_i = 1 - \frac{4}{n(n+1)^2},$$
(4)

$$\Theta = e^{-\alpha \bar{D}},\tag{5}$$

$$\bar{D} = \frac{2}{3} \left[n^2 - \frac{1}{n} \left(n^2 - 1 \right)^{3/2} \right] D.$$
(6)

Equation 2 only holds if the particle mean diameter D meets the condition $D\pi \ge \lambda$. More precisely, when the particle diameter becomes comparable or smaller than the wavelength λ , the expression of the single scattering albedo is modified to account for a change of scattering regime (Rayleigh scattering, see *e.g.* Hapke, 2012b). The single scattering albedo is then

$$\omega = Q_S/Q_E,$$

288 with

$$Q_E = \frac{24nk}{(n^2 + k^2)^2 + 4(n^2 - k^2) + 4} \left(\frac{\pi D}{\lambda}\right),\tag{7}$$

$$Q_S = \frac{8}{3} \frac{\left[(n^2 + k^2)^2 + n^2 - k^2 - 2 \right]^2 + 36n^2k^2}{\left[(n^2 + k^2)^2 + 4(n^2 - k^2) + 4 \right]^2} \left(\frac{\pi D}{\lambda}\right)^4.$$
(8)

289 4.1.2. Simplified reflectance model

Additional assumptions were made to simplify the complete formulation of the Hapke model given in Equation 1. Over the Cthulhu region, New Horizons spectra were collected at phase angles close to 22° (Table 1). The contribution of the coherent backscattering opposition effect term in the reflectance model can thus be safely neglected. Indeed, this effect generally only manifests itself for phase angles smaller than 2° (Hapke, 2002).

The multiple scattering function H is still included in our simplified version of Hapke model (analytical expressions for H can be found in Hapke, 2012b). The reflectance measurements performed on Pluto tholins indeed showed that they are extremely bright in the near-infrared. Multiple scattering cannot be neglected in that case since the absorption might not be efficient enough to ensure that the incident light is fully absorbed after encountering a single particle.

Finally, a macroscopic roughness of 20° was assumed for the shadowing function $S(i, e, g, \bar{\theta})$, which is the value derived from Hapke model's fit of the phase curve obtained during 2018 Pluto's occultation (Verbiscer et al., 2019).

³⁰³ 4.2. Surface modelling

304 4.2.1. Surface constituents

The low reflectance terrains of Pluto are not only covered by a dark red organic material. As already discussed in Section 2.3, water was identified towards the periphery of Cthulhu, where the dark material is probably mixed within H_2O ice. CH_4 was also detected on the topographic heights of Cthulhu and could correspond to seasonal deposits only subsisting at high altitudes. CH_4 ice could also be present in the bedrock of Pluto, along with H_2O which is a potential bedrock constituent (Grundy et al., 2018). Additionally, tentative evidences for hydrocarbon-rich ices in Cthulhu region were brought in Cook et al. (2019). Hydrocarbon-rich species were also mentioned as photochemical products participating in the formation of haze particles in Pluto's atmosphere in Grundy et al. (2018).

The model of Pluto's surface proposed in this work is thus a mixture of the above-mentioned icy species, namely H_2O , CH_4 , as well as CH_3OH and C_2H_6 which were selected as representative for the potential hydrocarbon species present in Cthulhu. Pluto tholins were added, as analogues for the dark-red organic material.

317 4.2.2. Intimate mixing between refractory species

A simple mixing model representing the surface as a spatial mixing between two separate units was first considered (represented in Figure 2). The first unit contains the volatile species (here CH_4) while the second one is composed of the refractories (tholins, H_2O , CH_3OH , and C_2H_6).

The total reflectance of the surface is calculated as the sum of the reflectance of the two units, weighted by their relative spatial ratio (left as an unknown in our model). Within the refractory unit, it was assumed that the different species are mixed at the individual particle scale. The reflectance of such an intimate, homogeneous mixture between various chemical compounds is modelled from an averaged single scattering albedo and phase function. These averaged values are computed from the individual properties of the different compounds involved in the mixing (relative mass ratio m_j , density ρ_j , particle mean diameter D_j and single scattering albedo ω_j), as follows:

$$\omega = \left(\sum_{j} \frac{m_j \omega_j}{\rho_j D_j}\right) / \left(\sum_{j} \frac{m_j}{\rho_j D_j}\right). \tag{9}$$

328 4.2.3. Ices condensed on tholins particles

A second mixing model was also considered, which is thought to be more representative of the way haze particles form in Pluto's atmosphere. As haze particles grow and fall down to the surface, ices can condense around them (*e.g.* Luspay-Kuti et al., 2017; Gao et al., 2017; Wong et al., 2017). The particles then sediment and settle onto Pluto's surface, forming an intimate mixture of tholins surrounded by various ices.

With this surface model, tholins are thus not directly mixed with icy components, but rather trapped into icy particles which are intimately mixed with each other. Tholins act as a colouring pigment in an icy matrix. To simulate the reflectance of ices condensed around tholins particles, Maxwell-Garnett effective medium model was applied. The use of this model is justified by the fact that the tholins particles are smaller than the wavelength. The effective dielectric constant ϵ_{eff} can be deduced from those of the matrix and of the inclusions, and is given by

$$\epsilon_{\text{eff}} = \epsilon_1 + 3p\epsilon_1 \frac{\epsilon_2 - \epsilon_1}{\epsilon_2 + 2\epsilon_1 - p(\epsilon_2 - \epsilon_1)},\tag{10}$$

where p is the fraction of the embedded material among the matrix, while ϵ_1 and ϵ_2 refer to the dielectric constant of the matrix and of the embedded material, respectively. The effective optical constants of such a medium can be directly retrieved as the real and imaginary parts of the dielectric constant, as follows:

$$n_{\rm eff} = {\rm Re}(\epsilon_{\rm eff}), \tag{11}$$

$$k_{\rm eff} = {\rm Im}(\epsilon_{\rm eff}). \tag{12}$$

The effective optical constants were thus computed for tholins surrounded by various ices, and an intimate mixing was assumed between the different condensed ice particles. Still, a spatial mixing was modelled between one spatial unit covered by intimately mixed H_2O , C_2H_6 and CH_3OH icy particles condensed



Figure 2: First surface model: spatial mixing between volatiles and refractories, the latter being intimately mixed together.



Figure 3: Second surface model: spatial mixing between volatiles and refractories, the latter being composed of ices condensed on tholins particles.

around core tholins, and a second unit composed of CH₄-ice to account for the possible presence of CH₄-ice
in the bedrock of Pluto. The spatial mixing ratio between the two units is again an unknown of the model.
A schematic representation of this second mixing model is provided in Figure 3.

An additional difficulty arises from the use of the Maxwell-Garnett model. While the simplified Hapke model only requires the single scattering albedo of the Pluto tholins ω_{tholins} , the Maxwell-Garnett model needs the associated optical constants n_{tholins} and k_{tholins} to compute the effective optical constants (see Equations 10, 11 and 12). The single scattering albedo of the effective medium is then computed from n_{eff} and k_{eff} and plugged in the Hapke model to compute the reflectance. However, assuming ω_{tholins} is known, there is no direct way to uniquely determine n and k from the single scattering albedo, as clearly shown in Equations 7 and 8.

A commonly used trick is to assume n constant and find the wavelength-dependent values of k that 355 fit the single scattering albedo. However, a constant value for $n_{\rm tholins}$ over our spectral range of interest 356 seems rather unrealistic considering the strong absorption in the visible, responsible for the observed red 357 slope. An alternative option is thus to use a set of n values available in the literature which reproduces the 358 photometric level of the tholins reasonably well. Using those n values, the k values are computed to match 359 the single scattering albedo, relying on the fact that most of the spectral information is carried by k. This 360 second method is expected to provide more realistic estimates of tholins optical constants and was therefore 361 applied in this work, using the values of n provided in Khare et al. (1984) (see Section 5.4 for comparison 362 of different sets of tholins optical constants). More details about the numerical determination of the optical 363 constants n and k from ω are given in Appendix A.2. 364

365 4.3. Fitting the model to the New Horizons observations

We tried to reproduce New Horizons spectra using the models presented in Sections 4.1 and 4.2. The surface was modelled as a mixture between H_2O ice, hydrocarbon-rich ices (e.g. C_2H_6 , CH_3OH), CH_4 ice and tholins, as analogues for the dark material covering Cthulhu region. Except for the tholins, optical constants found in the literature were used for the other chemical components: H_2O -ice: Grundy et al. (2018); CH₄ice: Grundy et al. (2002); C₂H₆-ice: Quirico and Schmitt (1997); CH₃OH-ice: Trotta (1996); Cook et al. (2019). Most of these data are available online in the GhoSST database of the SSHADE infrastructure (www.sshade.eu).

For simplification purposes, the single scattering phase function of Cthulhu's surface was assumed to be isotropic and independent of wavelength (*i.e.* $P(g, \lambda) = 1$). This was mainly motivated by the fact that the phase functions of the surface constituents are unknown.

When computing the reflectance of the modelled surface, many parameters remained unknown, among which the relative abundance and mean particle diameter of each surface constituent. The macroscopic porosity parameter K was also left as a free parameter. An optimisation algorithm was thus applied in order to find the best fit with respect to the New Horizons spectra.

The final objective was to assess the relevance of Pluto tholins as analogues of the dark material covering 380 Cthulhu region. It was therefore of primary importance to not only match the near-infrared part of the 381 spectrum but also MVIC data, collected in the visible. The darkest regions of Pluto indeed present a very 382 strong red slope in the visible which is due to the dark material only, since ices have very high photometric 383 level in both the visible and the near-infrared. The fit was thus determined by computing the χ^2 with respect 384 to both MVIC and LEISA data. Because the MVIC instrument only sampled three different wavelengths 385 and therefore had a much poorer spectral resolution than the near-infrared spectrometer, MVIC data were 386 weighted to give them as much weight as the whole LEISA spectrum, strongly constraining Cthulhu spectra 387 in the visible. 388

Different optimisation algorithms were tested and tuned to find the best performing one, both in terms of convergence and computational effort. A simple genetic algorithm was eventually selected as offering the best trade-off between these two criteria for our particular problem (see Appendix B for further details on the optimisation process).

It must be stressed that the global optimum was neither targeted nor achieved with the optimisation process described above. The number of parameters to estimate and the search space were both too large, and critical information was missing to precisely reproduce the reflectance of Cthulhu's surface. However, the main interest of this approach was not to estimate the exact amount of tholins and/or icy species present in the Cthulhu region. It was rather to determine whether modelling the reflectance of tholins mixed with different ices could help reproducing the spectra collected by the New Horizons spacecraft. This also made our simplifying assumptions acceptable here (*e.g.* isotropic phase function).

5. Experimental results

The size and shape of Pluto tholins were first characterised from Scanning Electron Microscopy (SEM) observations. The laboratory reflectance measurements were then analysed, to better understand the reflectance properties of our tholins and thus make the comparison with New Horizons spectrophotometric data possible.

405 5.1. SEM observations

The SEM analysis was performed on the two types of Pluto tholins (5%CH₄ and 1%CH₄, respectively), with the JEOL JSM-840A SEM at University Paris VI and the ZEISS Ultra55 FEG-SEM at CMTC INP Grenoble operating at 10 kV. It revealed tholins are very regular spherically-shaped particles, which sometimes agglutinate to form larger aggregates. The difference in initial gas mixture composition leads to some disparities in the physical properties of the synthesised particles. 5%CH₄ tholins overall show more regular shapes than 1%CH₄ ones. They appear as almost spherical, while the 1%CH₄ tholins particles present more irregularities, still being spherically-shaped (see Figure 4).

