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# Widespread CO2 and CO in the Trans-Neptunian Population revealed by JWST/DiSCo-TNOs



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# **Widespread CO**<sup>2</sup> **and CO in the Trans-Neptunian Population revealed by JWST/DiSCo-TNOs**

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## **ABSTRACT**

Carbon dioxide  $(CO<sub>2</sub>)$  is one of the most abundant ices in the solar system. It has been detected in giant planet atmospheres and on their moons, on and around comets, and even in regions of Mercury, the Moon, and Mars. However, despite their formation in the coldest regions of the protoplanetary disk,  $CO<sub>2</sub>$  was not previously detected on trans-Neptunian objects (TNOs). Carbon monoxide (CO) was only expected to be present in the largest TNOs. Out of 45 total, we report the detection of both CO<sub>2</sub> and CO in 42 and 24 TNOs, respectively, observed with the NIRSpec instrument on the JWST by the DiSCo-TNOs project (PID 2418). Our analysis shows that  $CO<sub>2</sub>$  is widespread in the trans-Neptunian region, independent of dynamical class, while CO is a common constituent of the reddest objects in our sample. The abundance and characteristics of  $CO<sub>2</sub>$  suggest that most of it could be primordially accreted. While, CO is probably being produced by ion irradiation of  $CO<sub>2</sub>$  and other C-bearing species. Our results suggest the prevalence of two compositional groups among TNOs based on the abundance and properties of  $CO<sub>2</sub>$  and CO. We discuss the implication of these results in the context of solar system formation.

## **Introduction**

The population of icy planetesimals found beyond the orbit of Neptune (semi-major axis,  $a > 30.1$  au), commonly referred to as trans-Neptunian onobjects (TNOs), are ideal laboratories for studying the original composition of the protoplanetary disk. TNOs have surface temperatures below ∼50 K, which allows them to retain a wide range of ices, depending on their size and orbit $1-3$  $1-3$ . The largest and coldest objects are expected to retain their original inventories of even those ices that are volatile at these temperatures, which include  $N_2$ , CO, and CH<sub>[4](#page-14-1)</sub><sup>4</sup>. On the other hand, the vast majority of the more than 4000 currently known TNOs are too small or too warm to retain significant amounts of volatile ices and should retain only non-volatiles, which at these temperatures could include  $CO_2$ ,  $H_2S$  (hydrogen sulfide),  $NH_3$  (ammonia),  $SO_2$  (sulfur dioxide),  $CH_3OH$  (methanol), and H2O, along with refractory organic compounds and silicates.

The red colors of many TNOs support the presence of refractory organic compounds<sup>[5](#page-14-2)-8</sup>, while robust detections of  $H_2O$ ice have been previously reported for many TNOs in the literature<sup>[9](#page-14-4)[–11](#page-14-5)</sup>. Possible detections of CH<sub>3</sub>OH have been made for a handful of small objects<sup>[12–](#page-14-6)[14](#page-14-7)</sup>. Sulfur-bearing compounds have yet to be reported on any TNO and the possible presence of CO,  $NH_3$ , and related compounds has only been reported within the Pluto system<sup>[15,](#page-14-8) [16](#page-14-9)</sup>. Surprisingly, definitive detection of  $CO_2$  ice on TNOs has remained elusive.  $CO_2$  is a ubiquitous ice species found throughout the solar system<sup>[17](#page-14-10)</sup>, having been identified

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<span id="page-4-0"></span>

**Figure 1.** *left*: Median spectra of the groups identified by Pinilla-Alonso et al. (in prep.): Bowl (dark blue), Bowl-n (light blue), Cliff (magenta), Double-Dip (orange). *right*: Zoomed spectra at the wavelength regions where the fundamental (4.27  $\mu$ m) and overtone (2.68  $\mu$ m and 2.78  $\mu$ m) features of CO<sub>2</sub>, the <sup>13</sup>CO<sub>2</sub> isotope at 4.36  $\mu$ m, and the CO feature at 4.68  $\mu$ m are present. Error bars show the standard deviation within a group.

even on Mercury and the Moon in shadowed craters<sup>[18,](#page-14-11) [19](#page-14-12)</sup>; polar caps on Mars<sup>[20](#page-14-13)</sup>; throughout the satellite systems of Jupiter, Saturn, and Uranus<sup>[21](#page-14-14)[–25](#page-15-0)</sup>; gas comae of comets and centaurs<sup>[26](#page-15-1)</sup>; and on Neptune's largest moon Triton<sup>[27,](#page-15-2)[28](#page-15-3)</sup>, a captured TNO<sup>[29](#page-15-4)</sup>.

Possible reasons for the lack of previous detections of  $CO<sub>2</sub>$  on TNOs include a lower abundance of  $CO<sub>2</sub>$  due to postaccretional processes at the formation distances of TNOs, CO<sub>2</sub> becoming buried under layers of other ices over time, conversion into other molecules through irradiation, and simple observational limitations (i.e., inadequate signal-to-noise, spectral resolving power, and/or spectral range). Due to their faintness, it is challenging to obtain spectra of many TNOs from the ground, and on top of that the Earth's atmosphere makes it challenging to perform observations at wavelengths longer than  $\sim$ 2.5 µm. CO<sub>2</sub> absorption features are present in this region at  $\sim$ 1.965, 2.01, and 2.07  $\mu$ m, as observed on the classical Uranian satellites and Triton<sup>[22,](#page-14-15) [25,](#page-15-0) [28](#page-15-3)</sup>, but the low resolving power needed to obtain any kind of usable signal-to-noise ratio (SNR) on the majority of TNOs prevents the detection of these bands. Stronger  $CO<sub>2</sub>$  bands are found at wavelengths longward of 2.5  $\mu$ m and inaccessible from the ground, with the fundamental absorption feature of pure CO<sub>2</sub> at ~4.27  $\mu$ m and overtones at 2.68 and 2.78  $\mu$ m.

To access these long-wavelength absorption features of  $CO<sub>2</sub>$ , and to obtain adequate signal-to-noise ratio and spectral resolution, on TNOs that can not be observed from the ground, requires a space-based near-infrared facility such as the James Webb Space Telescope (JWST). In this work, we investigated the infrared spectra of 45 TNOs obtained as part of the JWST Large Cycle 1 GO project "Discovering the Composition of the Trans-Neptunian Objects, Icy Embryos for Planet Formation" (DiSCo-TNOs; PID 2418). The data were obtained with the NIRSpec Integral Field Unit (IFU) using the Prism/CLEAR combination, providing low-resolving power spectra (R∼[30](#page-15-5)-300) in the wavelength range between 0.6 – 5.3  $\mu$ m<sup>30</sup>. Additional details about the data acquisition and reduction can be found in Pinilla-Alonso et al. (in prep, hereafter referred to as NPA23). The remainder of this paper explores the presence and characteristics of the  $CO<sub>2</sub>$  and CO ice features on 42 TNOs as a means of constraining their volatile content and, by extension, their initial conditions in the solar nebula.

