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4	An evolutionary system of mineralogy: Proposal for a classification
5	of planetary materials based on natural kind clustering
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10	
11	Abstract
12	Minerals reveal the nature of the co-evolving geosphere and biosphere through billions of years
13	of Earth history. Mineral classification systems have the potential to elucidate this rich
14	evolutionary story; however, the present mineral taxonomy, based as it is on idealized major
15	element chemistry and crystal structure, lacks a temporal aspect and thus cannot reflect planetary
16	evolution. A complementary evolutionary system of mineralogy based on the quantitative
17	recognition of "natural kind clustering" for a wide range of condensed planetary materials with
18	different paragenetic origins has the potential to amplify, though not supersede, the present
19	classification system.
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23	Keywords: philosophy of mineralogy; classification; mineral evolution; mineral ecology; data-

24 driven discovery; cluster analysis; natural kinds

#### INTRODUCTION

For more than 2000 years, the classification of natural objects and phenomena into "kinds" has 26 been a central pursuit of natural philosophers (Aristotle/Thompson 1910; Locke 1690; Linnaeus 27 28 1758). The modern mineral classification system, rooted in the chemical framework of James Dwight Dana (1850), is based on unique combinations of idealized major element composition 29 and crystal structure (Strunz 1941; Palache et al. 1944, 1951; Liebau 1985; Mills et al. 2009). This 30 robust and effective scheme not only allows for the unambiguous and reproducible categorization 31 32 of most natural crystalline materials, but it also reflects the thermodynamic importance of end-33 member phases in characterizing the complex natural world. However, this system of mineralogy is but one of many potentially valid formalisms; natural condensed materials have also been 34 35 successfully organized according to their importance to specialized fields, for example in gemology, ore geology, petrology, or the construction industry. 36

Effective scientific classification systems not only define and organize objects of nature, but 37 they also reflect and elaborate current theory, for example in the context of an evolving natural 38 world. Biological classification schemes from Linnaeus' Systema Naturae (1758), to those 39 incorporating patterns of interbreeding (e.g., Mayr 1969), to modern genetic analyses (e.g., Pace 40 2009; Ruggiero et al. 2015) implicitly incorporate information on inherited similarities, coupled 41 with differences that arise through Darwinian selection, and thus are effectively evolution-based 42 43 (Richards 2016). Many other familiar classification systems incorporate evolutionary time series, either explicitly (i.e., the stages of cell division; embyogenesis) or implicitly (stellar classification; 44 human technologies). 45

By contrast, mineralogical classification systems, which traditionally have been more deeply
rooted in inorganic chemistry and materials science than planetary evolution, have long relied on

a combination of physical and chemical attributes to distinguish mineral "species" (Burke 1969; 48 Povarennykh 1972; Hazen 1984). This longstanding tradition does not incorporate a temporal or 49 evolutionary framework, either implicitly or explicitly (however, see Heaney 2016). Here I 50 51 propose a complementary classification method that exploits the inherent evolving "messiness" of planetary materials by grouping them according to "natural kind clusters" (Boyd 1999). Natural 52 solids, including a variety of noncrystalline condensed materials not represented by the current 53 formalism, can be categorized by distinct "kinds" according to their distinctive combinations of 54 55 nonideal atomic structures, complex chemical compositions, variable physical properties, and diverse modes of origin. Cluster analysis based on the observed range of properties in natural 56 specimens thus complements and amplifies, though not supercedes, the present mineral 57 58 classification scheme as codified by the International Mineralogical Association (IMA). By recognizing natural kinds of planetary materials, this approach to mineral classification 59 incorporates an evolutionary component in addition to chemistry and structure. 60

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# NATURAL VERSUS ARTIFICIAL CLASSIFICATION OF MINERALS

A longstanding philosophical debate considers the extent to which a basis exists for "natural" 63 classification of kinds-a division of natural objects based on the organization of nature, as 64 opposed to human-imposed "artificial" classification rules (Mill 1884; Dupré 1981; Kuhn 2000; 65 66 Hawley and Bird 2011; Magnus 2012; Wilkins and Ebach 2013; Bird and Tobin 2018). Some natural systems would seem to provide unambiguous quantifiable categories on which to base a 67 classification system [relativist claims that all human classifications are inherently artificial 68 69 notwithstanding (e.g., Woolgar 1988; Kukla 2000)]. For example, a unique integral number of protons in the nucleus defines each chemical element. Further subdivision according to the integral 70

number of neutrons defines each isotope. Thus, in the case of atoms nature has provided an
unambiguous quantitative basis for classification of kinds.