From SEM observations, the grain size distribution of Pluto tholins was estimated by measuring the apparent radius of tholins particles, averaged over a few hundred particles for each of the two tholins compositions (see Figure 5). The mean radius of both 5%CH₄ and 1%CH₄ tholins particles was estimated equal to 210 nm although the median is lower, especially for 1%CH₄ tholins (around 200 nm). The grain size distribution of 5%CH₄ tholins is slightly narrower (standard deviation $\sigma = 35$ nm) than that of the 1%CH₄ tholins ($\sigma = 55$ nm), an observation already made for Titan tholins (Hadamcik et al., 2009). The



(a) 5%CH₄ tholins.

(b) 1%CH₄ tholins.

Figure 4: SEM observations of the two types of Pluto tholins. In both samples, tholins are submicrometer-sized spherical particles. 1%CH₄ tholins however present more irregularities and show more diverse shapes compared to 5%CH₄ tholins. 1%CH₄ tholins also seem to present a wider range of sizes.



Figure 5: Grain size distribution derived from SEM observations. Both distributions have an average radius of about 210 nm, although the median is slightly lower for 1%CH₄ tholins (around 200 nm). The size distribution of 1%CH₄ tholins is broader, with a standard deviation of $\sigma = 55$ nm, compared to that of 5%CH₄ tholins ($\sigma = 35$ nm).

more irregular shapes of 1%CH₄ tholins might introduce some additional uncertainty in the mean diameter estimation, but cannot fully account for the much wider dispersion of the mean radius values. The difference in the dispersion of the grain size distribution is clearly observable even without performing any statistical analysis from the SEM images (see Figure 4).

⁴²³ 5.2. Reflectance spectra as a function of the geometry

The influence of the illumination and emergence geometry is clearly visible from our laboratory reflectance measurements. Figure 6 displays the reflectance spectra of 5% CH₄ tholins in the 0.4-2.5 μ m range. These spectra were obtained under a constant incidence angle set to 0°, but with varying emergence angles (ranging from 10° to 70°), and thus with changing phase angles. The photometric level strongly reduces with increasing phase angle. However, the absorption features are only slightly affected by the geometry variations, becoming



Figure 6: Influence of the observation geometry on the reflectance spectra for 5%CH₄ tholins.

429 shallower when the phase angle increases.

Figure 7 also illustrates the evolution of the tholins reflectance with varying incidence and emergence 430 angles. For each of the three incidence values $(0^{\circ}, 30^{\circ} \text{ and } 60^{\circ}, \text{ respectively})$, the reflectance is displayed as a 431 function of the emergence angle, for four different wavelengths (all comprised in the New Horizons spectral 432 range). The tholins tend to reflect the incident light backwards, which is in agreement with the fact that the 433 reflectance decreases with increasing phase angle. Such a backscattering could possibly be due to the very 4 34 small size of the tholins particles (comparable to the wavelength). From both Figures 6 and 7, it is clear 435 that the observation geometry effects need to be accounted for, and that the comparison between laboratory 436 measurements and New Horizons data is only meaningful if conducted at similar incidence, emergence and 437 phase angles. 438

Figures 6 and 7 only display results obtained with the 5%CH₄ tholins but identical reflectance measure-439 ments were conducted with the 1%CH₄ sample. There is no noticeable difference between the two types of 440 Pluto tholins when looking at the photometric behaviour (1%CH₄ tholins are also characterised by a strong 441 backscattering behaviour). However, the composition of the initial gas mixture of the tholins synthesis has a 442 strong influence on the shape and absolute level of the reflectance spectra. Both 5%CH₄ and 1%CH₄ tholins' 443 spectra are provided in Figure 9 (geometry: $i = 0^{\circ}, e = 30^{\circ}$). Reducing the relative amount of CH₄ in the 444 synthesis gas darkens the resulting tholins, in agreement with previous findings for Titan tholins (Mahjoub 445 et al., 2012). 1% CH_4 tholins show a slightly lower reflectance level in the near-infrared. They also exhibit a 446 more progressive increase of reflectance in the visible, but a steeper slope in the very near-infrared (1.0-1.3)447 μ m). These differences between the two types of tholins become of particular interest when comparing the 448 laboratory reflectance spectra with New Horizons data (see Section 6). 449

5.3. Photometric and spectral effects of mixing tholins with a darkening agent

The deposition and mixture of opaque interplanetary dust grains with the dark red organic material could darken and change the spectral contrast of Pluto's surface with time. It is thus crucial to quantify the effect of mixing Pluto tholins with a darkening agent on both the photometric level and spectral constrast. To this end, the reflectance measurements of Pluto tholins mixed with pyrrhotite (introduced in Section 3.1) are provided in Figure 8.

Figure 8 shows that even extremely small amounts of pyrrhotite strongly darken the tholins after 0.8 μ m: a pyrrhotite/tholins mass ratio of 1/200 decreases the photometric level by about a factor 2 in the nearinfrared. The absorption features are still present and clearly identifiable in the spectra of the darkened tholins, even for relatively large amounts of pyrrhotite. The implications of these experimental results are further discussed in Section 7.



Figure 7: 5%CH₄ tholins reflectance in polar coordinates, for incidences of 0°, 30° and 60° (upper, middle and lower panels respectively), under various emergence angles (from -70° to +70°), and at four different wavelengths: $\lambda = 0.6 \ \mu m$ (blue curve), $\lambda = 1.0 \ \mu m$ (orange curve), $\lambda = 1.8 \ \mu m$ (yellow curve) and $\lambda = 2.4 \ \mu m$ (purple curve). The incidence angle is represented by the red line.

⁴⁶¹ 5.4. Comparison with optical constants of tholins from literature

We investigated whether optical constants derived for other tholins samples and already available in the literature could be used to reproduce the reflectance of the Pluto tholins analysed in this work. Various types of tholins were previously synthesised and analysed in the literature, mostly to characterize Titan aerosols (Brasse et al., 2015). Multiple techniques exist for the tholins synthesis (*e.g.*, Coll et al., 2013), each of them associated with very different experimental conditions (various temperature and pressure conditions, energy source, gas flow rate, irradiation duration, *etc.*).

The final composition of the tholins particles, and therefore their optical constants, depend on the technique employed to synthesise them. Additionally, the method used to measure the optical constants also influences their values (Brasse et al., 2015). For these reasons, optical constants of tholins available in the literature are very different from one sample and from one measurement technique to another.

An attempt was made to compare the reflectance measurements performed on our N_2 :CH₄:CO tholins with spectra calculated from various N_2 :CH₄ Titan tholins' optical constants available in the literature (Brasse et al., 2015). Results of this comparison are displayed in Figure 9. It is especially interesting to note that very diverse slopes are obtained in the visible, even between tholins synthesised from initial gas mixtures with similar composition. Unfortunately, none of the available optical constants sets led to a proper fit of our laboratory spectra.

⁴⁷⁸ Optical constants presented in Mahjoub et al. (2012) and Sciamma-O'Brien et al. (2012) were determined ⁴⁷⁹ from tholins synthesised under similar conditions and using the same experimental setup as the Pluto tholins



Figure 8: Reflectance computed from inverted single scattering albedo of 1%CH₄ tholins with various pyrrhotite mixing mass ratios ($i = 0^{\circ}$, $e = 30^{\circ}$, $g = 30^{\circ}$, D = 400 nm, P = 1, K = 1).

analysed in this study. But, even these optical constants measured on rather similar samples could not 480 reproduce the reflectance spectra obtained from our laboratory measurements. The simulated reflectance 481 spectra obtained with the optical constants of their 5% CH₄ tholins show a steeper red slope in the visible, 482 which is also shifted towards lower wavelengths compared to our laboratory measurements. On the other 483 hand, the slope of their 1% CH₄ tholins is much weaker. Moreover, the reflectance level of our Pluto 484 tholins is much higher in the near-infrared. It must however be stressed out that the synthesis process was 485 significantly different between our Pluto tholins (powder material synthesised while in suspension in the 486 plasma discharge, see Section 3.1) and the Titan tholins analysed in the above-mentioned studies (organic 487 films deposited on various substrates). 488

On the contrary, optical constants presented in Khare et al. (1984) reproduce the 5%CH₄ tholins' visible spectral slope and very near-infrared photometric level reasonably well (see Figure 9). These optical constants are the most commonly used, but they have a poor spectral resolution. Despite the relatively good fit in the 0.4-1.3 μ m range, the four absorption bands observed above 1.3 μ m in our laboratory spectra do not appear in the simulated spectra obtained with the optical constants found in Khare et al. (1984).

⁴⁹⁴ 5.5. Retrieving single scattering albedo from reflectance measurements

The previous analysis of existing sets of optical constants clearly showed that it is not possible to reproduce our laboratory reflectance measurements from optical constants found in the literature. Consequently, the single scattering albedo of the Pluto tholins needs to be determined in a different way. It is possible to isolate and estimate it from the many reflectance spectra collected under various geometries. Indeed, the phase function $P(g, \lambda)$ and the single scattering albedo $\omega(\lambda)$ are the only unknowns in the simplified Hapke model formulation given by Equation 1.

While the single scattering albedo depends on the wavelength only, the phase function P depends on both the wavelength and the phase angle g. The wavelength-dependency of the phase function is however relatively weak (Hapke, 1993, 2012a) and was thus neglected in this analysis. The single scattering albedo therefore accounts for the full spectral information, while the phase function P(g) is a function of the illumination and observation geometries only.

The laboratory reflectance measurements collected under different illumination and observation conditions, and over a wide spectral range, were all combined together. A non-linear least-squares inversion of the simplified Hapke model was then applied to retrieve the functions $\omega(\lambda)$ and P(g). There was no more correlation between the single scattering albedo and the phase function, and therefore they could be estimated simultaneously. Because the reflectance model is highly non-linear, the inversion required an iterative process, converging towards an unique solution by successive differential corrections from a given initial



Figure 9: Reflectance calculated from various optical constants to try matching the laboratory measurements (simplified Hapke model as given in Equation 1, with $i = 0^{\circ}$, $e = 30^{\circ}$, $g = 30^{\circ}$, D = 400 nm, P = 1, K = 1).

⁵¹² guess. Some convergence issues were first encountered because of the intrinsic constraints of the single scat-⁵¹³ tering albedo values (ranging from 0 to 1). A numerical singularity indeed exists when ω tends towards its ⁵¹⁴ maximum value, and deteriorates the convergence of the least-squares algorithm. An extended grid search ⁵¹⁵ simulation was thus run to identify a good initial guess to initiate the least-square algorithm. More details ⁵¹⁶ about the numerical procedure for the inversion of the Hapke model are provided in Appendix A.1.

The results of the Hapke's model inversion are presented in Figures 10 and 11. The consistency between 517 the grid-search and least-squares solutions for the single scattering albedo is a good indicator of the con-518 vergence of the inversion. The solutions obtained for the phase function for both the 5% CH_4 and 1% CH_4 519 tholins are also insightful. While the phase functions generated by the grid-search analysis are different for 520 the two tholins, the converged least-squares solutions are conversely extremely similar (see Figure 11). Such 521 significant differences between the phase functions of the two types of tholins obtained from the grid-search 522 analysis solutions are not expected, clearly showing the limitations of the initial guess provided by the 523 grid-search. The results on the phase function also highlight the good convergence of the hybrid inversion 524 technique and demonstrate the improvement brought by the least-squares algorithm compared to the coarse 525 grid-search solution. 526

The single scattering albedo of Pluto tholins exhibits a very steep red slope in the visible, which seems consistent with the New Horizons observations collected over the dark-red terrains of Pluto. In the nearinfrared, ω is very close to 1, in agreement with our laboratory reflectance spectra which show tholins as extremely bright in the near-infrared. It also explains the difficulties encountered by the simple least-squares algorithm to converge to an unique solution so close to the numerical singularity if not combined with a prior grid search analysis.