#### **Results**

We inspected each spectrum of the sample individually, looking for signatures of the fundamental feature of pure  $CO<sub>2</sub>$  at 4.27  $\mu$ m, the overtone features of pure CO<sub>2</sub> at 2.68  $\mu$ m and 2.78  $\mu$ m, the <sup>13</sup>CO<sub>2</sub> isotope at 4.36  $\mu$ m, and the CO feature at 4.68  $\mu$ m. Out of the spectra of 45 objects analyzed, 42 exhibited signatures of CO<sub>2</sub>, with the exception of the 3 misfits: Centaurs 52872 Okyrhoe (1998 SG<sub>35</sub>) and 310071 (2010 KR<sub>59</sub>), and the Haumea family member 416400 (2003 UZ<sub>117</sub>), which are

not included in the remaining of this work. Out of these objects, 24 also present the CO feature, typically coupled with the additional presence of  $CO_2$  overtone and  ${}^{13}CO_2$  features. The detection of the CO feature was considered dubious or marginal for 5 additional objects. Fig. [1](#page-4-0) shows the average spectra of the four groups of TNOs identified by NPA23 based on the spectral signatures from 0.65 to 5.1  $\mu$ m, and named based on the structure of the 3- $\mu$ m absorption band: Bowl, Bowl-n, Double-Dip, and Cliff (see Section ). The presence, strength, and shape of the  $CO<sub>2</sub>$  and CO features are highly correlated within these groups, with the Bowl and Bowl-n types only weakly showing the fundamental CO<sub>2</sub> feature, while the Double-Dip and Cliff types typically showing also the  $CO_2$  overtones, the  $^{13}CO_2$  isotope, and the CO fundamental features. Interestingly, the spectra of the Double-Dip objects display "enhanced" wing-peaks on the short- and long-wavelength of the  $4.27 \mu m$  ice band, while the majority of Cliff types only show the long-wavelength enhancement. Moreover, some Cliff objects present a weaker CO<sup>2</sup> fundamental feature, with a more "usual" band shape, similar to those in the Bowl and Bowl-n groups.

<span id="page-5-0"></span>

**Distribution and properties of CO**<sup>2</sup> **among TNOs**

**Figure 2.** Distribution of  $CO<sub>2</sub>$  and  $CO$  detections, and of NPA23 spectral groups, by dynamical groups. All Double-Dip objects present both  $CO<sub>2</sub>$  and CO features, while some Cliff types do not show the latter. Bowl and Bowl-n groups only show robust detections of  $CO<sub>2</sub>$ . Dubious and/or marginal detections of CO are marked as  $CO_2 + CO^*$ , and are represented in gray.

The detection of  $CO<sub>2</sub>$  and  $CO$  across the distinct dynamical groups and spectral classifications of NPA23 are shown in Fig. [2.](#page-5-0) Notably, but unsurprisingly, CO was not detected in the Centaur population. However, CO was found to be predominantly in the Detached and Cold Classical populations, which only contain Double-Dip and Cliff objects. The Hot Classical population also showed a predominance of objects with both  $CO<sub>2</sub>$  and CO features, with the exception of two Bowl-type objects. In the Resonant and Scattering Disk populations, a more balanced mix of objects was found, with the detection of CO in five objects considered to be dubious or marginal (marked as  $CO<sub>2</sub> + CO<sup>*</sup>$  throughout the remainder of the manuscript).

The  $CO<sub>2</sub>$  fundamental bands were fit with a Gaussian to extract information about the band depth and center. We computed correlations between these parameters and visible slope, diameter, albedo, and perihelion distance. Fig [3](#page-6-0) shows the distribution of these parameters, with the result of Pearson and Spearman correlation tests, and their statistical significance.

The upper left panel of Figure [3](#page-6-0) shows a weak/moderate correlation between visible slope and  $CO<sub>2</sub>$  band depth. This suggests that objects with a redder color, which are also the ones with higher albedo (Fig. [3,](#page-6-0) *upper right*), may have a higher abundance of  $CO<sub>2</sub>$  compared to objects with a more neutral slope. Interestingly, all objects with a spectral slope

higher than  $18\%/1000$  Å are in the Double-Dip and Cliff groups and also exhibit a CO feature, except for 250112 (2002 KY<sub>14</sub>), a Centaur with a perihelion distance of ~8.6 au, where CO is not stable against sublimation<sup>[31](#page-15-6)</sup>. The deepest CO<sub>2</sub> features are seen on the Double-Dip group, where it is not correlated with the spectral slope when considering only the group itself. We hypothesize that the  $CO<sub>2</sub>$  fundamental feature in these spectra could be saturated, thus losing its linearity in the relation between band depth to the abundance of the ice.

The moderate to strong correlation between the  $CO<sub>2</sub>$  fundamental band depth and diameter, as well as perihelion distance, suggests that volatile-loss processes play a role in the abundance of  $CO<sub>2</sub>$  and  $CO$  on these objects. This correlation is stronger if only Double-Dip and Cliff groups are considered, since Bowl-n and Bowl appear to follow a different trend where a small content of  $CO_2$  could be stable<sup>[32](#page-15-7)</sup>, or steadily produced<sup>[33](#page-15-8)</sup>, on their surfaces. The latter groups do not show any detectable CO feature and have more neutral visible slopes below 18%/1000 Å, and lower visible albedos (Fig. [3-](#page-6-0)*upper right*).

Figure [4](#page-7-0) shows the perihelion temperature, where most of the volatile loss occurs, of each object along with the center positions of the fundamental band of  $CO<sub>2</sub>$ . The objects with smaller  $CO<sub>2</sub>$  and no CO ice content (mostly Bowl and Bowl-n) display wide variations in temperatures up to 95 K while those with a high abundance of  $CO<sub>2</sub>$  and CO are very clustered in temperature, around 45 K. Notably, objects with only CO<sub>2</sub> have a wider dispersion of band centers, most of them shifted towards the longer wavelengths. In contrast, objects with CO<sub>2</sub> and CO (Cliff and Double-Dip) present a smaller variation in band centers, clustered in wavelengths between  $4.25 - 4.27 \mu m$ . We compare these observations with laboratory spectra of  $CO<sub>2</sub>$  in different ice mixtures and for different temperatures as both parameters influence the band profile<sup>[34](#page-15-9)</sup>. A fraction of

<span id="page-6-0"></span>

**Figure 3.** Distribution of CO<sub>2</sub> fundamental band depth for NPA23 spectral groups in relation to the visible slope (*upper left*), visible albedo (*upper right*), diameter (*lower left*), and perihelion distance (*lower right*). The Pearson and Spearman correlation coefficients for each test and their respective p-values are shown in each panel. Shapes denote NPA23 spectral groups, while colors encode CO<sub>2</sub> and CO presence.

Double-Dip and Cliff types The center position of several objects, mostly, fall in a region where  $CO<sub>2</sub>$  is pure or mixed with CO (shifts to shorter wavelengths). The remaining members of these groups (shifts to longer wavelengths), could be explained by mixtures with other polar molecules, such as  $H_2$ Oand CH<sub>3</sub>OH, which in different relative ratios explain the spread of observed values for the center position of the CO<sup>2</sup> fundamental band. Bowl and Bowl-n present a higher dispersion of values, with extreme values that are hard to explain. Nonetheless, the majority of members of these groups could be explained by mixtures with polar molecules.

#### **The CO**<sup>2</sup> **fundamental band shape**

The spectral shapes of the  $CO<sub>2</sub>$  fundamental band among the groups defined by NPA23 show a remarkable diversity, including the presence of wing-peaks surrounding the feature in some instances. To our knowledge, these structures have never been observed before for astronomical objects in or outside of the solar system. In order to reproduce the four types of  $CO<sub>2</sub>$  features, we utilized a light-scattering model for airless surfaces developed by Shkuratov et al.  $(1999)^{35}$  $(1999)^{35}$  $(1999)^{35}$ . Our fits only consider the 4.1-4.5  $\mu$ m region, where the CO<sub>2</sub> fundamental feature is located, and do not reproduce the full spectra. Therefore, the abundance ratios presented here are only relative estimates of abundance of the materials that were considered  $(CO_2, H_2O)$ ,  $CH<sub>3</sub>OH$ , and others).