73 In the more nuanced example of biological systems, because each new genetic characteristic 74 arises at a specific time in a specific organism, a natural classification of living organisms based on an evolutionary sequence of genetic modifications seems plausible. [A significant caveat is the 75 recognition of pervasive lateral gene transfer, especially among microbial communities-a mode 76 of evolutionary change less amenable to a simple timeline and branching tree of life (e.g., Doolittle 77 78 2000; Ochman et al. 2000; Keeling and Palmer 2008).] By contrast, many other classification 79 systems of the natural world, such as the segmentation of the continuous electromagnetic spectrum into partially overlapping ranges of radio, microwave, infrared, etc., or of visible light into colors, 80 81 resort to the division of nature into more arbitrary kinds. The extent to which humans impose arbitrary classification rules to define kinds, however quantitative and reproducible that system 82 may be, reflects the extent to which a classification system can be described as artificial as opposed 83 to natural. 84

In this context, the present classification system of minerals incorporates both natural traits and 85 artificial rules. The IMA chemical and structural rules for defining and approving new species are 86 unambiguous, independently quantifiable characteristics of minerals. However, the idealized 87 compositions and crystal structures of IMA mineral species are rarely observed in nature; 88 89 therefore, rules defining minerals based on the dominant major elements and idealized crystal structures do not fully reflect natural mineralogical kinds. In response, this contribution proposes 90 a modification and amplification of the present mineral classification schema-an evolutionary 91 92 system of mineralogy that incorporates mineral modes of formation and thus essential aspects of planetary evolution. 93

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# SHORTCOMINGS OF THE PRESENT MINERAL CLASSIFICATION SYSTEM

What constitutes the most natural division of the mineral kingdom? The present system of 96 97 mineral classification possesses the important advantage of establishing unambiguous criteria for the identification of the great majority of natural crystalline materials, both known and yet to be 98 discovered and described. Following a rigorous IMA approval process, each valid mineral species 99 is defined by a unique combination of idealized major element chemistry and crystal structure. 100 101 This protocol satisfies the most basic requirement of any classification scheme—independently 102 reproducible and verifiable criteria for assigning mineral names; as of 30 October 2018, a total of 5370 mineral species had been approved by the IMA (rruff.info/ima). 103

104 Longstanding questions in mineralogy ask how many different kinds of minerals occur on Earth? Does that number change through time? How does that number on Earth compare to other 105 (typically less well endowed) planets and moons, both in our solar system and beyond? And by 106 what natural physical, chemical, and biological processes do new minerals arise? Those questions 107 108 have been explored recently in the contexts of "mineral evolution" and "mineral ecology," which analyze the temporal and spatial diversity and distribution of minerals, respectively (Zhabin 1981; 109 Hazen et al. 2008, 2015, 2016; Hystad et al. 2015). Unfortunately, these questions of mineral 110 diversity and planetary evolution cannot be fully resolved using the IMA criteria for differentiating 111 112 mineral species.

113 This contribution introduces a complementary division of condensed planetary materials into 114 natural kinds based on the observed range of chemical and physical characteristics of any natural 115 condensed phase—properties that reflect not only a substance's major element chemistry and 116 crystal structure, but also its paragenetic mode (i.e., the physical, chemical, and/or biological

process by which it formed). Based on this genetic, evolutionary definition of natural mineral kinds, at least three categories of planetary materials are imperfectly catalogued by the present mineral classification system: (1) distinct natural kinds that have been lumped in the IMA classification; (2) individual natural kinds that have been split by the IMA classification; and (3) noncrystalline materials.