Furthermore, most of the spectral information seems to be captured by the inverted single scattering albedo. This also proves that the inversion was successful, since ω was the only parameter assumed to be wavelength-dependent. The four absorption bands identified in our laboratory spectra are indeed present in the inverted single scattering albedo. Finally, the phase function is globally decreasing with increasing phase angle. This finding is in agreement with the strong backscattering observed in Figure 7. For both the 1%CH₄ and 5%CH₄ tholins, the inverted single scattering albedo values are reported in Table A.1 (as a function of the wavelength) and the phase functions can be found in Table A.2 (see Appendix A.3).

⁵⁴⁰ 6. Comparison with MVIC/LEISA observations

Using Pluto tholins' reflectance properties as described in Section 5, their relevance as analogues for the dark red material covering Cthulhu region was assessed by comparing their reflectance spectra with the New



Figure 10: Single Scattering Albedo $\omega(\lambda)$ after inversion of the Hapke model, for 5%CH₄ tholins. The Monte-Carlo solution (displayed in light blue) is still an unconverged solution, only used as an initial guess for the linearised least-squares iterative process



Figure 11: Phase function P(g) after inversion of the Hapke model, for both 5% CH₄ and 1% CH₄ tholins.

⁵⁴³ Horizons data collected by the Ralph instrument when flying over Cthulhu.

6.1. Direct comparison of laboratory and New Horizons data

545 6.1.1. Reflectance spectra

Before trying to reproduce the New Horizons data using numerical models exposed in Section 4, Cthulhu spectra were directly compared with laboratory reflectance measurements of Pluto tholins. The comparison was performed at identical illumination and observation geometries, to prevent any bias in the photometric level caused by a difference in the measurement geometries. The laboratory spectra were convolved to match the spectral resolution of the New Horizons observations, which in turn were corrected to account for photometric calibration issues.

Figure 12 shows the superposition of Cthulhu reflectance spectra with those of the pure tholins samples, under the same geometry. Despite a good agreement at first order for the 1%CH₄ tholins, there are striking differences between tholins' and New Horizons' spectra, both spectrally and photometrically. The four



Figure 12: Direct comparison between New Horizons spectra (H_2O -poor and H_2O -rich regions) and laboratory reflectance measurements of 5% CH_4 and 1% CH_4 tholins (under same illumination and observation geometry).

absorption bands in tholins laboratory spectra (at 1.5, 1.75, 2.0 and 2.3 μ m) are completely absent in the New Horizons spectra, and the same holds for the spectral features observed in New Horizons data which do not appear in the tholins spectra.

In addition, Figure 12 clearly highlights the influence of the tholins composition. In the near-infrared, the reflectance of 1%CH₄ tholins is much closer to New Horizons spectra in terms of photometry (being about 20% lower than that of 5%CH₄ tholins on average). The red slope displayed by the 1%CH₄ tholins in the visible is also more consistent with MVIC data.

6.1.2. Absorption bands in laboratory reflectance spectra

The reflectance spectra of the tholins show several absorption features in the near-infrared, as displayed in Figure 13. As mentioned above, four bands clearly appear in the laboratory measurements at about 1.5 μ m, 1.75 μ m, 2.0 μ m and 2.3 μ m.

Additional reflectance measurements were conducted on CO-depleted N_2 : CH₄ tholins to quantify how the 566 presence of a small amount of CO in the initial gas mixture affects the tholins spectro-photometric properties. 567 The result of this comparative analysis is displayed in Figure 14, but no significant spectral difference and/or 568 band shift can be observed between the tholins with and without CO. The small difference in photometric 569 level can be at least partly attributed to slightly different properties of the samples (grain sizes, density, 570 compaction, etc.). These results indicate that the presence of CO is not responsible for any additional 571 spectral signature in the tholins reflectance spectra. The absorption bands observed in tholins spectra are 572 thus more likely due to bonds between C, H and N compounds rather than to bonds involving oxygen. 573

The band around 1.75 μ m appears to be deeper and wider for 5%CH₄ than for 1%CH₄ tholins. It can be assigned to the first overtone of the [C-H] bond (Workman, 1996). This is in agreement with the fact that 5%CH₄ tholins are expected to contain more [C-H] bonds, explaining the stronger absorption of this feature for 5%CH₄ compared to 1%CH₄ tholins.

The absorption feature around 2.25-2.3 μ m is thought to be related to the first overtone of the stretching 578 mode of $[C \equiv N]$ bonds, as proposed in Cruikshank et al. (1991). Another possible interpretation for this 579 band was proposed by Cloutis (1989), assigning it to combination of aromatic carbon stretch with [C-H] 580 stretching modes, and combinations of [C-H] stretching and bending modes. However, the shape and depth 581 of this band does not seem to strongly depend on the N_2/CH_4 ratio of the initial gas mixture from which 582 the tholins are synthesised, on the contrary to what has been observed for the 1.75 μ m band. The fact that 583 this 1.75 μ m absorption feature conserves its shape, width and depth in the reflectance spectra of the two 584 types of tholins thus appears more consistent with its assignment to $[C \equiv N]$ bonds rather than to [C = C] and 585



Figure 13: Bands assignment for laboratory reflectance spectra of 5%CH₄ and 1%CH₄ tholins (geometry: $i = 0^{\circ}$, $e = 30^{\circ}$).

586 [C-H] combinations.

The two remaining bands, located around 1.5 μ m and 2.0 μ m respectively, could at prima facie corre-587 spond to H_2O absorption features. However, as mentioned in Section 3.2, additional laboratory reflectance 588 measurements were conducted under vacuum and after heating to verify that adsorbed water was not respon-589 sible for any absorption band. The 1.5 μ m band is thus more likely related to the first stretching overtone 590 of [N-H] bonds, while the 2.0 μ m band can be due to some combinations of [N-H] bending and stretching 591 modes (Workman, 1996). Nevertheless, it must be noted that the presence of those amine functions could 592 be partially related to the synthesis experimental setup, as the formation of nitrogen-bearing compounds is 593 enhanced by wall effects. 594

The assignment of some tholins' near-infrared absorption bands to [C-H] and [N-H] functions is consistent with previous findings showing that these functions contribute to N_2 :CH₄ tholins' mid-infrared spectra (Quirico et al., 2008; Gautier et al., 2012).

6.1.3. Absorption bands in New Horizons spectra

The New Horizons spectra show two main absorption features (see Figures 1 or 12). The first one is located around 2.1 μ m. When getting closer to Cthulhu periphery where water ice exists in larger quantities, the H₂O band is contributing to this absorption feature. However, this band still appears in the centre of Cthulhu (*i.e.* in the reddest terrains of Pluto), where very little water ice is expected (as other H₂O absorption bands are not present there). The interpretation of this band is still not firmly resolved (Schmitt et al., 2017).

In addition, another absorption feature is observed around 2.3 μ m in the Cthulhu region. Its presence 605 is however thought to be related not to the dark organic material itself, but rather to some hydrocarbon 606 ices with which the red material is expected to be mixed (Cook et al., 2019). Oddly, the shape and depth 607 of this band remain unchanged from Cthulhu's centre to its periphery. The presence of more water ice on 608 the borders of Cthulhu would suggest that the red material is more diluted in water ice there, and more 609 concentrated in Cthulhu's centred, reddest parts. The fact that the 2.3 μ m band seems independent of the 610 relative amounts of dark material and water ice favours the assignment of this band to hydrocarbon ices, as 611 suggested in Cook et al. (2019). Furthermore, both Cthulhu spectra exhibit two additional weaker bands at 612 about 1.3-1.35 μ m and 1.8-1.85 μ m, which might also be linked to these hydrocarbon ices. Figure 15 shows 613 near-infrared spectra of possible hydrocarbon-ices candidates C_2H_6 , C_3H_8 and CH_3OH , superimposed upon 614 New Horizons Cthulhu spectra. 615



Figure 14: Comparative reflectance measurements of tholins with and without CO: 5%CH₄ (or 1%CH₄) tholins without CO compared to 5%CH₄ (or 1%CH₄) tholins with 500 ppm CO (for CO-depleted tholins, measurements were only conducted from $\lambda = 0.68 \ \mu$ m).



Figure 15: Absorbance spectra of three hydrocarbon ices (C_2H_6 , C_3H_8 and CH_3OH) which are potential candidates for the 2.3 μ m band observed in Cthulhu's New Horizons near-infrared reflectance spectra (displayed here in blue and red for Cthulhu H₂O-rich and H₂O-poor regions, respectively).

616 6.2. Optimised fitting between New Horizons data and simulated reflectance

The optimisation process described in Section 4.3 was applied to investigate whether the New Horizons spectra could be reproduced by combining the laboratory reflectance measurements of Pluto tholins (Section 5.2) with the numerical models developed in Sections 4.1 and 4.2.

To account for the diversity of the New Horizons spectra measured over the dark terrains of Pluto, we tried to reproduce the reflectance behaviour of both Cthulhu's H_2O -rich region and H_2O -poor regions, as discussed in Section 2.3. The latter corresponds to the reddest terrains of Pluto and is thus expected to contain the largest relative amounts of the dark Plutonian material.



(a) H₂O-rich Cthulhu region.

(b) H₂O-poor Cthulhu region.

Figure 16: Optimisation results for H_2O -rich region of Cthulhu (left) and H_2O -poor region of Cthulhu (right), using the intimate mixing model described in Section 4.2.2 (*i.e.* spatial mixing between a CH_4 -ice unit and an intimate mixing of tholins, H_2O -ice, CH_3OH -ice and C_2H_6 -ice). Results are provided for both 5% CH_4 and 1% CH_4 tholins (in red and light blue, respectively).

624 6.2.1. Intimate mixing between refractory species

The fitting process was first applied to the simple intimate mixing surface model presented in Section 4.2.2. For each species, both the mass fraction in the intimate mixture and particle mean diameter were left as free parameters of the optimisation process, in addition to the macroscopic porosity parameter K. For each set of free parameters, a Hapke model was applied to compute the reflectance of the modelled surface, allowing for a direct comparison with New Horizons spectra.

As shown in Figure 16, the best fits between the modelled surface reflectance and New Horizons spectra 630 were obtained with 1% CH₄ tholins for both H₂O-rich and H₂O-poor terrains of Cthulhu (about 44% and 631 49% of χ^2 improvement with respect to 5%CH₄ tholins for H₂O-rich and H₂O-poor regions, respectively). 632 This is in agreement with the direct comparison between New Horizons spectra and laboratory reflectance 633 measurements of pure tholins discussed in Section 5.2. As already highlighted, the tholins composition 634 $(N_2:CH_4 \text{ ratio})$ has a significant influence on the curvature and steepness of the red slope observed in the 635 visible. Modifying the initial composition of the gas mixture from which the tholins are synthesised might 636 therefore be key when trying to reproduce New Horizons spectra. The relative amounts of the refractory 637 species which led to the best fits are reported in Table 2, but should be treated cautiously given the poor 638 quality of the fits and the non-uniqueness of the optimisation solution. 639

Focusing on H₂O-rich regions first, the simulated reflectance of a mixing between tholins, hydrocarbon and water ices could not accurately reproduce the New Horizons spectrum, even with 1%CH₄ tholins. More precisely, the MVIC point at $\lambda = 0.86 \ \mu m$ is not matched and the average reflectance level in the nearinfrared of the simulated spectrum is lower than for LEISA spectrum. In particular, this yields a poor fit over the following spectral intervals: 1.3-1.5 μm , 1.65-1.9 μm , and 2.1-2.3 μm , as shown in Figure 16a. The H₂O band at 2.0-2.1 μm is also poorly reproduced.

The weighted MVIC data in the visible provide tight constraints on the required tholins ratio. It thus indirectly drives the average reflectance level in the near-infrared. Although the strong H_2O bands in the near-infrared helps the fitting process by constraining the relative amount of water ice required, the optimisation algorithm fails to reconcile the MVIC data points with high reflectance in the near-infrared.