Fig. [5](#page-8-0) shows the spectra of the best-fit models of the average spectrum of each spectral group. The  $CO<sub>2</sub>$  features on Bowl and Bowl-n groups were fit by intimate mixtures dominated by water ice with a minor component of  $CO<sub>2</sub>$ with sub-wavelength grain sizes. In contrast,  $CO<sub>2</sub>$ , also with sub-wavelength grain sizes, is the dominant component for Double-Dip and Cliff groups, which is in agreement with their larger values of the fundamental band depth, and the presence of overtones.

Both Double-Dip and Cliff groups required more CO<sup>2</sup> and CH3OH ice compared to the Bowl and Bowl-n groups. The higher abundance of  $CO<sub>2</sub>$  provided good fits to the  ${}^{13}CO_2$  features, and both enhancements bordering the fundamental feature required the presence of CH<sub>3</sub>OHto be reproduced. The Double-Dip model 2 shows that a higher content of methanol may "increase" the strength of the wingpeak at  $\lambda < 4.27 \mu$ m. In the future, the use of more sophisticated models or consideration of other species (or mixtures of varying grain sizes of  $CO<sub>2</sub>$ ) could help reduce the differences between the models and the spectra of Double-Dip objects.

### **Discussion**

We report the detection of  $CO<sub>2</sub>$  and  $CO$  in 42 and 24 TNOs, respectively, out of a sample of 45 objects observed with NIRSpec instrument on the JWST.  $CO<sub>2</sub>$  is widespread in the trans-Neptunian region, independent of the dynamical class. CO is also widespread and is a common constituent of the reddest and highest-albedo objects in our sample. Significant diversity of  $CO<sub>2</sub>$  and CO content are found in

<span id="page-7-0"></span>

**Figure 4.** Observed fundamental CO<sub>2</sub> band center positions plotted against perihelion temperature, with comparisons to laboratory measurements of various ice mixtures at various temperatures (inverted triangles). TNOs shapes denote NPA23 spectral groups, while colors encode  $CO<sub>2</sub>$  and CO presence. Dashed lines connect the spectra of a mixture taken at different temperatures in the laboratory.

the sample. Our analysis suggests the prevalence of two distinct compositional classes of TNOs:

- Bowl and Bowl-n objects, which have high water ice content with small amounts of  $CO<sub>2</sub>$  ice and possible trace amounts of CO in a few of them (hereafter collectively referred to as BB).
- Cliff and Double-Dip objects, where CO<sub>2</sub> is a predominant ice, with varying amounts of CH<sub>3</sub>OH and CO ices, and smaller amounts of water ice (hereafter referred to collectively as CD).

The existence of two major classes on TNOs has been extensively discussed in the literature, based on their color and other physical and dynamical properties $36-41$  $36-41$ . However, limited information about their compositions was available to confirm or reject this hypothesis. As seen in Fig. [3,](#page-6-0) BB are gray while CD are redder, thus showing a clear compositional link to the historical color groups. Laboratory spectra (Fig. [4\)](#page-7-0) show that the center position of the  $CO<sub>2</sub>$  fundamental absorption band in CD could be explained by  $CO<sub>2</sub>$  either segregated or dominant in mixtures with other molecules. In contrast, mixtures with  $H<sub>2</sub>O$  are the preferred case for BB, even though the feature is highly shifted in several objects. Shifted values for the  $CO<sub>2</sub>$  band centers were also observed in icy moons of the giant planets, where mixes with polar mixtures have also been proposed $^{23}$  $^{23}$  $^{23}$ , though they do not reproduce the full dispersion of centers measured for our sample and are in a different temperature regime that the one affecting the trans-Neptunian population.

A striking characteristic of the  $CO<sub>2</sub>$  observed in the TNOs is the unusual shape of the fundamental band, accompanied by the <sup>13</sup>CO<sub>2</sub> feature and a broad absorption at 4.1  $\mu$ m, all of these features are more evident in the CO<sub>2</sub>-rich, CD group. BB objects have much less  $CO_2$  and a 'normal' fundamental band profile. These characteristics can be approximately reproduced by models of intimate mixtures of water, methanol, and sub-wavelength particles of  $CO<sub>2</sub>$ . We note that some of the difference between the  $CO_2$  band shape between the Cliffs and Double-Dips may be due to the strong 4.1  $\mu$ m absorption in the latter. The need for sub-wavelength particles and the difficulty in mimicking the shape of the wing-peaks for the Double-Dip group can also be taken as an indication that the physical state of the  $CO<sub>2</sub>$  might require more sophisticated models to reproduce the spectra. Nonetheless, the relative ratios of water,  $CO<sub>2</sub>$ , and methanol, based on the models of the  $CO<sub>2</sub>$  fundamental band, suggest a strong link, accretionary and/or evolutionary, between the  $CO<sub>2</sub>$  and intermediary molecules that control the spectral

<span id="page-8-0"></span>

**Figure 5.** Intimate mixture models for the  $CO<sub>2</sub>$  fundamental band in each group defined by NPA23. The spectra of  $CO<sub>2</sub>$ ,  $H<sub>2</sub>O$ , and CH3OH pure ices are also shown as dotted lines. The *y*-axis is the normalized reflectances arbitrarily shifted for better visualization. The contrast in reflectance between the *left*- and *right*-panels are in different scales, therefore band depths should not be compared. Error bars represent the standard deviation within a group.

shape near  $3 \mu$ m. Another remarkable aspect is the variation in the apparent abundance of 13CO2 between the groups, with the Double-Dip having significantly more. Fractionation by sublimation and escape would only very weakly favor retention of  ${}^{13}CO_2$  over  $CO_2$  (the mass ratio being 1.02), so perhaps the differences reflect condensation/accretion processes.

The different states and abundances of the  $CO_2$ ,  $CO$ ,  $H_2O$ , and  $CH_3OH$  in the BB and CD groups, can not be explained by volatile retention mechanisms, which are dominated by the object size and equilibrium temperature, and suggest that these groups originated from separate regions of the solar system. Dynamical models for the formation and evolution of the early solar system propose that TNOs were formed within 20 to ~50 au, beyond the frost lines of  $H_2O$ ,  $CO_2$ ,  $CH_3OH$ , and  $NH_3$ <sup>[42–](#page-15-13)[44](#page-15-14)</sup>. In the late migration scenario<sup>[36,](#page-15-11) [43,](#page-15-15) [44](#page-15-14)</sup>, objects would have remained in that region for several Myrs after the gas and dust of the disk dispersed, subjecting them to higher temperatures and triggering volatile loss during their post-accretional phase. Subsequent planetary migration would later place them in the current, and colder, trans-Neptunian region, where the remaining volatiles could be maintained, and changes in their surface properties by ion irradiation processes became stronger $^{1,6,36,45}$  $^{1,6,36,45}$  $^{1,6,36,45}$  $^{1,6,36,45}$  $^{1,6,36,45}$  $^{1,6,36,45}$ .

The BB and CD groups provide us with a picture of the post-accretional and evolutionary processes that ruled the construction of the trans-Neptunian region. A plausible scenario that could explain our observations is that BB objects formed in an inner icy region of the disk where the most volatile species were quickly depleted due to increased solar flux, resulting in the dominance of  $H_2O$  ice and smaller amounts of  $CO_2$ , which could be co-condensed with  $H_2O$ . The lower abundance of C-bearing species would prevent the formation of complex organics as reddening agents, which would result in them presenting more neutral colors. Several of these objects also show small perihelion distances when compared to the whole sample, so sublimation-driven loss of  $CO<sub>2</sub>$  could be contributing to their lower abundances of the ice. In contrast, CD objects could have formed further out, where  $CH_3OH$ ,  $CO_2$ , and other C-bearing species were more abundant or could survive longer. The  $CO_2$  in these objects could be mostly pure or co-condensed with other ices. A relation between diameter and  $CO<sub>2</sub>$  band depth is present only for the CD group, and not the BB, suggesting that variations of the abundance of this ice within the former is probably also determined by volatile-loss mechanisms, which could have operated more strongly in the early solar system, where objects would be closer to Sun.