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Natural kinds that have been lumped by the IMA classification: The IMA mineral species 123 124 criteria of idealized major element composition and crystal structure in some instances lump 125 together demonstrably distinct natural kinds of minerals. Diamond offers a dramatic example (Table 1). The first mineral in the cosmos was nanocrystalline diamond that condensed from 126 127 incandescent, expanding and cooling gases ejected from the first generation of large stars more than 13 billion years ago (Hazen et al. 2008; Ott 2009). These vapor-deposited nanodiamonds, 128 which still must form in vast numbers around energetic stars across the universe today and which 129 are distinct from all other diamond populations in their origins, morphologies, isotopic 130 compositions, and other properties [for example, anomalous microwave emissions (Greaves et al. 131 2018)], fall to Earth in chondrite meteorites and presolar grains. 132

Contrast these well-traveled nanodiamonds with two populations of mantle-derived macroscopic crystals, some formed from deep, high-pressure carbon-bearing aqueous solutions, including "Type I" diamonds with IR- and UV-absorbing nitrogen impurities (Davis 1984; Shirey et al. 2013; Sverjensky and Huang 2015), and others from deep, high-pressure, carbon-saturated Fe-Ni melts (including nitrogen-poor, IR-transparent "Type II" diamonds; Smith et al. 2016). Equally distinct is the enigmatic "carbonado" form of diamond, which typically consists of porous, black, superhard sintered masses (Heaney et al. 2005; Garai et al. 2006). In addition, microscopic diamond with a disordered structure (equivalent to the now discredited "lonsdaleite") can form
from carbonaceous material subject to the shock of large impacts (Vishnevsky and Raitala 2000;
Németh et al. 2014). Thus, from the standpoint of cosmic evolution, the mineral species "diamond"
can be viewed as at least five different natural kinds of minerals, each with a distinct set of
properties, mode of origin, and age range of formation (Table 1).

Similar arguments can be presented for many common minerals. Microscopic hydroxylapatite 145 grains in chondrite meteorites differ in several respects from the coarser euhedral hydroxylapatite 146 147 crystals in granitic pegmatite, which are in turn distinct from the hydroxylapatite/biopolymer composites of teeth and bones (Harlov and Rakovan 2015). Likewise, guartz displays multiple 148 kinds: in granite and granite pegmatite, in hydrothermal veins, in quartile, and in the biosilica of 149 150 diatom skeletons (Heaney et al. 1994; Wysokowski et al. 2018). Pyrite differs in polymetallic veins, in black shales, and pyritized brachiopods (Rickard 2015); while calcite occurs in abiotic 151 precipitates, biomineralized shells, and a dozen other contexts (Reeder 1983; Dove 2010). 152

Mineral solid solutions offer additional examples of the lumping of distinctive natural kinds. 153 Of special note are the plagioclase feldspars, the most abundant minerals in Earth's crust (Rudnick 154 and Gao 2005) and probably on Mars (Milam et al. 2010). The official division of plagioclase into 155 two idealized end-member species, albite (NaAlSi<sub>3</sub>O<sub>8</sub>) and anorthite (CaAl<sub>2</sub>Si<sub>2</sub>O<sub>8</sub>), does not reflect 156 the varied paragenetic modes of intermediate compositions (Klein and Hurlbut 1980; Wenk and 157 158 Bulakh 2004). Andesine, oligoclase, labradorite, and bytownite, though admittedly defined by somewhat arbitrary and overlapping criteria, long served petrologists as useful natural mineral 159 categories (e.g., Tilley et al. 1964). 160

161 Therefore, in the planetary context of understanding mineral diversity and distribution through 162 deep time, especially in enumerating the evolving numbers of mineral kinds and their global

distributions, many IMA-approved mineral species should be split into two or more distinctive
 natural kinds, each with a quantifiable combination (i.e., clustering) of physical and chemical
 properties.

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Natural kinds that have been artificially split by the IMA classification: In many instances, especially in mineral structure groups with great compositional plasticity, the division of minerals into numerous species according to ideal end-member compositions potentially results in the artificial splitting of natural kinds. By imposing compositional boundaries between species of minerals that occur in a continuous solid solution, the present mineral classification scheme does not adequately reflect natural kinds with wide ranges of solid solution.