The fit between the Hapke model and the New Horizons spectrum is significantly worse for the core, H₂O depleted regions of Cthulhu (see Figure 16b). Strong tholins' overtone/combination bands are present in the near-infrared, while they did not appear in the H₂O-rich spectrum due to the presence of clear H₂O bands. To reproduce the averaged spectrum collected over H₂O-poor regions of Cthulhu, H₂O-ice is indeed no longer needed, but matching MVIC data points requires a significant amount of tholins.

This induces a drop in reflectance around $\lambda = 1.9 \ \mu m$, consistent with the pure tholins spectra (see Figure 12). Around 1.9 μm , the reflectance of the modelled surface thus becomes much lower than for the



Figure 17: Optimisation results for H_2O -rich regions of Cthulhu (upper panel) and H_2O -poor regions of Cthulhu (lower panel), obtained with the two different surface models described in Sections 4.2.2 and 4.2.3: intimate mixing of all refractory species (in red) vs. intimate mixing of ices condensed around core tholins (in light blue). The two types of Pluto

New Horizons spectrum. In that spectral range, adding more ices to the model would only decrease the reflectance level further because of the hydrocarbon ices absorption bands. Consequently, the optimisation process failed not only to remove the tholins bands which are clearly absent in New Horizons data, but also

tholins were tested with this surface model (5% CH_4 for the top sub-figures and 1% CH_4 for the bottom sub-figures).

to reproduce the 2.1 μ m and 2.3 μ m New Horizons absorption bands (see Section 6.1.3). In the visible, the difference in the spectral slope is larger at $\lambda = 0.49 \ \mu$ m, but slightly slower at $\lambda =$

⁶⁶² 0.86 μ m, compared to the H₂O-rich region case.

It must be noted that scaling the MVIC data down or up by 7% (in agreement with the estimated calibration uncertainty, see Section 2.2) did not yield any noticeable change in the fit between the modelled spectra and New Horizons data.

666 6.2.2. Ices condensed on tholins particles

With the second surface model described in Section 4.2.3, the fraction of core tholins embedded in the surrounding ice matrix for each icy particle was added to the list of free parameters (already including the mass ratios of each component of the intimate mixing, as well as their respective mean diameters). The best fits obtained by the optimiser with this second surface model are provided in Figure 17.

Figure 17 compares the fits obtained with the two different surface models (intimate mixing in red, ices condensed around tholins in light blue), for H₂O-rich and H₂O-poor Cthulhu regions and with both 5%CH₄ and 1%CH₄ tholins. While no significant difference is noticeable between the two surface models for the H₂O-poor region case, modelling ices as condensed around core tholins yields a slightly better fit for H₂O-rich regions (about 10% and 34% of χ^2 reduction for 5%CH₄ and 1%CH₄ tholins, respectively). However, this limited improvement is to be put in perspective as the discrepancies between New Horizons data and the modelled reflectance spectra remain significant regardless of which model is used, especially for H_2O -poor regions. It is thus difficult to conclude about how realistic one surface model is compared to another.

Similar conclusions can overall be drawn from the optimisation results, compared to those obtained with the intimate mixing surface model (Section 6.2.1). 1%CH₄ tholins again performed better in reproducing New Horizons data than 5%CH₄ tholins (see Figure 17). They overall led to an improved fit, especially being closer to MVIC data in the visible and matching the photometric level better in the near-infrared. The relative mass ratios of the different refractory species corresponding to the best fits for this second surface model are also provided in Table 2.

The reflectance of the H₂O-rich region of Cthulhu is again reasonably well reproduced (see Figures 17a and 17b). However, the simulated spectrum still displays strong tholins absorption bands when little water ice is required while they do not appear in LEISA data (*i.e.* over H₂O-poor Cthulhu regions, see Figures 17c and 17d). Moreover, the misfit between the modelled spectra in the visible and MVIC data is far from being fully resolved by using this different surface model, for the point at $\lambda = 0.86 \ \mu m$ in particular.

It is interesting to note that when using the Maxwell-Garnett model to compute the optical constants 690 of ices condensed around tholins particles, the method selected to derive the value of n does not have 691 any significant effect. As detailed in Section 4.2.3, the method chosen in this work is to use the n values 692 provided in Khare et al. (1984) and compute the values of k which match the single scattering albedo of 693 our laboratory-synthesised tholins. However, the optimisation process was also conducted with a second 694 set of optical constants for the tholins, obtained by assuming n remains constant over the spectral range of 695 interest. No noticeable difference was observed between the results achieved with the two separate sets of 696 tholins optical constants. 697

	Intimate mixing model		Ices condensed around tholins		
	Species	Mass ratio [%]	Ices	Mass ratio [%]	
	H ₂ O	88.01	H ₂ O	99.92	
	C_2H_6	0.24	C_2H_6	0.04	
H O BICH BECION	CH ₃ OH	0.05	CH ₃ OH	0.04	
H20-KICH KEGION	1%CH ₄ tholins	11.70			
			Core particles	Fraction embedded material [%]	
]		1%CH ₄ tholins	18.50	
	Intimate mixing model		Ices condensed around tholins		
	Species	Mass ratio [%]	Ices	Mass ratio [%]	
	H ₂ O	0.04	H_2O	80.81	
H ₂ O-POOR REGION	C_2H_6	0.08	C_2H_6	16.97	
	CH ₃ OH	0.02	CH ₃ OH	2.22	
	1%CH ₄ tholins	99.86			
			Core particles	Fraction embedded material [%]	

Table 2: Relative amounts of materials which led to the best fits between the reflectance model and New Horizons spectra, when using 1%CH₄ tholins as an analogue for Cthulhu's dark-red material. The values reported in this table are the mass ratios of all refractory species within the first surface unit (*i.e.* refractory unit, see Sections 4.2.2 and 4.2.3) and are given in percentage. Results are provided for the two different surface models and for both H₂O-rich and poor regions. It must be noted that these values must be considered extremely carefully, because of both the non-uniqueness of the solution and poor quality of the fits.

7. Discussion

Because of the remaining discrepancies between the modelled surface spectra and New Horizons data (see Section 6.2), we cannot yet draw any firm conclusion about the surface's composition and properties in Cthulhu region, and in particular about the exact chemical nature of the red material. Reliable information about the surface can indeed only be derived from Hapke model's parameters when both the photometric level and spectral features are properly fitted.

 $_{704}$ Especially, as previously highlighted, the simulated spectra for H_2O -poor terrains still display tholins

absorption features which are absent in LEISA observations. Assuming that the presence of these features is
 not only due to experimental limitations discussed in Section 6.1.2, three possible explanations are discussed
 here.

The terrains may be contaminated by interplanetary dust, bringing dark material into the aerosol layer. 708 However, to completely attenuate the tholins bands and thus explain their absence in New Horizons spectra. 709 a significant fraction of darkening material would be needed, which would lead to a severe drop in reflectance 710 (see results presented in Section 5.3). This seems rather inconsistent with the high reflectance observed in 711 the near-infrared in LEISA data. We still tried to reproduce New Horizons spectra using darkened tholins 712 mixed with water and hydrocarbon ices. However, the fit between the modelled surface and the spectra 713 collected by the MVIC and LEISA instruments was worse than the one obtained with pure tholins samples 714 (figures are not shown as the extremely poor quality of the fit does not convey any valuable information). 715 The absence of absorption features thus cannot be explained by interplanetary dust contamination of the 716 red material, as the drop in reflectance it would induce in the near-infrared was shown to be incompatible 717 with the high photometric level measured by LEISA over the Cthulhu region. 718

As a second hypothesis, Galactic Cosmic Rays (GCR) irradiation is known to promote dehydrogenation 719 reactions, formation of unsaturated bonds (olefinic or acetylenic), cross-linking and disorder (Balanzat et al., 720 1995). This phenomenon could explain the darkening of tholins and the attenuation of their absorption 721 features, and might therefore justify the absence of absorption bands in New Horizons spectra. This would 722 likely affect the photometric level in the near-infrared as well, and not only the spectral contrast. Radiolysis 723 could also have an effect on the shape of the spectral slope in the visible through the production of conjugated 724 unsaturated carbons, which might alter the current fit of the spectral slope for the H_2O -poor terrains of 725 Cthulhu. The irradiation dose for a tholins grain on the surface of Pluto can be estimated using the proton 726 flux of Webber and Yushak (1983), assuming the contribution of heavier ions by scaling the proton flux 727 density with their cosmic abundance (Meyer et al., 1998). Here, it is assumed that the GCR density flux 728 is that of local Interstellar Medium, neglecting heliospheric shielding. We also neglect the energy loss 729 of the incoming ions in Pluto's atmosphere. This estimate is therefore an upper value. The electronic and 730 nuclear stopping powers, S_e and S_n , respectively, were calculated with the SRIM software for a H:C:N=1:1:1 731 stoichiometry and a tholins density $\rho = 1$ g.cm⁻³ (Ziegler and Manoyan, 1988). The dose can then be written 732 as 733

$$Dose[eV.at^{-1}]_{e,n} = \Delta t \frac{4\pi M}{\rho N_A} \sum_{Z=1}^{92} \int_{E_{min}}^{E_{max}} A(Z) \frac{dN}{dE} S_{e,n}^Z dE,$$
(13)

where M is the molar mass, N_A the Avogadro number, E_{min} and E_{max} the edges of the energy range, $\frac{dN}{dE}$ the proton flux density from Webber and Yushak (1983), A(Z) the relative abundance of element Z relative to hydrogen and Δt is the irradiation time.

The irradiation time of a given grain in the aerosol layer depends on the deposition rate and the pen-737 etration depth of ions, which is controlled by its mass and energy. Figure 18 reports the GCR density 738 flux plotted versus the penetration depth for H and Fe ions, which are the lightest and heaviest abundant 739 ions that contribute to the deposited dose. In the case of protons, 99% of GCR energy is deposed within 740 0-24 m. The aerosol layer (roughly estimated to be of the order of 10 m, Grundy et al., 2018) was then 741 totally irradiated during 4.55 Gyrs, but a given grain within this layer received a varying dose due to the 742 continuous aerosol deposition. In contrast, the iron ions deliver 99 % of GCR energy in the range 0-0.48 m, 743 which corresponds roughly to an aerosol deposition duration of 140 Myrs. 744

The probing depth of visible and near-infrared photons can be estimated to 1 mm, as the mean optical path length calculated from Hapke theory (Clark and Roush, 1984). This depth corresponds to an irradiation time of 280000 years with the sedimentation rate of Grundy et al. (2018). This leads to upper values of the electronic and nuclear doses deposited in this thin layer of 2.4×10^{-2} eV.atom⁻¹ and 10^{-5} eV.atom⁻¹, respectively. The electronic dose is small and may lead to weak or moderate chemical and structural changes, according to previous studies on polymers degradation (*e.g.* Balanzat et al., 1995; Faure et al.,



Figure 18: GCR flux density and fraction of GCR flux density deposited in the aerosol layer plotted against the penetration depth for Iron (top) and Hydrogen (bottom).

2021). Therefore, we expect a limited effect on the chemical and optical properties of aerosols. However,
these results need to be confirmed by dedicated irradiation experiments on tholins.