CO ice has been previously reported in Pluto and is believed to be supported by the dwarf-planet's atmosphere via vapor pressure equilibrium and seasonal cycle activity<sup>[46,](#page-15-17) [47](#page-15-18)</sup>. The presence of a highly volatile ice, such as CO, in the CD objects as diverse in size as 138537 (2000 OK<sub>67</sub>) and 174567 (2003 MW<sub>12</sub>), with diameters of ∼164 km and ∼ 792 km, respectively, cannot be explained by models of the retention of primordial ices<sup>[1](#page-13-0)</sup>. It is likely that CO was produced by irradiation of the dominant  $CO_2^{48,49}$  $CO_2^{48,49}$  $CO_2^{48,49}$  $CO_2^{48,49}$  or other C-bearing species like CH<sub>3</sub>OH<sup>[8](#page-14-3)</sup> and trapped in the surrounding less volatile ice. Irradiation of

these species, when mixed with  $H_2O$  ice, could also form complex organics, which may explain the redder spectral slope of these objects<sup>[8,](#page-14-3) [50](#page-16-2)</sup>. Additionally, a small amount of  $CO_2$  may also have been produced by irradiation, summing up to the original inventory of CO2 in the body .

Future research should explore the complete compositional properties of these groups with more complex models, and investigate the effects of volatile loss and ion irradiation mechanisms on the balance between the destruction and preservation of icy content in these bodies. These studies, combined with the completion of the acquisition of DiSCo data, will allow a better comprehension of the early and late conditions that these objects experienced since their formation and the regions of the protoplanetary disk where they were formed.

#### **Methods**

#### **The NPA23 Compositional Groups**

The work of NPA23 provides a comprehensive overview of the DiSCo spectral collection, taken with JWST NIRSpec using the Prism/CLEAR combination. NPA23 includes detailed information about the reduction process, as well as a comprehensive list of ice absorption features that have been detected within the sample. An important aspect of that work is the clustering technique applied to the full spectral coverage of 42 TNOs and Centaurs. A combination of Principal Component Analysis and Spectral Clustering algorithms were used to identify four predominant groups of objects, which are studied here in terms of their  $CO_2$  and CO content. These groups were named based on the structure of the 3- $\mu$ m region (see Fig. [1:](#page-4-0) Bowl and Bowl-n are marked with a strong "bowl-shaped" absorption at ∼3  $\mu$ m, including a Fresnel's peak at ~3.15 $\mu$ m, and absorption features at ∼ 1.5 and ∼ 2.0 µm, all associated with the presence of water-ice; in contrast, Cliffs and Double-Dip are marked with a steep drop in reflectance after ∼ 2.5µm, with a much weaker peak at ∼ 3.8µm (stronger for Double-Dips), which is shifted to longer wavelengths in comparison to Bowl and Bowl-n, and the absence of the Fresnel's peak at these wavelength regions.

#### **CO**<sup>2</sup> **Band Parameters**

We applied a Gaussian fitting technique to the  $CO<sub>2</sub>$  fundamental band to extract parametric information, such as band center position and depth. Initially, the spectra of each target were normalized to unity using the median value of the wavelength range between 1.15 - 1.2  $\mu$ m. The normalized reflectance was then transformed to a -log scale as a function of wavenumbers since the band profile is more symmetric in energy. We defined a local linear baseline between 4.20 and 4.33 µm for the continuum based on visual inspection. Note that in Cliff and Double-Dip spectra, the region for the continuum coincides with the wing-peaks surrounding the  $CO<sub>2</sub>$  fundamental feature. Once the continuum was removed, we fitted a single Gaussian curve on the band and extracted their amplitudes and peak positions. These values were then transformed back to wavelength and linear scale to represent the band center position and depth. To estimate the uncertainties of these parameters, we resampled the spectra using a Gaussian distribution for each spectral point, where the normalized reflectance nominal value was considered as the mean, and the uncertainty as the standard deviation. The resampled points were randomly drawn from these Gaussians and used to recalculate the band parameters with the aforementioned procedure. This step was repeated for a thousand iterations, producing a distribution of values for each spectrum. Finally, the average and standard deviation of the parameters over all iterations were taken as the nominal values and uncertainties for the  $CO<sub>2</sub>$  fundamental band center and depth. Table [1](#page-10-0) shows the results of this analysis, coupled with the detection of CO signatures based on visual inspection.

We investigated possible correlations of  $CO<sub>2</sub>$  band parameters with various targets' physical and dynamical properties, including diameter, albedo, visible slope, perihelion distance, and perihelion temperature. Table [2](#page-11-0) lists these parameters for the DiSCo sample used in this work. The visible spectral slopes were extracted from multiple works in the literature<sup>[38](#page-15-19)[–40,](#page-15-20) [51](#page-16-3)</sup>, when spectrum was not available, the photometric fluxes in similar wavelengths were used to estimate the slope. This parameter, named *S* ′ , measures the inclination of the spectra at visible wavelengths (∼ 0.5−0.9µm) and is given in %/1000Å. Diameter and albedos were extracted from the "TNOs are Cool" project<sup>[52](#page-16-4)[–59](#page-16-5)</sup>. For objects that did not have any albedo measurement in the literature, the average albedo of their dynamical classes was taken and used to estimate the diameter<sup>[60](#page-16-6)</sup>. Finally, albedo values, combined with phase integral also extracted from the literature<sup>[61,](#page-16-7) [62](#page-16-8)</sup>, were used to estimate the Bond albedo and to determine the perihelion temperature for each object.

The two most commonly used correlation tests are the Pearson correlation test and the Spearman correlation test. The Pearson correlation test measures the linear relationship between two continuous variables while the Spearman correlation test measures the monotonic relationship between two variables based on their ranks. Pearson is sensitive to linear relationships while Spearman is more sensitive to non-linear relationships. Both coefficients can range from -1 to 1, where negative numbers indicate an anti-correlation. A weak correlation is generally considered to be a value between 0.1 and 0.3, a moderate correlation is between 0.3 and 0.5, and a strong correlation is above 0.5. The error bars for these correlations were estimated following<sup>[63](#page-16-9)</sup> The results of these tests, including their statistical significance and interpretation are described throughout the manuscript.

To compare the  $CO<sub>2</sub>$  fundamental band center positions with laboratory data, we interpolated the latter to NIRSpec spectral resolution and fitted it with a single Gaussian as well. We stress that this fitting method is not meant to be representative of <span id="page-10-0"></span>the true molecular complexity, since band profile can get very complex, but rather to highlight a global trend in the shift of the band of  $CO_2$  for different mixtures. Laboratory data of pure and mixed  $CO_2$  were gathered from the LIDA database<sup>[64](#page-16-10)</sup>. Ice mixtures were prepared at low temperatures and then heated to the temperatures selected here to represent the variability between aphelion and perihelion temperatures. We investigated pure  $CO_2$  ice<sup>[65](#page-16-11)</sup>,  $CO_2$  with CO as a minor component<sup>[66](#page-16-12)</sup> and