173 The tourmaline supergroup is a case in point. The IMA now recognizes at least 32 approved species of tournaline (with 8 more species pending), each with a different distribution of major 174 elements among six of its crystallographic sites (Henry et al. 2011; Grew et al. 2017; rruff.info/ima, 175 176 accessed October 30, 2018). Given natural compositional variations, this classification means that an individual thin section may hold two or more different tourmaline species (e.g., Henry et al. 177 2011; Grew et al. 2015), even if all tourmaline grains were formed in the same petrogenetic event. 178 Indeed, individual grains that grow during a single magmatic or metamorphic event can display 179 180 major element zoning that modulates among more than one tourmaline species. (Note that it is also 181 possible for an individual mineral grain to represent two natural kinds—a core of igneous tourmaline or zircon, for example, with a hydrothermally deposited rim.) A division of tourmaline 182 into natural kinds might thus provide a more parsimonious description of the supergroup and 183 184 would facilitate a more accurate understanding of boron mineral diversity, distribution, and evolution (Grew et al. 2017). 185

The black mica known as "biotite," which is distinguished in hand specimen and thin section based on optical properties and morphology, has now been subdivided into several mica group mineral species, including annite, fluorannite, siderophyllite, and tetraferriphlogopite (Rieder et al. 1998). Similar splitting of natural kinds into many species occurs in the complex amphibole group with more than 100 approved species (Hawthorne et al. 2012; rruff.info/ima), the garnet group (Grew et al. 2013), oxide and sulfide spinels (Biagioni and Pasero 2014), and other rockforming mineral groups.

Binary solid solutions, including ferromagnesian olivine, orthopyroxene, and many other examples, underscore the potentially artificial nature of classification based only on major element composition and crystal structure. Any rock that incorporates olivine grains with close to a 50:50 ratio of Mg:Fe will likely technically contain two species, both forsterite (Mg<sub>2</sub>SiO<sub>4</sub>) and fayalite (Fe<sub>2</sub>SiO<sub>4</sub>), even though all olivine grains arose from a single petrogenetic event.

Current conventions for recognizing rare earth element (REE) mineral species provide 198 199 additional potential cases of splitting natural kinds. Under the current system, parisite-(Ce) and 200 parasite-(La) are distinct species, based on differences in the most abundant REE, even though both species contain the full suite of REE in solid solution and are represented by the general 201 formula Ca(REE)<sub>2</sub>(CO<sub>3</sub>)<sub>3</sub>F<sub>2</sub> (Table 2). Similar arguments could be made for some of the 202 203 multiplicity of species of almost 40 other REE mineral structures (including Ce-, La-, Nd-, and 204 Sm-dominant variants of florencite, a REE aluminum phosphate; Table 2). In some cases, these 205 split species represent a single natural kind with one stability field that incorporates yttrium and a 206 range of light and heavy REE and thus one paragenetic mode.

In each of the above examples, the end-member compositions of diverse mineral structural groups are useful idealized thermodynamic constructs; the present IMA-approved mineral species

should be retained as the primary systematic means to identify minerals. However, in studies of mineral evolution and mineral ecology, which are based on the diversity and distribution of minerals through time and space, this splitting of natural mineral kinds into multiple species obscures relationships that determine mineral co-occurrence in varied paragenetic environments. As in the case of splitting a single mineral species into two or more natural kinds, the lumping of several species into a single natural kind affects any estimates of total mineral diversity and distribution.

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*Natural kinds of non-crystalline planetary materials.* The definition of a mineral as a naturally 217 occurring crystalline material is deeply ingrained, yet it arbitrarily excludes significant volumes of 218 219 condensed planetary materials from formal mineralogical consideration. Volcanic glass, solidified silica gel, shungite, amber, composite materials such as coal and mixed-layer clays, and natural 220 nanomaterials such as carbon nanotubes and buckeyballs are among the many potentially 221 222 important condensed solid phases that may play key roles in our understanding of planetary 223 evolution, yet which lie outside the purview of modern mineralogy (Rogers 1917; Povarennykh 224 1996; Povarennykh et al. 2018).