Finally, a high porosity of the dark terrains is another possible explanation for the lack of strong ab-753 sorption features caused by the dark material in New Horizons data. Laboratory experiments showed that a 754 highly porous tholins crust, formed from sublimation experiments, does not display combination / overtone 755 bands in the near-infrared (Poch et al., 2016). It must be stressed that such micro-porosity effects are by 756 definition not accounted for by the macroscopic porosity parameter K in Hapke model, and are thus not 757 included in our work. Figure 19 reports the reflectance spectra of a mixture of water-ice, olivine, $N_2:CH_4 =$ 758 95%:5% tholins (without CO) and smectite, collected before and after sublimation and presented in Poch 759 et al. (2016). The reflectance of our Pluto tholins is displayed as well, and the absence of any remarkable 760 spectral feature in the post-sublimation measurements is clear (from neither tholins nor any of the other 761 species). 762

Evidences for N_2 and CH_4 sublimation cycles on Pluto's surface were described in Schmitt et al. (2017); Bertrand et al. (2018, 2019), but these sublimation cycles do not appear to involve Cthulhu region. This region is actually supposed to be depleted of N_2 -ice (N_2 being too volatile to subsist in these hot, low albedo areas). Moreover, the very small amounts of CH_4 detected in Cthulhu are mainly located on mountains (Bertrand et al., 2020), while there is no spectral evidence for CH_4 in the reddest, H_2O -poor Cthulhu terrains. Only a very thin CH_4 condensation layer may occur during night (Bertrand et al., 2020).



Figure 19: Reflectance spectra of our two Pluto tholins, superimposed with results of a sublimation experiment from Poch et al. (2016): a mixture of water-ice with olivine (1%), N₂:CH₄ = 95%:5% tholins (0.5%) and smectite (0.1%) underwent sublimation at low temperature (-70°C) and pressure ($1-2\cdot10^{-5}$ mbar). The reflectance spectra of this mixture are displayed before sublimation, and about 40 h afterwards, after formation of a sublimation mantle on top of the sample (see Figure 5e in Poch et al. (2016)).

However, the lack of strong evidence for CH4 sublimation cycles in Cthulhu region after New Horizons' flyby does not completely rule out the possibility of this region being covered by CH4 frosts during other seasons or obliquity periods. Even without sublimation cycles, deposition of light aerosols at very low temperature and under the weak gravity acting on Pluto could anyway promote the formation of highly porous surfaces, which do not show bands in the near-infrared. Again, this hypothesis requires further investigation. Simulating porous surfaces via sublimation of a Pluto tholins/ice mixture or via gentle sedimentation of Pluto tholins at low temperature would be an interesting future step, in order to assess how the porosity affects their reflectance spectrum.

777 8. Conclusions

Different hypotheses still coexist to explain the origin and composition of the non-icy, reddish material 778 covering Pluto's dark terrains. They include irradiation of the surface ices (Cruikshank et al., 2015), as well 779 as formation of complex, macromolecular organic compounds in a warm liquid ocean created by the giant 780 impact which formed both Pluto and Charon (Sekine et al., 2017). It has also been suggested that Pluto's 781 dark material could consist of deposited aerosols originating from the dissociation and ionisation of Pluto's 782 atmospheric gases (e.g. Cheng et al., 2017; Grundy et al., 2018). This would be in agreement with the recent 783 findings exposed in Protopapa et al. (2020) according to which a single colouring agent could explain the 784 whole diversity of Pluto's surface colours. In this perspective, this study led to a better characterisation 785 of the reflectance properties of two types of Pluto tholins, to assess their relevance as plausible aerosols 786 analogues for the vet unidentified reddish material covering Cthulhu region. 787

The reflectance spectra of these tholins were collected under various illumination and observation geome-788 tries, highlighting a strong backscattering behaviour. We then numerically retrieved Pluto tholins' single 789 scattering albedo and phase function from their reflectance measurements, by inverting a simplified Hapke 790 model. Feeding these optical properties into a simplified Hapke reflectance model, an optimisation process 791 was set up to assess whether it is possible to reproduce New Horizons spectra with our reflectance model 792 while using Pluto tholins as analogues for the dark material. A mix of tholins and CH₄, H₂O, CH₃OH, and 793 C_2H_6 ices was assumed and two different surface models were tested (intimate mixing between all refractory 794 species and condensation of icy species around core tholins particles, respectively). 795

1% CH₄ tholins overall led to significantly better fits than 5% CH₄ tholins. Especially, they better match

the MVIC data in the visible and the average photometric level in the near-infrared. This indicates that slightly changing the composition of our Pluto tholins might improve the fit with respect to New Horizons data. Still, our optimisation algorithm failed to fit the three MVIC data points perfectly, even with 1%CH₄ tholins. This misfit in the visible needs to be investigated further, especially since reproducing the strong red slope that Cthulhu's spectra exhibit is key to unravel the composition and origin of the dark red material covering this region of Pluto.

New Horizons data collected over the H_2O -rich region of Cthulhu are easier to reproduce with our surface reflectance model than H_2O -poor region' spectra. The strong H_2O absorption bands dominate the nearinfrared part of the H_2O -rich region' spectrum and hide the absorption bands clearly visible in the tholins spectra. On the other hand, the four absorption features of Pluto tholins appear in the simulated spectra of H_2O -poor region, while they are absent in New Horizons data.

The presence of the tholins bands in the modelled spectra prevented the optimisation algorithm from 808 reproducing the near-infrared features of the New Horizons spectrum. It is therefore crucial to understand 809 which phenomena could explain such an attenuation of the spectral contrast before concluding about how 810 representative tholins are of the dark red organic material on Pluto. The possible supply in dark material 811 brought by impacting interplanetary dust particles does not seem to be a very plausible hypothesis, since 812 mixing tholins with a darkening agent tends to strongly decrease the reflectance level and not only remove 813 the absorption bands. The effect of GCR irradiation remains to be further investigated, but its contribution 814 might likely be insufficient. However, the effect of a high porosity in the Cthulhu terrains might provide 815 an explanation for the lack of strong absorption features in New Horizons spectra, and also requires deeper 816 analyses. 817

The presence of some of the absorption bands in Pluto tholins' reflectance spectra could also be partially 818 related to the way they are synthesised. This more precisely concerns the two bands related to amine 819 functions (*i.e.* 1.5 μ m and 2.0 μ m bands, see Section 6.1.2). The formation of amine functional groups is 820 indeed known to be enhanced by wall effect in the PAMPRE experimental setup, which could explain the 821 intensity of some of the absorption bands. Another point is that the tholins synthesis was conducted at room 822 temperature, while the formation of haze particles occurs at much lower temperature in Pluto's atmosphere. 823 To our knowledge, no tholins were collected at low-temperature in cold plasma reactors. Bernard et al. 824 (2003, 2006) and Brucato et al. (2010) used a cryogenic trap in their experiments to collect volatile species, 825 but their samples were synthesized at room temperature and cannot be used as low-temperature tholins (as 826 mentioned in Brasse et al., 2015). Some temperature effects are however expected, such as the condensation 827 of free molecules that would result in an increase of the soluble organic fraction. Nevertheless, we still expect 828 the presence of similar functional groups as in tholins synthesised so far and we therefore do not foresee any 829 significant impact on our conclusions. 830

Finally, all our analysis is based on extremely limited reflectance models, the simplicity of which might affect our simulated spectra. The isotropic phase function assumption may for instance alter the photometric level, but also the spectral slope and the band depths. Pluto tholins show a strong backscattering behaviour (see Section 5.2), while ices are on the contrary characterised by a strong forward-scattering. The variations of the phase function as a function of both the geometry and the wavelength are thus hard to predict, making the isotropic assumption a severe limitation of our current model.

It must also be stressed that there is no guarantee of the solution's uniqueness when fitting a Hapke
reflectance model to an existing spectrum. Nonetheless, this does not hinder the relevance of our approach
since we are not estimating specific surface properties from our best fit, but are only trying to reproduce
Cthulhu's reflectance using tholins as analogues for Pluto's dark organic material.

Finally, the optical properties of our Pluto tholins (including optical constants n and k) were retrieved from a purely numerical inversion of a highly simplified radiative transfer model, applied on reflectance measurements performed on a complex medium. However, to rigorously extract optical constants, it is preferable to use films deposited on plane surfaces, for which simplified optical transmission models are better-suited (Trotta, 1996). For this reason, the inverted optical constants used in this work and provided in Appendix A.3 need to be treated cautiously. An additional, similar analysis based on recently determined optical constants for Pluto tholins might be insightful (Jovanović et al., 2021).

848 Acknowledgements

This work was supported by NASA's New Horizons Project. M. Fayolle, E. Quirico, B. Schmitt, L. 849 Gabosova and O. Poch acknowledge the Centre National d'Etudes Spatiales (CNES) for its financial support 850 through its "Systeme Solaire" program (it is based on observations with RALPH embarked on New Horizons) 851 and the ANR Project CLASSY. O.P. acknowledges funding from the Centre National d'Etudes Spatiales 852 (CNES) and the European Research Council under grant SOLARYS (77169). T.G. Thanks CNES and PNP 853 for their financial support. N.C and L.J thank the European Research Council for funding via the ERC 854 PrimChem project (grant agreement No. 636829). We would like to thank the two anonymous reviewers 855 for their careful reading and useful feedback, which significantly contributed to improve the quality of our 856 manuscript. 857

References

- Alcouffe, G., Cavarroc, M., Cernogora, G., Ouni, F., Jolly, A., Boufendi, L., Szopa, C., 2009. Capacitively coupled plasma used
 to simulate Titan's atmospheric chemistry. Plasma Sources Science and Technology 19, 015008.
- Balanzat, E., Betz, N., Bouffard, S., 1995. Swift heavy ion modification of polymers. Nuclear Instruments and Methods in
 Physics Research Section B: Beam Interactions with Materials and Atoms 105, 46-54.
- Bernard, J.M., Coll, P., Coustenis, A., Raulin, F., 2003. Experimental simulation of Titan's atmosphere: Detection of ammonia
 and ethylene oxide. Planetary and Space Science 51, 1003–1011.
- Bernard, J.M., Quirico, E., Brissaud, O., Montagnac, G., Reynard, B., McMillan, P., Coll, P., Nguyen, M.J., Raulin, F.,
 Schmitt, B., 2006. Reflectance spectra and chemical structure of Titan's tholins: Application to the analysis of Cassini–
 Huygens observations. Icarus 185, 301–307.
- Bertrand, T., Forget, F., Schmitt, B., White, O.L., Grundy, W.M., 2020. Equatorial mountains on Pluto are covered by
 methane frosts resulting from a unique atmospheric process. Nature communications 11, 1–7.
- Bertrand, T., Forget, F., Umurhan, O., Grundy, W., Schmitt, B., Protopapa, S., Zangari, A., White, O., Schenk, P., Singer,
 K., et al., 2018. The nitrogen cycles on Pluto over seasonal and astronomical timescales. Icarus 309, 277–296.
- Bertrand, T., Forget, F., Umurhan, O., Moore, J., Young, L., Protopapa, S., Grundy, W., Schmitt, B., Dhingra, R., Binzel, R.,
 et al., 2019. The CH4 cycles on Pluto over seasonal and astronomical timescales. Icarus 329, 148–165.
- Brasse, N., Munoz, O., Coll, P., Raulin, F., 2015. Optical constants of Titan aerosols and their tholin analogs: experimental
 results and modeling/observational data. Planetary and Space Science 109-110, 159-174.
- Brucato, J., Migliorini, A., Barucci, M., Carvano, J., Dotto, E., Mennella, V., 2010. Reflectance spectra of Titan tholin between
 7000 and 10 cm-1-Interpretation of Cassini/CIRS observation of Saturn's satellite Phoebe. Astronomy & Astrophysics 516,
 A92.
- Buie, M.W., Grundy, W.M., Young, E.F., Young, L.A., Stern, S.A., 2010. Pluto and Charon with the Hubble Space Telescope.
 I. Monitoring global change and improved surface properties from light curves. The Astronomical Journal 139, 1117.
- Buie, M.W., Tholen, D.J., 1989. The surface albedo distribution of Pluto. Icarus 79, 23-37.
- Canup, R.M., 2010. On a giant impact origin of Charon, Nix, and Hydra. The Astronomical Journal 141, 35.
- Cheng, A.F., Summers, M.E., Gladstone, G.R., Strobel, D.F., Young, L.A., Lavvas, P., Kammer, J.A., Lisse, C.M., Parker,
 A.H., Young, E.F., et al., 2017. Haze in Pluto's atmosphere. Icarus 290, 112–133.
- Clark, R.N., Roush, T.L., 1984. Reflectance spectroscopy: Quantitative analysis techniques for remote sensing applications.
 Journal of Geophysical Research: Solid Earth 89, 6329-6340.
- 887 Cloutis, E., 1989. Spectral Reflectance Properties of Hydrocarbons: Remote-Sensing Implications. Science 245, 165–168.
- Coll, P., Navarro-González, R., Szopa, C., Poch, O., Ramírez, S.I., Coscia, D., Raulin, F., Cabane, M., Buch, A., Israël, G.,
 2013. Can laboratory tholins mimic the chemistry producing Titan's aerosols? A review in light of ACP experimental results.
 Planetary and Space Science 77, 91-103.
- Cook, J.C., Dalle Ore, C.M., Protopapa, S., Binzel, R.P., Cruikshank, D.P., Earle, A., Grundy, W.M., Ennico, K., Howett, C.,
 Jennings, D.E., et al., 2019. The distribution of H2O, CH3OH, and hydrocarbon-ices on Pluto: Analysis of New Horizons
 spectral images. Icarus 331, 148-169.
- 894Cruikshank, D., Allamandola, L., Hartmann, W., Tholen, D., Brown, R., Matthews, C., Bell, J., 1991. Solid $C \equiv N$ Bearing895Material on Outer Solar System Bodies. Icarus 94, 345–353.
- Cruikshank, D., Grundy, W., DeMeo, F., Buie, M., Binzel, R., Jennings, D., Olkin, C., Parker, J., Reuter, D., Spencer, J.,
 et al., 2015. The surface compositions of Pluto and Charon. Icarus 246, 82–92.
- 898 Cruikshank, D., Pilcher, C., Morrison, D., 1976. Pluto: Evidence for methane frost. Science , 835-837.
- Cruikshank, D.P., Mason, R., Dalle Ore, C., Bernstein, M., Quirico, E., Mastrapa, R., Emery, J., Owen, T., 2006. Ethane on
 Pluto and Triton, in: DPS, pp. 21-03.
- DeMeo, F.E., Dumas, C., de Bergh, C., Protopapa, S., Cruikshank, D.P., Geballe, T.R., Alvarez-Candal, A., Merlin, F.,
 Barucci, M.A., 2010. A search for ethane on Pluto and Triton. Icarus 208, 412–424.
- Desch, S.J., 2015. Density of Charon formed from a disk generated by the impact of partially differentiated bodies. Icarus 246,
 37-47.
- 905 Faure, M., Quirico, E., Faure, A., Boduch, P., Rothard, H., Balanzat, E., Baklouti, D., Brunetto, R., Bonal, L., Beck, P.,