|        |                              |                       |             | $CO2$ Center      | $CO2$ Depth                            | CO    |
|--------|------------------------------|-----------------------|-------------|-------------------|--|-------|
| Number | Name                         | Prov. Des.            | Group       | $(\mu m)$         | $(\%)$                                 |       |
|        |                              | 2012 DR30             | Bowl        | $4.282 \pm 0.001$ | $4.874^{+0.602}_{-0.602}$              | No    |
| 32532  | Thereus                      | 2001 PT13             | <b>Bowl</b> | $4.264 \pm 0.002$ | $6.594_{-0.988}^{+0.977}$              | No    |
| 35671  |                              | 1998 SN165            | Bowl        | $4.267 \pm 0.003$ | $9.637 + 1.438$                        | No    |
| 42355  | Typhon                       | 2002 CR46             | Bowl        | $4.262 \pm 0.002$ | –1.461<br>$+0.809$<br>7.367            | No    |
| 120216 | $\overline{\phantom{m}}$     | 2004 EW95             | Bowl        | $4.259 \pm 0.003$ | $-0.817$<br>$8.057 + 1.642$            | Maybe |
| 136204 |                              | 2003 WL7              | Bowl        | $4.268 \pm 0.004$ | $-1.672$<br>$13.363 + 2.480$           | No    |
| 309239 |                              | 2007 RW10             | Bowl        | $4.266 \pm 0.005$ | $-2.553$<br>$7.319^{+1.706}$           | No    |
| 468861 |                              | 2013 LU28             | Bowl        | $4.277 \pm 0.002$ | -1.738<br>$4.533 + 2.088$<br>-2.135    | No    |
| 508338 |                              | 2015 SO <sub>20</sub> | Bowl        | $4.266 \pm 0.005$ | $9.522 + 2.336$<br>2.398               | Maybe |
| 545293 |                              | 2005 CC79             | <b>Bowl</b> | $4.267 \pm 0.004$ | $7.791 + 2.022$<br>$-2.068$            | Yes   |
| 15874  |                              | 1996 TL66             | Bowl-n      | $4.246 \pm 0.003$ | $7.485 + 1.745$<br>-1.778              | No    |
| 444030 |                              | 2004 NT33             | Bowl-n      | $4.259 \pm 0.002$ | $5.239^{+0.688}_{-0.688}$<br>$-0.693$  | No    |
| 455502 |                              | 2003 UZ413            | Bowl-n      | $4.277 \pm 0.003$ | 5.298 $+1.999$<br>$-2.042$             | No    |
| 612533 |                              | 2002 XV93             | Bowl-n      | $4.269 \pm 0.004$ | $5.402 + 1.368$<br>-1.388              | No    |
| 48639  |                              | 1995 TL8              | Cliff       | $4.258 \pm 0.001$ | $13.558 + 1.541$<br>$-1.569$           | Yes   |
| 66652  | Borasisi                     | 1999 RZ253            | Cliff       | $4.267 \pm 0.001$ | $14.596^{+1.138}_{-1.122}$<br>-1.153   | Yes   |
| 79360  | Sila-Nunam                   | 1997 CS29             | Cliff       | $4.266 \pm 0.001$ | $16.002 + 0.995$<br>$-1.007$           | Yes   |
| 84522  |                              | 2002 TC302            | Cliff       | $4.260 \pm 0.001$ | $15.314 + 0.645$<br>-0.649             | Yes   |
| 175113 | ÷,                           | 2004 PF115            | Cliff       | $4.260 \pm 0.001$ | $12.196^{+0.396}_{-0.222}$<br>$-0.398$ | Yes   |
| 250112 | ÷,                           | 2002 KY14             | Cliff       | $4.276 \pm 0.007$ | $5.490^{+1.855}_{-1.002}$<br>-1.892    | No    |
| 307982 |                              | 2004 PG115            | Cliff       | $4.259 \pm 0.001$ | $15.226^{+0.556}_{-0.722}$<br>-0.559   | Yes   |
| 444745 |                              | 2007 JF43             | Cliff       | $4.265 \pm 0.001$ | $11.009 + 0.752$<br>-0.759             | Maybe |
| 445473 |                              | 2010 VZ98             | Cliff       | $4.261 \pm 0.001$ | $12.883^{+0.461}_{-0.421}$<br>$-0.464$ | Yes   |
| 469750 |                              | 2005 PU21             | Cliff       | $4.263 \pm 0.003$ | $7.494 + 1.328$<br>-1.347              | Maybe |
| 470316 | L,                           | 2007 OC10             | Cliff       | $4.279 \pm 0.003$ | $17.249^{+2.734}_{-2.222}$<br>$-2.827$ | No    |
| 523722 | ÷.                           | 2014 LV28             | Cliff       | $4.266 \pm 0.002$ | $13.763_{-1.272}^{+1.255}$<br>-1.274   | Maybe |
| 82155  |                              | 2001 FZ173            | Double-Dip  | $4.267 \pm 0.002$ | $16.714^{+1.855}_{-1.002}$<br>-1.898   | Yes   |
| 120132 |                              | 2003 FY128            | Double-Dip  | $4.264 \pm 0.001$ | $19.618^{+0.987}_{-0.000}$<br>-0.999   | Yes   |
| 120348 |                              | 2004 TY364            | Double-Dip  | $4.263 \pm 0.001$ | $22.781^{+0.784}_{-0.702}$<br>-0.792   | Yes   |
| 138537 |                              | 2000 OK67             | Double-Dip  | $4.264 \pm 0.002$ | $11.936_{-1.028}^{+1.016}$             | Yes   |
| 144897 |                              | 2004 UX10             | Double-Dip  | $4.263 \pm 0.001$ | $19.730^{+1.184}_{-1.202}$             | Yes   |
| 145452 |                              | 2005 RN43             | Double-Dip  | $4.261 \pm 0.000$ | $24.303^{+0.569}_{-0.57}$<br>-0.574    | Yes   |
| 145480 |                              | 2005 TB190            | Double-Dip  | $4.266 \pm 0.001$ | $17.294^{+0.692}_{-0.692}$<br>$-0.698$ | Yes   |
| 174567 | Varda                        | 2003 MW12             | Double-Dip  | $4.265 \pm 0.000$ | $24.358^{+0.548}_{-0.522}$<br>$-0.552$ | Yes   |
| 229762 | G!kun  homdima               | 2007 UK126            | Double-Dip  | $4.260 \pm 0.001$ | $22.073^{+0.626}_{-0.626}$<br>$-0.631$ | Yes   |
| 230965 | $\qquad \qquad \blacksquare$ | 2004 XA192            | Double-Dip  | $4.261 \pm 0.001$ | $23.732^{+0.851}_{-0.021}$<br>$-0.860$ | Yes   |
| 470596 |                              | 2008 NW4              | Double-Dip  | $4.262 \pm 0.001$ | $14.280\substack{+1.002\\-1.014}$      | Yes   |
| 471137 |                              | 2010 ET65             | Double-Dip  | $4.255 \pm 0.003$ | $15.054^{+1.905}_{-1.949}$             | Yes   |
| 471143 | Dziewanna                    | 2010 EK139            | Double-Dip  | $4.263 \pm 0.001$ | $19.909^{+1.216}_{-1.221}$<br>$-1.234$ | Yes   |
| 471210 |                              | 2010 VW11             | Double-Dip  | $4.262 \pm 0.001$ | $17.940^{+1.007}_{-1.019}$             | Yes   |
| 523777 |                              | 2014 YF50             | Double-Dip  | $4.266 \pm 0.001$ | $16.222^{+0.580}_{-0.584}$             | Yes   |
| 552555 |                              | 2010 ER65             | Double-Dip  | $4.262 \pm 0.002$ | $15.974$ $^{+1.359}_{-1.382}$          | Yes   |
| 52872  | Okyrhoe                      | 1998 SG35             | Misfit      |                   |  | No    |
| 310071 |                              | 2010 KR59             | Misfit      |                   |  | No    |
| 416400 |                              | 2003 UZ117            | Misfit      |                   |  | No    |

Table 1. Results of the CO<sub>2</sub> fundamental band parameter extracted using Gaussian fitting. Detections of CO based on visual inspection are also listed.