This mineralogical requirement of crystallinity may lead to biases when attempting to understand deposits rich in amorphous and nanoscale materials. For example, recent data from NASA's Mars Science Laboratory reveals that some martian soils contain greater than 50 weight percent amorphous material (e.g., Morrison et al. 2018). By expanding the classification of mineral kinds to consider a broader range of characteristic physical and chemical properties—i.e., beyond materials with a strictly periodic atomic structure—the potential exists to enrich mineralogy while better representing the actual materials that make up planets.

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### IMPLEMENTING AN EVOLUTIONARY SYSTEM OF MINERALOGY

Three significant challenges must be overcome to transform the concept of an evolutionary system of mineralogy into practical protocols for mineral classification: (1) creating extensive, reliable, and open-access mineral data resources; (2) applying diverse methods of cluster analysis to differentiate mineral natural kinds; and (3) developing a coherent and consistent nomenclature for mineral natural kinds.

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240 1. Creating data resources: Quantitative identification of mineral natural kinds (e.g., the 241 several kinds of diamond in Table 1) will emerge from analysis of extensive, reliable, and openaccess data resources that are not yet generally available for most mineral species and groups. 242 243 Consequently, the mineralogical community needs to create accurate and comprehensive 244 tabulations of varied mineral attributes. The defining attributes will vary for different mineral 245 species and groups, but will always include trace and minor elements. Additional parameters of 246 interest might include isotopes of major, minor, and trace elements; crystal size, morphology, twinning, and defects; optical, electrical, magnetic, and elastic properties; the mineral's biological 247 248 context, including local microbiota, fauna, and flora; age of formation; associated minerals, 249 petrological context, and tectonic setting; and climate zone, local aqueous chemistry, and other 250 environmental parameters. Each of these variables adds information that collectively have the 251 potential to differentiate natural kinds through multi-dimensional analysis, and which might 252 elucidate the origins and subsequent history of a mineral specimen in the context of planetary evolution. 253

Building robust data resources is thus the next step in implementing this proposed evolutionary system of mineralogy, both through "brute-force" compilations (i.e., transcription of literature data by hand), and through emerging machine learning methods that can rapidly scan pre-existing literature (e.g., <u>https://geodeepdive.org;</u> accessed 31 October 2018). A major ongoing challenge to the international mineralogy and petrology community is to promote a culture of data sharing, including the retrieval of "dark data" and the implementation of FAIR data policies by publications and societies (Downs 2006; Lehnert et al. 2007; Hazen 2014; Wilkinson et al. 2016).

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262 *2. Applying natural kind cluster analysis*: "Cluster analysis" is a constellation of analytical 263 methods that group objects into subsets (clusters) whose members are more alike than objects 264 outside the cluster (e.g., Bailey 1994; Everitt 2011). Expanded mineral data resources on numerous 265 specimens with many attributes are well suited for varied analytical approaches under the cluster 266 analysis umbrella. Though there exists no single definition of a "cluster," two groups of minerals 267 could be represented as distinct "kinds" if cluster analysis of any combination of attributes results 268 in two non-overlapping groups in *n*-dimensional space.

In this endeavor mineralogists can learn important lessons from other scientific disciplines that have embraced classifications system based on natural kind clusters (Boyd 1991, 1999; Millikan 1999). Paleontologists and biologists have long employed the data-driven, cluster approach of morphometric analysis, for example to distinguish superficially similar species from ontonogenic sequences (Lohmann 1983; Bookstein 1991; Ashraf 2004; Turvey et al. 2018). In this formalism, the key to recognizing distinct natural kinds is the collection and analysis of numerous individual specimens to obtain statistically meaningful distributions of traits related to size and shape.

A revealing recent example is the application of cluster analysis to discern four major human 276 personality types (Gerlach et al. 2018), based on analysis of more than 1.5 million individual 277 results from the Five-Factor model of human personality traits (e.g., Widiger 2015). Their study 278 reveals both the promise and potential pitfalls of cluster analysis. They initially employed an 279 unsupervised Gaussian mixture model, which led to an unreasonably large number of discrete 280 281 clusters—a difficulty that can arise in cluster analysis if groups differ significantly in size 282 (Burnham and Anderson 2002; Lancichinetti et al. 2015). Gerlach et al. employed varied statistical tests to reveal that four major clusters provide an optimal fit to this large dataset. The authors thus 283 284 emphasize "limitiations of unsupervised machine learning methods to the analysis of big data."