- et al., 2021. A radiolytic origin of organic matter in primitive chondrites and trans-neptunian objects? new clues from ion
 irradiation experiments. Icarus, 114462.
- Fayolle, M., Quirico, E., Potin, S., 2018. Bidirectional Vis-NIR reflectance spectra of two tholins samples (+ mixtures with pyrrhotite) at various illumination-observation geometries (i=0,30,60 deg e= -70 to 70 deg) and their extracted single scattering albedo and optical constants spectra. SSHADE/GhoSST (OSUG Data Center). dataset/spectral data. URL:
 doi:10.26302/SSHADE/EXPERIMENT_BS_20201201_001.
- Gao, P., Fan, S., Wong, M.L., Liang, M.C., Shia, R.L., Kammer, J.A., Yung, Y.L., Summers, M.E., Gladstone, G.R., Young,
 L.A., et al., 2017. Constraints on the microphysics of Pluto's photochemical haze from New Horizons observations. Icarus
 287, 116-123.
- Gautier, T., Carrasco, N., Mahjoub, A., Vinatier, S., Giuliani, A., Szopa, C., Anderson, C.M., Correia, J.J., Dumas, P., Cernogora, G., 2012. Mid-and far-infrared absorption spectroscopy of Titanà ĂŹs aerosols analogues. Icarus 221, 320-327.
- Gladstone, G.R., Stern, S.A., Ennico, K., Olkin, C.B., Weaver, H.A., Young, L.A., Summers, M.E., Strobel, D.F., Hinson,
 D.P., Kammer, J.A., et al., 2016. The atmosphere of Pluto as observed by New Horizons. Science 351.
- 919 Goldberg, D.E., 1989. Genetic algorithms in search. Optimization, and MachineLearning.
- 920 Grundy, W., Bertrand, T., Binzel, R., Buie, M., Buratti, B., Cheng, A., Cook, J., Cruikshank, D., Devins, S., Dalle Ore, C.,
 921 Earle, A., Ennico, K., Forget, F., Gao, P., Gladstone, G., Howett, C., Jennings, D., Kammer, J., Lauer, T., Linscott, I.,
 922 Lisse, C., Lunsford, A., McKinnon, W., Olkin, C., Parker, A., Protopapa, S., Quirico, E., Reuter, D., Schmitt, B., Singer,
- K., Spencer, J., Stern, S., Strobel, D., Summers, M., Weaver, H., Weigle, G., Wong, M., Young, E., Young, L., Zhang, X.,
 2018. Pluto's haze as a surface material. Icarus 306, 232–245.
- Grundy, W., Binzel, R., Buratti, B., Cook, J., Cruikshank, D., Dalle Ore, C., Earle, A., Ennico, K., Howett, C., Lunsford, A.,
 et al., 2016. Surface compositions across Pluto and Charon. Science 351.
- 927 Grundy, W., Buie, M., 2002. Spatial and compositional constraints on non-ice components and H2O on Pluto's surface. Icarus
 928 157, 128-138.
- 929 Grundy, W., Schmitt, B., Quirico, E., 2002. The temperature-dependent spectrum of methane ice I between 0.7 and 5 μ m and 930 opportunities for near-infrared remote thermometry. Icarus 155, 486-496.
- Hadamcik, E., Renard, J.B., Alcouffe, G., Cernogora, G., Levasseur-Regourd, A.C., Szopa, C., 2009. Laboratory light-scattering
 measurements with Titan's aerosols analogues produced by a dusty plasma. Planetary and Space Science 57, 1631–1641.
- Hapke, B., 1986. Bidirectional Reflectance Spectroscopy: 4. The extinction Coefficient and the Opposition Effect. Icarus 67,
 264-280.
- 935 Hapke, B., 1993. Theory of Reflectance and Emittance Spectroscopy. Cambridge University Press, Cambridge.
- Hapke, B., 2002. Bidirectional Reflectance Spectroscopy: 5. The Coherent Backscatter Opposition Effect and Anisotropic
 Scattering. Icarus 157, 523-534.
- Hapke, B., 2008. Bidirectional Reflectance Spectroscopy: 6. Effects of porosity. Icarus 198, 918-926.
- Hapke, B., 2012a. Bidirectional Reflectance Spectroscopy: 7. The single particle phase function hockey stick relation. Icarus
 221, 1079-1083.
- Hapke, B., 2012b. Theory of reflectance and emittance spectroscopy. Cambridge university press.
- Holler, B., Young, L., Grundy, W., Olkin, C., Cook, J., 2014. Evidence for longitudinal variability of ethane ice on the surface
 of Pluto. Icarus 243, 104–110.
- Howett, C., Parker, A., Olkin, C., Reuter, D., Ennico, K., Grundy, W., Graps, A., Harrison, K., Throop, H., Buie, M., et al.,
 2017. Inflight radiometric calibration of new horizonsåÅŹ multispectral visible imaging camera (mvic). Icarus 287, 140–151.
- Jovanović, L., Gautier, T., Broch, L., Protopapa, S., Bertrand, T., Rannou, P., Fayolle, M., Quirico, E., Johann, L., Naciri,
 A.E., et al., 2021. Optical constants of pluto aerosol analogues from uv to near-ir. Icarus 362, 114398.
- Jovanović, L., Gautier, T., Vuitton, V., Wolters, C., Bourgalais, J., Buch, A., Orthous-Daunay, F.R., Vettier, L., Flandinet,
 L., Carrasco, N., 2020. Chemical composition of Pluto aerosol analogues. Icarus , 113774.
- Khare, B., Sagan, C., Arakawa, E., Suits, F., Callcott, T., Williams, M., 1984. Optical Constants of Organic Tholins Produced
 in a Simulated Titanian Atmosphere: From Soft X-Ray to Microwave Frequencies. Icarus 60, 127–137.
- Lellouch, E., Gurwell, M., Butler, B., Fouchet, T., Lavvas, P., Strobel, D., Sicardy, B., Moullet, A., Moreno, R., Bockelée Morvan, D., et al., 2017. Detection of CO and HCN in PlutoâĂŹs atmosphere with ALMA. Icarus 286, 289–307.
- Luspay-Kuti, A., Mandt, K., Jessup, K.L., Kammer, J., Hue, V., Hamel, M., Filwett, R., 2017. Photochemistry on Pluto I.
 Hydrocarbons and aerosols. Monthly Notices of the Royal Astronomical Society 472, 104–117.
- Mahjoub, A., Carrasco, N., Dahoo, P.R., Gautier, T., Szopa, C., Cernogora, G., 2012. Influence of methane concentration on
 the optical indices of Titan's aerosols analogues. Icarus 221, 670–677.
- McKinnon, W.B., Stern, S., Weaver, H., Nimmo, F., Bierson, C., Grundy, W., Cook, J., Cruikshank, D., Parker, A., Moore,
 J., et al., 2017. Origin of the Pluto-Charon system: Constraints from the New Horizons flyby. Icarus 287, 2-11.
- Meyer, J.P., Drury, L.O., Ellison, D.C., 1998. A cosmic-ray composition controlled by volatility and A/Q ratio. SNR shock
 acceleration of gas and dust, in: The Advanced Composition Explorer Mission. Springer, pp. 179-201.
- Nakamura, R., Sumikawa, S., Ishiguro, M., Mukai, T., Iwamuro, F., Terada, H., Motohara, K., Goto, M., Hata, R., Taguchi,
 T., et al., 2000. Subaru infrared spectroscopy of the Pluto-Charon system. Publications of the Astronomical Society of
 Japan 52, 551-556.
- Olkin, C.B., Spencer, J.R., Grundy, W.M., Parker, A.H., Beyer, R.A., Schenk, P.M., Howett, C.J., Stern, S.A., Reuter, D.C.,
 Weaver, H.A., et al., 2017. The global color of Pluto from New Horizons. The Astronomical Journal 154, 258.
- 967 Owen, T.C., Roush, T.L., Cruikshank, D.P., Elliot, J.L., Young, L.A., De Bergh, C., Schmitt, B., Geballe, T.R., Brown, R.H.,
 968 Bartholomew, M.J., 1993. Surface ices and the atmospheric composition of Pluto. Science 261, 745-748.