<span id="page-11-0"></span>

|             |                          |                       | DC                   | a      | e    | $\mathbf{i}$ | q    | H     | D                        |                                   | $p_V$ H/E | $T_q$ | S' vis                |
|-------------|--------------------------|-----------------------|----------------------|--------|------|--------------|------|-------|--------------------------|-----------------------------------|-----------|-------|-----------------------|
| Number Name |                          | Prov Des              |                      | (au)   |      | (°)          | (au) | (mag) | (km)                     |                                   |           | (K)   | $(\%/1000\text{\AA})$ |
| 32532       | Thereus                  | 2001 PT13             | Centaur              | 10.6   | 0.20 | 20.4         | 8.5  | 9.2   | $62^{+3}_{-3}$           | $0.08 \substack{+0.02 \\ -0.01}$  | S/H       | 95    | $9.48 \pm 2.01$       |
| 52872       | Okyrhoe                  | 1998 SG35             | Centaur              | 8.4    | 0.30 | 15.6         | 5.8  | 10.9  | $35^{+3}_{-3}$           | $0.06 \substack{+0.01 \\ -0.01}$  | S/H       | 115   | $11.27 \pm 3.22$      |
| 136204      | $\overline{\phantom{a}}$ | 2003 WL7              | Centaur              | 20.1   | 0.26 | 11.2         | 14.9 | 8.7   | $105^{+6}_{-7}$          | $0.05 \substack{+0.01 \\ -0.02}$  | S/H       | 72    | $11.7 \pm 2.06$       |
| 250112      | $\overline{\phantom{a}}$ | 2002 KY14             | Centaur              | 12.6   | 0.32 | 19.5         | 8.6  | 9.7   | $47^{+3}_{-4}$           | $0.06^{+0.01}_{-0.01}$            | S/H       | 94    | 33.42±2.46            |
| 310071      | $\overline{a}$           | 2010 KR59             | Centaur              | 29.8   | 0.56 | 19.7         | 13.0 | 7.8   | $110^{+30}_{-30}$        | $0.12^{+0.04}_{-0.04}$            | S/H       | 76    | 23.89±4.47            |
| 468861      |                          | 2013 LU28             | Centaur              | 190.8  | 0.95 | 125.3        | 8.7  | 8.3   | $120^{+130}_{-30}\,$     | $0.06^{+0.04}_{-0.04}$            | E         | 94    | $15.06 \pm 1.0$       |
|             |                          | 2012 DR30             | Centaur              | 1003.8 | 0.99 | 78.0         | 14.5 | 7.1   | $188^{+9}_{-9}$          | $0.08 \substack{+0.03 \\ -0.03}$  | S/H       | 72    | $14.5 \pm 1.1$        |
| 15874       |                          | 1996 TL66             | Scattering           | 84.3   | 0.59 | 23.9         | 35.0 | 5.4   | $339^{+20}_{-20}$        | $0.11^{+0.02}_{-0.02}$            | S/H       | 46    | $3.75 \pm 3.46$       |
| 42355       | Typhon                   | 2002 CR46             | Scattering           | 37.5   | 0.53 | 2.4          | 17.5 | 7.6   | $185^{+7}_{-7}$          | $0.04^{+0.01}_{-0.01}$            | S/H       | 66    | 13.97±3.01            |
| 82155       | $\overline{\phantom{a}}$ | 2001 FZ173            | Scattering           | 84.3   | 0.62 | 12.7         | 32.4 | 6.2   | $320^{+408}_{-82}$       | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 48    | $17.27 \pm 1.84$      |
| 309239      | $\overline{\phantom{a}}$ | 2007 RW10             | Scattering           | 30.4   | 0.30 | 36.0         | 21.3 | 6.8   | $247^{+30}_{-30}$        | $0.08 \substack{+0.07 \\ -0.04}$  | S/H       | 60    |                       |
| 445473      | ÷,                       | 2010 VZ98             | Scattering           | 158.3  | 0.78 | 4.5          | 34.4 | 5.1   | $541^{+691}_{-138}$      | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 47    | $30.59 \pm 1.12$      |
| 469750      | $\overline{a}$           | 2005 PU21             | Scattering           | 184.0  | 0.84 | 6.2          | 29.3 | 6.5   | $284^{+362}_{-72}$       | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 51    | $23.75 \pm 0.9$       |
| 471210      | ÷,                       | 2010 VW11             | Scattering           | 51.0   | 0.28 | 27.8         | 36.6 | 5.5   | $450^{+574}_{-115}$      | $0.06_{-0.05}^{+0.05}$            | E         | 45    |                       |
| 508338      | L,                       | 2015 SO <sub>20</sub> | Scattering           | 172.7  | 0.81 | 23.4         | 33.2 | 6.6   | $261^{+333}_{-67}$       | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 48    | $15.95 \pm 0.9$       |
| 523722      | L,                       | 2014 LV28             | Scattering           | 70.0   | 0.51 | 10.7         | 34.3 | 5.7   | $401^{+512}_{-102}$      | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 47    | $18.54 \pm 0.9$       |
| 523777      |                          | 2014 YF50             | Scattering           | 78.9   | 0.55 | 18.2         | 35.7 | 5.4   | $465^{+593}_{-119}$      | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 46    |                       |
| 545293      |                          | 2005 CC79             | Scattering           | 47.5   | 0.57 | 18.3         | 20.4 | 7.2   | $203^{+259}_{-52}$       | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 61    |                       |
| 552555      | $\overline{a}$           | 2010 ER65             | Scattering           | 96.7   | 0.59 | 21.3         | 40.0 | 5.2   | $503^{+642}_{-128}$      | $0.06 \substack{+0.05 \\ -0.05}$  | E         | 43    |                       |
| 84522       |                          | 2002 TC302            | Resonant             | 55.6   | 0.30 | 35.0         | 39.2 | 3.9   | ${\bf 584^{+105}_{-88}}$ | $0.12^{+0.05}_{-0.03}$            | S/H       | 44    | 29.33±2.4             |
| 120216      | $\sim$                   | 2004 EW95             | Resonant             | 39.3   | 0.31 | 29.3         | 27.0 | 6.6   | $291^{+20}_{-25}$        | $0.04\substack{+0.02 \\ -0.02}$   | S/H       | 53    | $1.71 \pm 2.06$       |
| 444745      | $\overline{\phantom{a}}$ | 2007JF43              | Resonant             | 39.3   | 0.19 | 15.1         | 32.0 | 5.4   | $271^{+89}_{-44}$        | $0.16_{-0.07}^{+0.07}$            | E         | 49    | $40.89 \pm 0.9$       |
| 455502      | $\overline{\phantom{a}}$ | 2003 UZ413            | Resonant             | 39.4   | 0.22 | 12.0         | 30.7 | 4.3   | $670^{+84}_{-82}$        | $0.07_{-0.02}^{+0.02}$<br>$-0.02$ | S/H       | 50    | $6.64 \pm 3.72$       |
| 471143      | Dziewanna                | 2010 EK139            | Resonant             | 69.1   | 0.53 | 29.5         | 32.5 | 4.1   | $433^{+63}_{-64}$        | $0.30^{+0.11}_{-0.02}$<br>$-0.08$ | S/H       | 47    |                       |
| 612533      | $\overline{\phantom{a}}$ | 2002 XV93             | Resonant             | 39.3   | 0.12 | 13.3         | 34.5 | 4.9   | $549^{+21}_{-23}$        | $0.04^{+0.02}_{-0.02}$<br>$-0.02$ | S/H       | 47    | $0.85 \pm 2.06$       |
| 35671       | $\overline{a}$           | 1998 SN165            | <b>Hot Classical</b> | 38.2   | 0.05 | 4.6          | 36.5 | 5.7   | $393^{+39}_{-38}$        | $0.06^{+0.02}_{-0.02}$<br>$-0.01$ | S/H       | 46    | $8.24 \pm 4.91$       |
| 120348      | $\overline{\phantom{a}}$ | 2004 TY364            | <b>Hot Classical</b> | 39.1   | 0.06 | 24.8         | 36.6 | 4.4   | $512^{+37}_{-40}$        | $0.11_{-0.02}^{+0.02}$<br>$-0.02$ | S/H       | 46    | $20.78 \pm 3.17$      |
| 138537      | $\overline{\phantom{a}}$ | 2000 OK67             | <b>Hot Classical</b> | 47.0   | 0.15 | 4.9          | 40.0 | 6.2   | $164^{+33}_{-45}$        | $0.17^{+0.16}_{-0.02}$<br>$-0.05$ | S/H       | 43    | $20.14 \pm 4.59$      |
| 144897      | $\overline{\phantom{a}}$ | 2004 UX10             | <b>Hot Classical</b> | 39.3   | 0.04 | 9.5          | 37.6 | 4.4   | $398^{+32}_{-39}$        | $0.14^{+0.04}_{-0.03}$            | S/H       | 45    | $20.23 \pm 4.4$       |
| 145452      | $\overline{a}$           | 2005 RN43             | <b>Hot Classical</b> | 41.9   | 0.03 | 19.2         | 40.6 | 3.7   | $679^{+55}_{-73}$        | $0.11^{+0.03}_{-0.02}$            | S/H       | 43    | $20.34 \pm 0.9$       |
| 174567      | Varda                    | 2003 MW12             | <b>Hot Classical</b> | 45.8   | 0.15 | 21.5         | 39.1 | 3.5   | $792^{+91}_{-84}$        | $0.10_{-0.02}^{+0.02}$            | S/H       | 44    | $17.11 \pm 7.64$      |
| 175113      | $\overline{a}$           | 2004 PF115            | Hot Classical        | 39.3   | 0.06 | 13.4         | 36.9 | 4.5   | $468^{+38}_{-49}$        | $0.12^{+0.04}_{-0.03}$            | S/H       | 45    |                       |
| 416400      |                          | 2003 UZ117            | <b>Hot Classical</b> | 44.4   | 0.14 | 27.4         | 38.4 | 5.3   | $222^{+57}_{-42}$        | $0.29_{-0.11}^{+0.16}$            | S/H       | 43    | $-2.1 \pm 2.0$        |
| 444030      |                          | 2004 NT33             | Hot Classical        | 43.8   | 0.15 | 31.2         | 37.1 | 4.6   | $423^{+87}_{-80}$        | $0.13_{-0.04}^{+0.07}$            | S/H       | 45    | $2.54 \pm 0.9$        |
| 470596      |                          | 2008 NW4              | <b>Hot Classical</b> | 45.6   | 0.20 | 23.1         | 36.6 | 5.7   | $293^{+665}_{-127}$      | $0.11^{+0.22}_{-0.22}$<br>$-0.22$ | E         | 46    | $22.89 \pm 0.9$       |
| 66652       | Borasisi                 | 1999 RZ253            | Cold Classical       | 44.1   | 0.09 | 0.6          | 40.2 | 5.9   | $163^{+32}_{-66}$        | $0.24_{-0.08}^{+0.44}$            | S/H       | 42    | $34.2 \pm 3.9$        |
| 79360       | Sila-Nunam               | 1997 CS29             | Cold Classical       | 43.7   | 0.01 | 2.3          | 43.4 | 5.3   | $343^{+42}_{-42}$        | $0.09 \substack{+0.03 \\ -0.02}$  | S/H       | 42    | 28.39±3.34            |
| 48639       | $\overline{a}$           | 1995 TL8              | Detached             | 53.0   | 0.24 | 0.2          | 40.1 | 4.9   | $244^{+82}_{-63}$        | $0.23_{-0.10}^{+0.19}$            | S/H       | 43    | $23.17 \pm 6.08$      |
| 120132      | $\overline{a}$           | 2003 FY128            | Detached             | 49.1   | 0.25 | 11.8         | 37.0 | 4.8   | $460^{+21}_{-21}$        | $0.08 \substack{+0.01 \\ -0.01}$  | S/H       | 45    | $21.48 \pm 3.46$      |
| 145480      |                          | 2005 TB190            | Detached             | 76.9   | 0.40 | 26.4         | 46.2 | 4.5   | $464^{+62}_{-62}$        | $0.15_{-0.04}^{+0.05}$            | S/H       | 40    | $18.63 \pm 1.89$      |
| 229762      | G!kun  homdima           | 2007 UK126 Detached   |                      | 73.9   | 0.49 | 23.4         | 37.6 | 3.5   | $599^{+77}_{-77}$        | $0.17^{+0.06}_{-0.04}$            | S/H       | 44    | $20.85 \pm 3.17$      |
| 230965      |                          | 2004 XA192 Detached   |                      | 47.2   | 0.25 | 38.2         | 35.5 | 4.3   | $339^{+120}_{-95}$       | $0.26_{-0.15}^{+0.34}$            | S/H       | 45    |                       |
| 307982      |                          | 2004 PG115            | Detached             | 92.1   | 0.60 | 16.3         | 36.5 | 5.0   | $323^{+999}_{-128}$      | $0.17^{+0.29}_{-0.29}$            | Е         | 46    | $25.42 \pm 0.9$       |
| 470316      | $\overline{\phantom{a}}$ | 2007 OC10             | Detached             | 50.2   | 0.29 | 21.7         | 35.5 | 5.3   | $309\frac{+37}{-37}$     | $0.13_{-0.03}^{+0.04}$            | S/H       | 46    | $16.0 \pm 0.9$        |
| 471137 -    |                          | 2010 ET65             | Detached             | 61.7   | 0.36 | 30.7         | 39.6 | 5.2   | $291^{+898}_{-115}$      | $0.17^{+0.29}_{-0.29}$            | Е         | 44    |                       |