A similar strategy can be applied to implementation of an evolutionary system of mineralogy, which must be predicated on the analysis and comparison of numerous specimens from different mineral-forming environments. As with classifications in other domains, the recognition of mineral natural kinds will ultimately depend on the analytical comparison of large numbers of individual mineral descriptions, with richly varied information, data analysis, and visualization.

290 A significant challenge lies in determining what constitutes a mineral cluster. Ambiguity arises 291 because no one algorithm or set of criteria can be universally applied to discern optimal clustering 292 (Jain 2010). Experts in specific mineral species or groups must therefore supervise the application 293 of cluster analysis, for example by selecting the most important attributes and constraining the 294 total number of clusters. Each natural kind should be defined by continuous ranges of multiple 295 attributes that arise from a well-defined paragenetic process-ideally a combination of 296 characteristics that do not overlap with those of any other mineral kind. For example, vapordeposited nanodiamonds from the expanding and cooling gaseous envelopes of energetic stars 297

298 possess physical and chemical characteristics that are inherently different from those of high-299 pressure/temperature diamonds formed in Earth's mantle, and thus will form a separate cluster.

300 Identifications of natural kinds, including both the lumping and the splitting of existing IMA 301 species, is context dependent and must be considered on a case-by-case basis. Depending on one's focus, the resulting number of clusters may differ significantly. For example, one researcher 302 studying hydroxylapatite from the broad-brush perspective of billions of years of Earth history 303 304 might choose to divide all specimens into three clusters: meteoritic, crustal, and biomineralized. 305 By contrast, a biologist examining hydroxylapatite from a different evolutionary viewpoint might 306 recognize multiple types of biomineralization with different kinds of bio-apatite in brachiopods, fish scales, cartilage, teeth, and bones (Roy 1974; Onozato 1979; Ohirta 1986; Sherman 2008). 307

The flexible, context-dependent nature of cluster analysis renders this approach ill-suited to be the primary classification system for minerals. Nevertheless, recognition of distinct mineral kinds is essential if we are to understand how the mineralogy of planets evolves through a succession of physical, chemical, and biological processes.

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313 *3. Developing a nomenclature for mineral natural kinds*: Unambiguous, standardized 314 mineralogical nomenclature is essential. In spite of attempts to introduce systematic and rational 315 approaches to mineralogical nomenclature (e.g., Nickel and Grice 1998), relatively few of the more 316 than 5300 approved mineral names provide useful clues regarding chemical or physical attributes 317 of species, much less their varied modes of occurrence. The community of Earth scientists would 318 be ill-served by any system that adds layers of taxonomic obscurity on the existing scheme.

A logical solution in the case of an evolutionary system is to employ descriptive paragenetic modifiers to the existing IMA mineral names. In the case of diamond, for example, names for

several natural kinds already exist. "Presolar diamond" and "impact diamond" are self-321 explanatory, whereas "type I," "type II," and "carbonado" are well established varietal names for 322 323 diamond. In each case the name "diamond" is retained, but with a familiar modifier. In the context 324 of planetary evolution, recognizing and naming mineral natural kinds in this manner will enhance our ability to communicate stages of mineral evolution with clarity. 325 326 Finally, it is important to recognize that in the majority of instances, especially rare minerals with only one known mode of formation (Hazen and Ausubel 2016), natural mineral kinds will be 327 328 exactly equivalent to IMA mineral species. Therefore, in most instances mineralogical nomenclature will require no modification. 329 330 331 **IMPLICATIONS** An underlying assumption of this proposal is that complementary classification schemes of 332 natural objects have the potential to reflect different aspects, and thus varied theories, of the natural 333

world. The present IMA scheme focuses on idealized end-member compositions and structures of 334 335 minerals, and thus is rooted in the principles of thermodynamics independent of a mineral's geological context. The proposed evolutionary system of mineralogy, based on the complex range 336 of attributes stemming from the paragenetic modes of minerals, represents a complementary 337 338 classification that is particularly suited to revealing a deeper understanding of planetary 339 evolutionary processes. Different natural mineral kinds arise at different evolutionary stages. As 340 we attempt to compare and contrast different terrestrial worlds, for example Earth and Mars, it is insufficient to know the identities of idealized end-member mineral species. We must also 341 342 understand the natural kinds of minerals, with their attendant implications for the dynamic histories of planets and moons. This evolutionary system of mineralogy incorporates fundamental aspects 343

of a mineral's chemical composition and atomic structure, but also recognizes that every natural condensed solid arises at a time, and in an environmental context, that are essential to defining its natural kind.