- Poch, O., Pommerol, A., Jost, B., Carrasco, N., Szopa, C., Thomas, N., 2016. Sublimation of ice-tholins mixtures: a morphological and spectrophotometric study. Icarus 266, 288–305.
- Potin, S., Brissaud, O., Beck, P., Schmitt, B., Magnard, Y., Correia, J.J., Rabou, P., Jocou, L., 2018. SHADOWS: a spectro gonio radiometer for bidirectional reflectance studies of dark meteorites and terrestrial analogs: design, calibrations, and
 performances on challenging surfaces. Applied optics 57, 8279-8296.
- Protopapa, S., Boehnhardt, H., Herbst, T., Cruikshank, D., Grundy, W., Merlin, F., Olkin, C., 2008. Surface characterization
 of Pluto and Charon by L and M band spectra. Astronomy & Astrophysics 490, 365-375.
- 976 Protopapa, S., Grundy, W., Reuter, D., Hamilton, D., Dalle Ore, C., Cook, J., Cruikshank, D., Schmitt, B., Philippe, S.,
 977 Quirico, E., et al., 2017. PlutoàĂŹs global surface composition through pixel-by-pixel Hapke modeling of New Horizons
 978 Ralph/LEISA data. Icarus 287, 218-228.
- Protopapa, S., Olkin, C.B., Grundy, W.M., Li, J.Y., Verbiscer, A., Cruikshank, D.P., Gautier, T., Quirico, E., Cook, J.C.,
 Reuter, D., et al., 2020. Disk-resolved Photometric Properties of Pluto and the Coloring Materials across its Surface. The
 Astronomical Journal 159, 74.
- Quirico, E., Montagnac, G., Lees, V., McMillan, P.F., Szopa, C., Cernogora, G., Rouzaud, J.N., Simon, P., Bernard, J.M.,
 Coll, P., et al., 2008. New experimental constraints on the composition and structure of tholins. Icarus 198, 218-231.
- Quirico, E., Schmitt, B., 1997. Near-Infrared Spectroscopy of Simple Hydrocarbons and Carbon Oxides Diluted in Solid N2and
 as Pure Ices: Implications for Triton and Pluto. Icarus 127, 354–378.
- Reuter, D.C., Stern, S.A., Scherrer, J., Jennings, D.E., Baer, J.W., Hanley, J., Hardaway, L., Lunsford, A., McMuldroch, S.,
 Moore, J., et al., 2008. Ralph: A visible/infrared imager for the New Horizons Pluto/Kuiper belt mission. Space Science
 Reviews 140, 129-154.
- 989 Sagan, C., Khare, B., 1979. Tholins: Organic chemistry of interstellar grains and gas. Nature 277, 102-107.
- Sasaki, T., Kanno, A., Ishiguro, M., Kinoshita, D., Nakamura, R., 2004. Search for nonmethane hydrocarbons on Pluto. The
 Astrophysical Journal Letters 618, L57.
- Schmitt, B., Philippe, S., Grundy, W., Reuter, D., Cote, R., Quirico, E., Protopapa, S., Young, L., Binzel, R., Cook, J.,
 Cruikshank, D., Dalle Ore, C., A.M., E., Ennico, K., Howett, C., Jennings, D., Linscott, I., Lunsford, A., Olkin, C., Parker,
 A., Parker, J., Singer, K., Spencer, J., Stansberry, J., Stern, S., Tsang, C., Verbiscer, A., Weaver, H., the New Horizons Team,
 2017. Physical state and distribution of materials at the surface of Pluto from New Horizons LEISA imaging spectrometer.
 Icarus 287, 229-260.
- Sciamma-O'Brien, E., Dahoo, P.R., Hadamcik, E., Carrasco, N., Quirico, E., Szopa, C., Cernogora, G., 2012. Optical constants
 from 370 nm to 900 nm of Titan tholins produced in a low pressure RF plasma discharge. Icarus 218, 356-363.
- 999 Sekine, Y., Genda, H., Kamata, S., Funatsu, T., 2017. The Charon-forming giant impact as a source of PlutoâĂŹs dark 1000 equatorial regions. Nature Astronomy 1, 1–6.
- Stern, S., Bagenal, F., Ennico, K., Gladstone, G., Grundy, W., McKinnon, W., Moore, J., Olkin, C., Spencer, J., Weaver, H.,
 et al., 2015. The Pluto system: Initial results from its exploration by New Horizons. Science 350.
- Szopa, C., Cernogora, G., Boufendi, L., Correia, J.J., Coll, P., 2006. PAMPRE: A dusty plasma experiment for Titan's tholins
 production and study. Planetary and space Science 54, 394-404.
- Trotta, F., 1996. Détermination des constantes optiques de glaces dans l'infrarouge moyen et lointain: application aux grains
 du milieu interstellaire et des enveloppes circumstellaires. Ph.D. thesis. Université Joseph Fourier (Grenoble).
- 1007 Verbiscer, A., Showalter, M., Buie, M., Helfenstein, P., 2019. The Pluto System at True Opposition. LPICo 2133, 7050.
- Webber, W., Yushak, S., 1983. A measurement of the energy spectra and relative abundance of the cosmic-ray H and He
 isotopes over a broad energy range. The Astrophysical Journal 275, 391-404.
- Wong, M.L., Fan, S., Gao, P., Liang, M.C., Shia, R.L., Yung, Y.L., Kammer, J.A., Summers, M.E., Gladstone, G.R., Young,
 L.A., et al., 2017. The photochemistry of Pluto's atmosphere as illuminated by New Horizons. Icarus 287, 110–115.
- 1012 Workman, J., 1996. Interpretive Spectroscopy for Near Infrared. Applied Spectroscopy Reviews , 251–320.
- Young, L.A., Kammer, J.A., Steffl, A.J., Gladstone, G.R., Summers, M.E., Strobel, D.F., Hinson, D.P., Stern, S.A., Weaver,
 H.A., Olkin, C.B., et al., 2018. Structure and composition of Pluto's atmosphere from the New Horizons solar ultraviolet
 occultation. Icarus 300, 174–199.
- Ziegler, J., Manoyan, J., 1988. The stopping of ions in compounds. Nuclear Instruments and Methods in Physics Research
 Section B: Beam Interactions with Materials and Atoms 35, 215–228.

1018 Appendices

1019 A. Inversion of the Hapke model

This appendix describes how to invert Hapke model, in order to extract some surface parameters of interest from reflectance measurements.

¹⁰²² A.1. Estimating the single scattering albedo and phase function

As mentioned in Section 5.5, a linearised least-squares method can be used to invert Hapke model and retrieve the single scattering albedo and phase function from the tholins reflectance spectra. The linearised least-squares method is by definition an iterative process. The non-linear relation between the parameters to estimate (parameters vector \boldsymbol{x}) and the observations (here reflectance values, concatenated in an observations vector \boldsymbol{y}) can be written as follows:

$$\boldsymbol{y} = \boldsymbol{F}(\boldsymbol{x})\boldsymbol{x},\tag{14}$$

where the matrix F(x) represents the available model linking the observations to the parameters. From the Taylor series of the above equation, a first order approximation can be derived for the deviation in the observations which is expected from a small change in the parameters:

$$\delta \boldsymbol{y} = \left. \frac{\partial \boldsymbol{F}(\boldsymbol{x})}{\partial \boldsymbol{x}} \right|_{\boldsymbol{x} = \boldsymbol{x}^{\star}} \delta \boldsymbol{x},\tag{15}$$

where x^* is the current best estimate of the parameters vector x. To simplify the notations, the partial derivatives matrix H (also referred to as the normal matrix) is introduced, as:

$$\boldsymbol{H}(\boldsymbol{x}^{\star}) = \left. \frac{\partial \boldsymbol{F}(\boldsymbol{x})}{\partial \boldsymbol{x}} \right|_{\boldsymbol{x}=\boldsymbol{x}^{\star}}.$$
(16)

The previous step (Equation 15) is necessary to linearise the problem. The successive updates which need to be applied to the parameters vector, starting from an initial guess x_0 , are given by

$$\delta \boldsymbol{x}_{i+1} = \left[\left(\boldsymbol{H}(\boldsymbol{x}_i) \right)^{\mathrm{T}} \boldsymbol{H}(\boldsymbol{x}_i) \right]^{-1} \left(\boldsymbol{H}(\boldsymbol{x}_i) \right)^{\mathrm{T}} \delta \boldsymbol{y}_i, \tag{17}$$

where δy_i is the difference between the actual reflectance data and the simulated reflectance values obtained with the former estimate of the parameters vector x_i .

The parameters to be estimated in our particular problem are the single scattering albedo ω (as a function of the wavelength λ) and the phase function P which depends on the phase angle g. The model relating $\omega(\lambda)$ and P(g) to the expected reflectance is the simplified Hapke model (see Equation 1). The least-squares inversion as described in Equation 17 requires the computation of the normal matrix H defined by Equation 16. Consequently, the partial derivatives of the simulated reflectance $r(i, e, g, \lambda)$ with respect to both $\omega(\lambda)$ and P(g) need to be computed. Let us first define the function $\alpha(\omega, \mu_0, \mu)$ as the product of the two multiple scattering terms in Equation 1:

$$\alpha(\omega, \mu_0, \mu) = H(\omega, \mu_0) H(\omega, \mu) = \frac{1 + 2\mu_0}{1 + 2\mu_0 \sqrt{1 - \omega}} \times \frac{1 + 2\mu}{1 + 2\mu \sqrt{1 - \omega}}.$$
(18)

Then, the derivative of the reflectance with respect to the single scattering albedo, for a given value of the wavelength λ , can be computed as follows:

$$\frac{\partial r(i, e, g, \lambda)}{\partial \omega}\Big|_{\lambda} \tag{19}$$

$$= \frac{\partial}{\partial \omega} \left(\frac{\omega}{4\pi} \frac{\mu_0}{\mu_0 + \mu} \left[P(g) + \alpha(\omega, \mu_0, \mu) - 1\right]\right)$$

$$= \frac{\mu_0}{4\pi (\mu_0 + \mu)}$$

$$\times \left[P(g) - 1 + \alpha(\omega, \mu_0, \mu) + \omega \frac{\partial \alpha(\omega, \mu_0, \mu)}{\partial \omega}\right],$$

1046

$$\frac{\partial \alpha(\omega, \mu_0, \mu)}{\omega} = (1 + 2\mu_0) (1 + 2\mu) \times \left[\frac{\frac{\mu_0 + \mu}{\sqrt{1 - \omega}} + 4\mu_0 \mu}{(1 + 2(\mu_0 + \mu)\sqrt{1 - \omega} + 4\mu_0 \mu (1 - \omega))^2} \right].$$
(20)

1047

Finally, the partial derivative of the reflectance with respect to the phase function
$$P$$
 is

where the partial derivative of the function $\alpha(\omega, \mu_0, \mu)$ can be expressed as

$$\left. \frac{\partial r(i, e, g, \lambda)}{\partial P} \right|_g = \frac{\omega}{4\pi} \frac{\mu_0}{\mu_0 + \mu},\tag{21}$$

assuming the phase angle g is constant.

After a few iterations, the linearised least-squares inversion described above converges towards an estimated solution for the single scattering albedo and the phase function.

A.2. Extracting the optical constants

As already discussed in Section 4.2.3, the Maxwell-Garnett model requires the optical constants of the tholins as input. However, the least-squares inversion of the simplified Hapke model described in Appendix A.1 only provides an estimate of the single scattering albedo $\omega(\lambda)$ and phase function P(g) for the laboratory synthesised tholins.

The highly non-linear relation between the single scattering albedo ω and optical constants n and k (see Equation 2) does not allow for a straight-forward determination of the tholins optical constants from ω .

The spectral information is mostly carried by k, except for strong fundamental bands. The near-infrared spectral range covered by LEISA spectra corresponds to the domain of overtone and combination bands. Variations of the refractive index n are therefore expected to not exceed a few percents. On the other hand, the very strong band in the UV-visible responsible for the red slope should lead to a large change in the refractive index n in the visible. Using the n values provided in Khare et al. (1984) aims at taking this variation into account.

From these assumed n values, we estimate the corresponding values of k that would match the single scattering albedo ω . To compute k as a function of the wavelength, the expression giving the single scattering albedo as a function of n and k (Equations 7 and 8) must be inverted for each wavelength. Because the expression for ω is highly non-linear, a linearised least-squares method can be employed, exactly similar to the one presented in Appendix A.1.

The observations are here the single scattering albedo values for all wavelengths of interest, while the parameters to be estimated are the associated k values. The normal matrix \boldsymbol{H} contains the partial derivatives of ω with respect to k, evaluated separately at each wavelength. The iterative linearised least-squares method converges within a few iterations and provides estimates for the k values.