**Table 2.** Dynamical and physical properties of DiSCo targets analyzed in this work. The column H/E marks if the diameters were taken from Spitzer/Hershel observations (S/H), or estimated (E) based on the average albedo of the dynamical class.

 $CO_2$  mixed with or in polar ice like H<sub>2</sub>O and CH<sub>3</sub>OH<sup>[34](#page-15-9)</sup>. We also included  $CO_2$  formed by irradiation of CH<sub>3</sub>OH for which a H<sub>2</sub>O:CH<sub>3</sub>OH (1:1) ice mixture was prepared and irradiated with 30 keV H<sup>+</sup> at 35K and then heated<sup>[50](#page-16-2)</sup>. Interpolation and Gaussian fits were performed using Quasar's spectroscopy toolbox<sup>[67](#page-16-13)</sup>.

#### **CO**<sup>2</sup> **fundamental band models**

We used a Bayesian inference framework to find local fits to the  $CO<sub>2</sub>$  fundamental feature for the spectra of each individual group from NPA23. We stress that the focus here is not to model the whole spectra of the groups, but rather to investigate the mechanisms that could be producing the unexpected profile of the absorption features. The average spectrum of each group was first trimmed from 4.1  $\mu$ m to 4.5  $\mu$ m to select only the spectral region containing the CO<sub>2</sub> fundamental feature (Fig. [1\)](#page-4-0).