347 There is an appealing elegance in the existing system of classifying natural crystals as objects 348 whose essence is captured in purely chemical and structural terms—whose idealized character is 349 divorced from the sometime messy context of the natural world. Nevertheless, many ways exist to 350 ascribe order to the universe and its objects; multiple classification schemes may serve parallel 351 roles in science. When we consider the rich evolutionary history of our planetary home, as well as 352 the growing inventory of thousands of other distant rocky planets and moons, each with its own unique evolutionary history, a complementary system of mineralogy beckons-one that 353 354 acknowledges the information-rich complexity of natural minerals and the remarkable stories they tell of the changing physical, chemical, and biological environments that produced them. 355

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Table 1. Selected natural kinds of diamond: The mineral species "diamond," which is defined as pure carbon in the cubic diamond structure, encompasses several natural kinds based on their different paragenetic modes. These differing modes of formation result in distinctive morphologies, trace element and isotopic compositions, and physical properties. Data from Davies (1984), Vishnevsky and Raitala (2000), Heaney et al. (2005), Garai et al. (2006), Ott (2009), Shirey et al. (2013), and Greaves et al. (2018).

587	Diamond kind	Size/morphology	Distinctive properties	Paragenetic Mode	Maximum Age (Ga)
588	Stellar vapor deposition	<5 nm/nanocrystalline	Anomalous microwave emission	Low-P, condensation	> 13
589	"Type I"	to 2 cm/euhedral	Absorbs 8 $\mu m$ IR and 300 nm UV	High-P, aqueous fluid	> 3
590	"Type II"	to 10 cm/euhedral	IR/UV transparent	High-P, Fe-Ni melt	> 3
591	Carbonado	to >10 cm/polycrystalline	Black, porous, superhard	Unknown	Unknown
592	Impact diamond	<1 mm/euhedral/also in	Birefringent; hardness = 3	Shock transformation	> 4.5
593		polycrystalline aggregates			
594					
595					

597

Table 2. Rare earth element (REE) compositions (in atom percent) of IMA mineral species of florencite and parisite.

- 599 The assignment of different mineral species to specimens that differ in the most abundant REE may lead to splitting
- 600 of natural kinds.

602	IMA mineral species	Ideal formula	Ce	La	Nd	Sm	Y	Reference
603	Florencite-(Ce)	CeAl <sub>3</sub> (PO <sub>4</sub> ) <sub>2</sub> (OH) <sub>6</sub>	0.56	0.28	0.12	0.04	-	Pouliot & Hofmann (1981)
604	Florencite-(La)	LaAl <sub>3</sub> (PO <sub>4</sub> ) <sub>2</sub> (OH) <sub>6</sub>	0.34	0.61	0.02	-	-	Lefebvre & Gasparrini (1980)
605	Florencite-(Nd)	NdAl <sub>3</sub> (PO <sub>4</sub> ) <sub>2</sub> (OH) <sub>6</sub>	0.05	0.19	0.28	0.10	0.15	Milton, D.J. and Bastron, H. (197
606	Florencite-(Sm)	SmAl <sub>3</sub> (PO <sub>4</sub> ) <sub>2</sub> (OH) <sub>6</sub>	0.10	0.02	0.32	0.38	-	Repina et al. (2010)
607								
608	Parisite-(Ce)	$CaCe_2(CO_3)_3F_2$	1.03	0.49	0.42	-	0.06	Ni et al. (2000)
609	Parisite-(La)	$CaLa_2(CO_3)_3F_2$	0.37	0.83	0.51	0.04	0.03	Menezes Filho et al. (2018)
610								