¹⁰⁷³ A.3. Tabulated results of the Hapke model inversion

This appendix provides the tabulated values for the single scattering albedo ω and phase function Pobtained after performing the inversion of the Hapke model as described in Appendix A.1. Results are reported for both 5%CH₄ and 1%CH₄ tholins, in Tables A.1 and A.2 for ω and P, respectively. Table A.3 contains the optical constants extracted from the single scattering albedo, as described in Appendix A.2. kvalues are also displayed as a function of the wavelength in Figure A.1.

Again, it must be highlighted that those parameters are determined in a purely numerical way. They need to be used carefully, keeping in mind the inherent lack of physical meaning behind the least-squares inversion of our models.

These data are also available through the GhoSST database in SSHADE infrastructure of solid spectroscopy: https://doi.org/10.26302/SSHADE/EXPERIMENT_BS_20201201_001 (Fayolle et al., 2018).

1 um		1 1 1	r 1	 1 1	r 7	1 1	r 1
$\lambda[\mu m]$	$\omega[-]$						
0.40	0.1209	1.46	0.9957	0.40	0.0746	1.46	0.9921
0.44	0.1904	1.50	0.9948	0.44	0.1116	1.50	0.9914
0.48	0.2685	1.54	0.9953	0.48	0.1521	1.54	0.9924
0.52	0.3742	1.58	0.9963	0.52	0.2142	1.58	0.9939
0.56	0.4906	1.62	0.9967	0.56	0.2937	1.62	0.9946
0.60	0.6042	1.66	0.9966	0.60	0.3863	1.66	0.9947
0.64	0.7056	1.70	0.9956	0.64	0.4835	1.70	0.9943
0.68	0.7901	1.74	0.9950	0.68	0.5787	1.74	0.9938
0.72	0.8529	1.78	0.9950	0.72	0.6621	1.78	0.9934
0.76	0.8983	1.82	0.9956	0.76	0.7333	1.82	0.9937
0.80	0.9303	1.86	0.9955	0.80	0.7929	1.86	0.9933
0.84	0.9522	1.90	0.9885	0.84	0.8412	1.90	0.9846
0.88	0.9674	1.94	0.9781	0.88	0.8801	1.94	0.9707
0.92	0.9778	1.98	0.9762	0.92	0.9102	1.98	0.9677
0.96	0.9846	2.02	0.9776	0.96	0.9328	2.02	0.9678
1.00	0.9893	2.06	0.9794	1.00	0.9505	2.06	0.9695
1.04	0.9925	2.10	0.9797	1.04	0.9635	2.10	0.9695
1.08	0.9945	2.14	0.9789	1.08	0.9724	2.14	0.9684
1.12	0.9959	2.18	0.9756	1.12	0.9792	2.18	0.9643
1.16	0.9967	2.22	0.9722	1.16	0.9841	2.22	0.9597
1.20	0.9973	2.26	0.9684	1.20	0.9876	2.26	0.9586
1.24	0.9978	2.30	0.9685	1.24	0.9903	2.30	0.9617
1.28	0.9981	2.34	0.9712	1.28	0.9921	2.34	0.9644
1.32	0.9983	2.38	0.9699	1.32	0.9936	2.38	0.9626
1.38	0.9980	2.42	0.9653	1.38	0.9938	2.42	0.9555
1.42	0.9970	2.46	0.9586	1.42	0.9936	2.46	0.9446
		2.50	0.8903			2.50	0.8614

 $N_2:CH_4 = 95:5$ tholins

 $N_2:CH_4 = 99:1$ tholins

Table A.1: Single scattering albedo obtained from the inversion of the Hapke model, for 5%CH₄ and 1%CH₄ tholins.

 $N_2:CH_4 = 95:5 tholins$

 $N_2:CH_4 = 99:1$ tholins

g [°]	P [-]	g [°]	P [-]
10	2.1757	10	2.2954
20	1.7848	20	1.9600
30	1.5956	30	1.7704
40	1.3621	40	1.5006
50	1.1413	50	1.2421
60	0.8577	60	0.9117
70	0.9943	70	1.0403
80	0.8412	80	0.8932
90	0.7898	90	0.8369
100	0.7513	100	0.8128
110	0.6720	110	0.6953
120	0.6967	120	0.7009
130	0.7506	130	0.7540

Table A.2: Phase function obtained from the inversion of Hapke model, for 5%CH₄ and 1%CH₄ tholins.

1084 B. Optimisation process

This appendix provides more details about the optimisation problem introduced in Section 4.3 and about the optimisation algorithm selected to tackle it.

¹⁰⁸⁷ B.1. Definition of the optimisation problem

For this particular problem, the optimisation objective (*i.e.* variable to be minimised) was defined as the χ^2 between the simulated reflectance and the New Horizons spectrum.

As a reminder, below are listed the design parameters (*i.e.* free parameters) whose values were tuned by the optimisation algorithm to find the best match between the simulated spectra and the New Horizons data:

• mass ratio m_j of each of the chemical species within the intimate mixture of the refractories spatial unit (H₂O, C₂H₆, CH₃OH, tholins);

Testing tholins as analogues of the dark reddish material covering Pluto's Cthulhu region

$\lambda[\mu m]$	n [-] (Khare et al., 1984)	$k_{95:5}[-]$	$k_{99:1}[-]$
0.50	1.7075	1.1015e-1	2.6428e-1
0.54	1.7032	7.3915e-2	1.6818e-1
0.58	1.6973	5.0537e-2	1.1757e-1
0.62	1.6905	3.4867e-2	8.4720e-2
0.66	1.6841	2.4006e-2	6.2135e-2
0.70	1.6785	1.6544e-2	4.6150e-2
0.74	1.6736	1.1526e-2	3.5007e-2
0.78	1.6690	8.0749e-3	2.6709e-2
0.82	1.6649	5.6880e-3	2.0416e-2
0.86	1.6611	4.0332e-3	1.5621e-2
0.90	1.6576	2.8385e-3	1.1866e-2
0.94	1.6539	2.0318e-3	9.0712e-3
0.98	1.6510	1.4784e-3	6.9406e-3
1.02	1.6500	1.0623e-3	5.2102e-3
1.06	1.6500	7.9285e-4	4.0014e-3
1.10	1.6500	6.0408e-4	3.1225e-3
1.14	1.6500	4.7837e-4	2.4398e-3
1.18	1.6500	4.1323e-4	1.9458e-3
1.22	1.6492	3.4153e-4	1.5600e-3
1.26	1.6463	2.9543e-4	1.2884e-3
1.30	1.6428	2.6711e-4	1.0812e-3
1.34	1.6403	2.7703e-4	9.7626e-4
1.40	1.6400	3.8951e-4	9.9516e-4
1.44	1.6400	6.2087e-4	1.2133e-3
1.48	1.6400	8.5324e-4	1.4712e-3
1.52	1.6400	9.0818e-4	1.4798e-3
1.56	1.6400	7.6851e-4	1.2438e-3
1.60	1.6400	6.3797e-4	1.0640e-3
1.64	1.6400	6.2505e-4	1.0201e-3
1.68	1.6400	7.7079e-4	1.0869e-3
1.72	1.6400	9.5738e-4	1.2050e-3
1.76	1.6400	1.0499e-3	1.3414e-3
1.80	1.6400	1.0007e-3	1.3817e-3
1.84	1.6373	8.9699e-4	1.3440e-3
1.88	1.6300	1.4630e-3	2.0890e-3
1.92	1.6300	4.1545e-3	5.5626e-3
1.96	1.6300	5.5260e-3	7.4896e-3
2.00	1.6300	5.6724 e-3	8.0113e-3
2.04	1.6300	5.2411e-3	7.7560e-3
2.08	1.6300	5.1284e-3	7.7276e-3
2.12	1.6300	5.2320e-3	7.9533e-3
2.16	1.6300	5.8724e-3	8.8104e-3
2.20	1.6300	7.0284e-3	1.0365e-2
2.24	1.6294	8.0748e-3	1.1421e-2
2.28	1.6269	9.0836e-3	1.1346e-2
2.32	1.6236	8.4631e-3	1.0471e-2
2.36	1.6209	8.4280e-3	1.0486e-2
2.40	1.6200	9.5207e-3	1.2080e-2
2.44	1.6199	1.1541e-2	1.5279e-2
2.48	1.6191	1.4947e-2	2.0615e-2

Table A.3: Optical constants obtained from the numerical inversion described in Appendix A.2, for 5%CH₄ and 1%CH₄ tholins.

- mean particle diameter for each of the chemical species $(H_2O, C_2H_6, CH_3OH, tholins, CH_4);$
- spatial ratio between the two units (the refractories and the volatiles ones);
 - spatial fraction of tholins in icy grains when the Maxwell-Garnett model is used (Section 6.2.2). If so, the mean particle diameter and mass fraction associated with tholins are removed from the list of the design variables;
 - macroscopic porosity parameter K.

All the mass and spatial ratios are by definition ranging from 0 to 1, which is also the case for the porosity parameter K. Additionally, the sum of the mass fractions of the refractory species covering one of two spatial units (see Figures 2 and 3) must be equal to 1. Finally, the mean particle diameters were constrained between 0.1 μ m and 100 μ m.

1097

1098

1099

1100



Figure A.1: k values for both 5%CH₄ and 1%CH₄ tholins, obtained from the numerical inversion described in Appendix A.2.

¹¹⁰⁵ B.2. Selection of the optimisation algorithm

To conduct the optimisation process, we used the PAGMO toolbox developed by the Advanced Concepts Team (ACT) at ESA, which offers a wide range of optimisation algorithms (in C++). The documentation can be accessed at https://esa.github.io/pagmo2/.

As mentioned in Section 4.3, the performance of several global optimisation algorithms was assessed in terms of convergence and computational efficiency for our particular optimisation problem. The simple genetic algorithm, differential algorithm, predator-swarm algorithm, and artificial bee colony were tested. Those are all population-based evolutionary algorithms.

Except for the artificial bee colony algorithm, the other ones all achieved convergence (verified by reconducting the optimisation process with different random seeds). The simple genetic algorithm offered the best trade-off: it seemed to provide a good approximation of the global optimum within a reasonable computational time. The efficiency of the genetic algorithm was of particular relevance for this work, as both the number of design parameters and the associated search space were large, while computational capabilities were limited. For these reasons, this algorithm was selected to tackle the optimisation problem described in Appendix B.1.

The simple genetic algorithm relies on Darwin's natural selection principle, and more precisely on the 1120 "survival of the fittest" concept (e.g. Goldberg, 1989). As for any other evolutionary algorithm, an initial 1121 population of individuals (*i.e.* solutions, or combinations of design parameters) is generated. The "fitness" of 1122 each of these individuals is computed, as being equal to the value of the optimisation objective corresponding 1123 to the particular set of design parameters defining the individual. The population then evolves to form a 1124 second generation. Mimicking the evolution of populations according to evolutionary theories, parents are 1125 selected among the current population of solutions and each child individual is computed as a mix between 1126 the two sets of design parameters originating from its two parents. Following the natural selection principle, 1127 individuals associated with a good fitness value (*i.e.* for which the value of the optimisation objective is 1128 lower) are more likely to be selected as parents among a given generation, and thus to propagate the good 1129 performing design parameters defining them to the next generation. As generations keep being generated, 1130 the best identified fitness value tends to get closer to the global optimum and the "fittest" individuals thus 11 31 approach the best set of design parameters. To guarantee a good sampling of the research space, the 1132 population size (*i.e.* number of individuals per generation) should not be chosen too small. Additionally, 1133 mutations are introduced from one generation to the next to increase the diversity within the population. 1134 again based on what is observed in natural species evolution. 1135