Bayesian inference requires a forward model that could produce synthetic spectra comparable to those observed by JWST. Here we use the simplified one-dimensional geometrical-optics formulation by Shkuratov et al.  $(1999)^{35}$  $(1999)^{35}$  $(1999)^{35}$  for the scattering of light on particulate surfaces as the forward model. The model estimates the interaction of incident light with a medium of regolith grains by approximating the surface with a thick slab, where the radiation undergoes multiple scattering events and becomes diffuse within the medium. As a result, the direction of the radiation becomes randomized, and the radiation is assumed to be emitted and absorbed isotropically within the medium. We caution that this assumption may not hold true for sub-wavelength grains, and the sense of grain might lose its meaning. The input for the model includes the grain size, abundance, and porosity, which define the prior parameter space that needs to be explored. The porosity has minor effects on the overall shape of the spectra and was fixed at 0.5.

In the context of Bayesian statistics, we are interested in finding the posterior distribution *P*(Θ|*D*,*M*) of a set of input parameters Θ (fractions, grain sizes, and porosity) for the model (*M*) that best-fit the spectroscopic data (*D*), obtained by a telescope. To estimate the posterior, we refer to the Bayes theorem:

$$
P(\Theta|D,M) = \frac{L(D|\Theta,M)\pi(\Theta|M)}{Z(D|M)}\tag{1}
$$

where  $L(D|\Theta, M)$  is the likelihood of the observed spectra given the input parameters for the model,  $\pi(\Theta, M)$  is the prior knowledge about these input parameters, and *Z*(*D*,*M*) is the evidence, which is the integral of the model over the all prior domain  $Ω<sub>Θ</sub>$  (i.e. over all possible combinations of parameters):

$$
Z(D|M) = \int_{\Omega_{\Theta}} L(D|\Theta, M)\pi(\Theta, M)d\Theta
$$
\n(2)

The dimension of this integral is equal to the number of parameters of the model, i.e., twice (grain sizes and fractional abundances) the number of optical constants used. This number can be significantly high if the surface of the object is constituted of a mixture of several materials with different grain size distributions. Therefore, the computation of the evidence can be challenging, and analytically intractable, requiring the use of numerical methods. We used the  $\gamma^{68,69}$  $\gamma^{68,69}$  $\gamma^{68,69}$  $\gamma^{68,69}$  Python-language implementation of Nested Sampling<sup>[70,](#page-17-1)[71](#page-17-2)</sup> for this task, which allows an efficient sample of high-dimensional parameter space by repetitively shrinking the prior domain based on likelihood constraints, towards maximizing the likelihood. The algorithm maintains a set of "live" points (*nlive*) to occupy the posterior distribution. At each iteration, random points are sampled from the prior domain ( $\Omega_{\theta}$ ), and their likelihoods are calculated. The points with the lowest likelihoods are used to define an iso-likelihood contour and are sequentially discarded. This iso-likelihood is used as a hard constraint to the sampling of new points, and this procedure is repeated until convergence, or in the nested sampling case until the desired resolution for the evidence calculation, is obtained.

A required condition for generating spectra of internally mixed materials is that their fractional abundances sum to unity. This criterion can be fulfilled by using a Dirichlet distribution for the prior fractional abundance. The Dirichlet probability density function (PDF) is given by:

$$
\pi(\Theta, M) = Dir(x_1, x_2, \dots; \alpha_1, \alpha_2, \dots) = \frac{1}{B(\alpha)} \prod_{i=1}^{K} x^{\alpha_i - 1}
$$
\n(3)

with *x* representing the abundance of a component,  $\alpha$  is the concentration parameter, and  $B(\alpha)$  is the multinomial beta function:

$$
B(\alpha) = \frac{\prod_{i=1}^{K} \Gamma(\alpha_i)}{\Gamma(\sum_{i=1}^{K} \alpha_i)},
$$
\n(4)

where Γ is the gamma function. The  $\alpha$  parameter measures the uniformity of the distribution. If  $\alpha_i = 1$  for each component, the PDF of all components is even, and therefore all components are sampled uniformly.

In contrast to the fractional abundance prior, the grain sizes can assume any value within a boundary. Therefore, in this case, we use a Uniform distribution:

$$
U(g) = \begin{cases} \frac{1}{g_{max} - g_{min}} & \text{for } g_{min} \le g \le g_{max} \\ 0 & \text{for } g_{min} < g \text{ and } g_{max} > g \end{cases}
$$
(5)

In this work, we allowed the grain sizes to vary between 0.1 to 1000  $\mu$ m ( $g_{min}$  and  $g_{max}$ ). The nested sampling technique requires that the prior distribution for both the fractional abundances and grain sizes are transformed into hypercube units, where dimensions have lengths equal to unity.

Finally, the likelihood is estimated by the chi-square "distance" between the observed spectra (*D*) and the one produced for an intimate mixture with the model (M) with a set of input parameters  $\Theta_i$ .

$$
L(\Theta|D,M) = -0.5 \times \log(\chi^2) \tag{6}
$$

where  $\chi^2$  is given by the general formula:

$$
\chi^2 = \sum_{i=1}^N \frac{(D_i - M_i^{\Theta})^2}{\sigma_i^2} \tag{7}
$$

where  $D_i$  and  $M_i^{\Theta}$  are the normalized spectral reflectance at the *i*-th wavelength of the observed and synthetic data, respectively.

<span id="page-13-1"></span>The optical constants that were used for the modeling include water-ice, organics, methanol,  $CO<sub>2</sub>$ , complex organics, and silicates. Detailed information about these optical constants and their references is presented in Table [3.](#page-13-1) Results for the best fit of the CO<sup>2</sup> fundamental feature of each group from NPA23 are presented in Table [4](#page-13-2) and Fig. [5.](#page-8-0) We include an additional model for the Double-Dip (M2), which shows more prominent wing-peaks as a result of higher methanol abundance.

| <b>Optical Constant</b> | Phase       | Temperature | Ref   |
|-------------------------|-------------|-------------|-------|
| CO <sub>2</sub>         |             | 12.5 K      | 72    |
| H <sub>2</sub> O        | amorphous   | 40 K        | 73.74 |
| H <sub>2</sub> O        | crystalline | 40 K        | 73.74 |
| CH <sub>3</sub> OH      | amorphous   | 100K        | 75.76 |
| Titan tholin            |             | 170 K       | 77    |
| Tritan tholin           |             | 170 K       | 77    |
| Piroxene (P4)           |             |             | 78    |
| Olivine                 |             |             | 78    |

**Table 3.** Optical constants used for the models in this work.

<span id="page-13-2"></span>

|               | Water ice |            |           |            | Methanol  |            | Other components |
|---------------|-----------|------------|-----------|------------|-----------|------------|------------------|
| Group         | Abundance | Grain size | Abundance | Grain size | Abundance | Grain size | Abundance        |
|               | (%)       | $(\mu m)$  | $(\%)$    | $(\mu m)$  | $(\%)$    | $(\mu m)$  | $(\%)$           |
| Bowl          | 54.2      |            |           | 0.35       |           | 350        | 45.4             |
| Bowl-N        |           | 6.5        | 1.3       | 0.6        | 7.4       | 300        | 14.3             |
| Cliff         |           | 350        | 61        | 0.3        | 14        | 250        | 24               |
| Double-Dip    |           | $\sim$     | 59        | 0.6        | 31        | 250        |                  |
| Double-Dip M2 |           |            | 50        | 0.6        | 50        | 250        |                  |

**Table 4.** Best-fit mixture models for local fitting of the CO<sub>2</sub> fundamental band. Other components include complex organics (Titan and Triton tholin), and silicates (Olivine and Piroxene).

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### **Author contributions statement**

MDP performed the statistical analysis, compositional models, and overall analysis and interpretation of results. EH performed the calculation of band parameters, comparison with laboratory data, and overall analysis and interpretation of results. NPA, BJH, RB, and ACSF contributed significantly to the discussion and interpretation of the results. TM provided size, albedo and temperature calculation. All other authors reviewed the manuscript and contributed to the discussion of results.