

Extraterrestrial material from a comet and from meteorites - analyzed by TOF-SIMS and data evaluated by machine learning approaches

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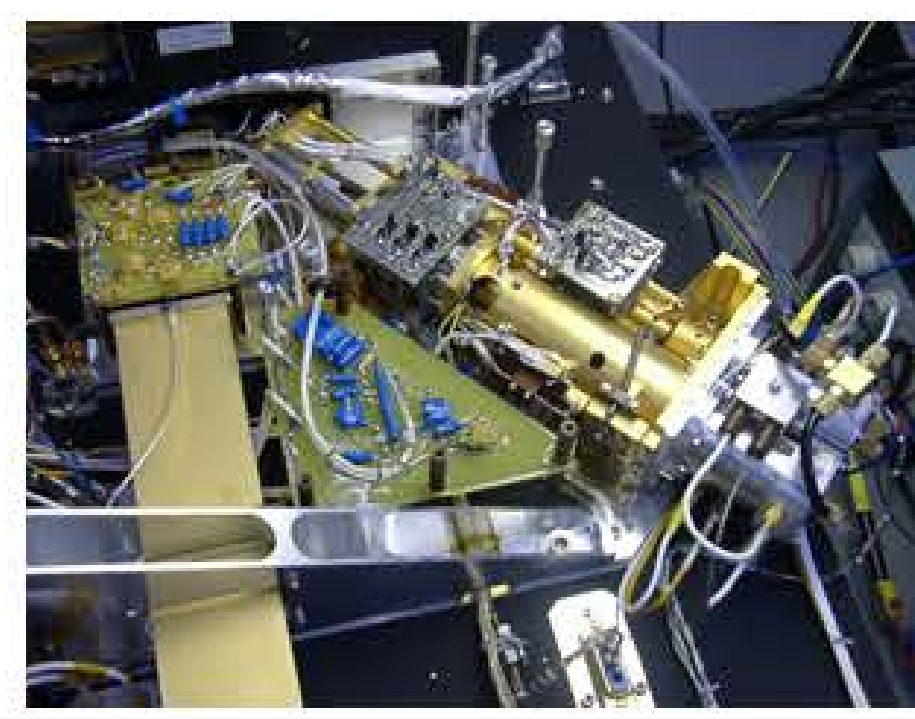
Comet. *Churyumov-Gerasimenko* code 67P; size 4 x 3.5 x 3.5 km; density 0.533 g/cm³; distance from sun 1.24 – 5.68 AU (1 AU = astronomical unit ~150 000 000 km); orbital period 6.44 yr.



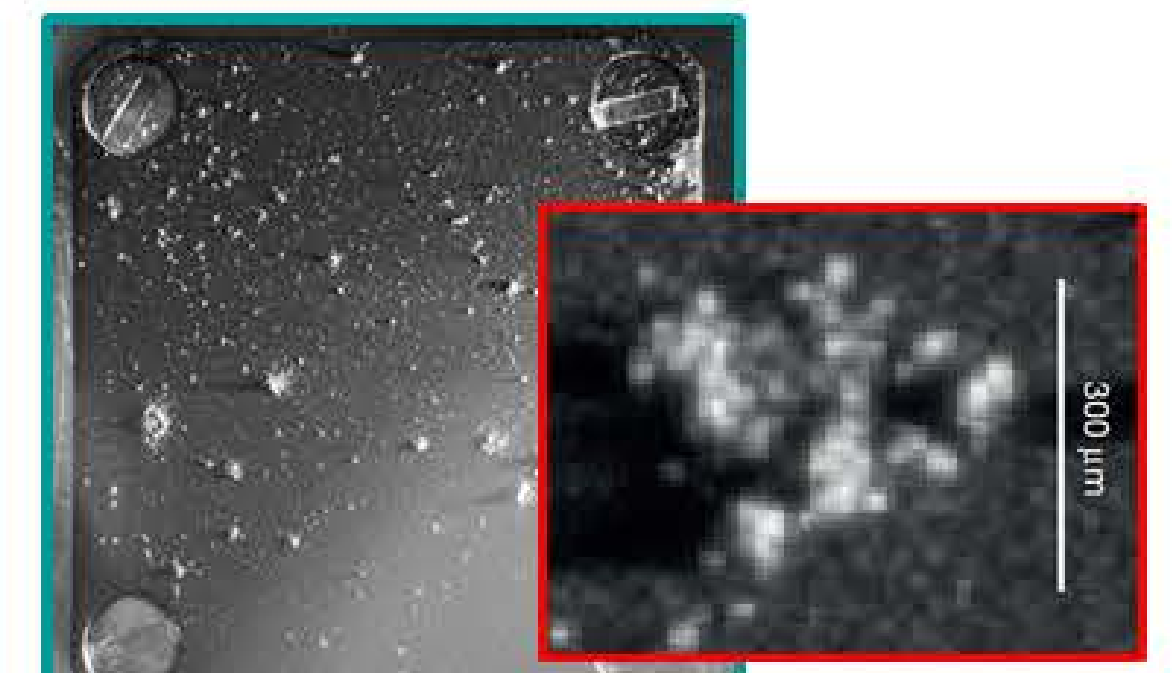
Rosetta. Space mission by ESA (European Space Agency); launch 2 Mar 2004; near comet 6 Aug 2014; turned off 30 Sep 2016.



COSIMA. Instrument onboard of Rosetta; collection of dust particles, imaging and analyzing by TOF-SIMS (time-of-flight secondary ion mass spectrometry) [1, 2].



TOF-SIMS. Prim. ions In⁺, 8 keV; spot ~ 40 μm; inorganic/organic ions separated up to m/z ~100.



Gold target 1 x 1 cm with cometary particles, 50 – 700 μm diameter.
~300 μm particle [3]

Meteorite samples

Carbon-rich meteorites (carbonaceous chondrites, CC) are sometimes considered to have a similar composition as comets. CC samples have been provided by the Natural History Museum Vienna [8].

Data evaluation

A typical data set in this work consists of matrices $X(n \times m)$ and $Y(n \times q)$ for n objects (spectra), m variables (features derived from TOF-SIMS data, ion abundances), and q sample classes. Methods applied from machine learning (multivariate statistics, chemometrics) are PCA, KNN classification, PLS discriminant classification, random forest classification, and others [8].

Composition of cometary dust collected near and far the sun

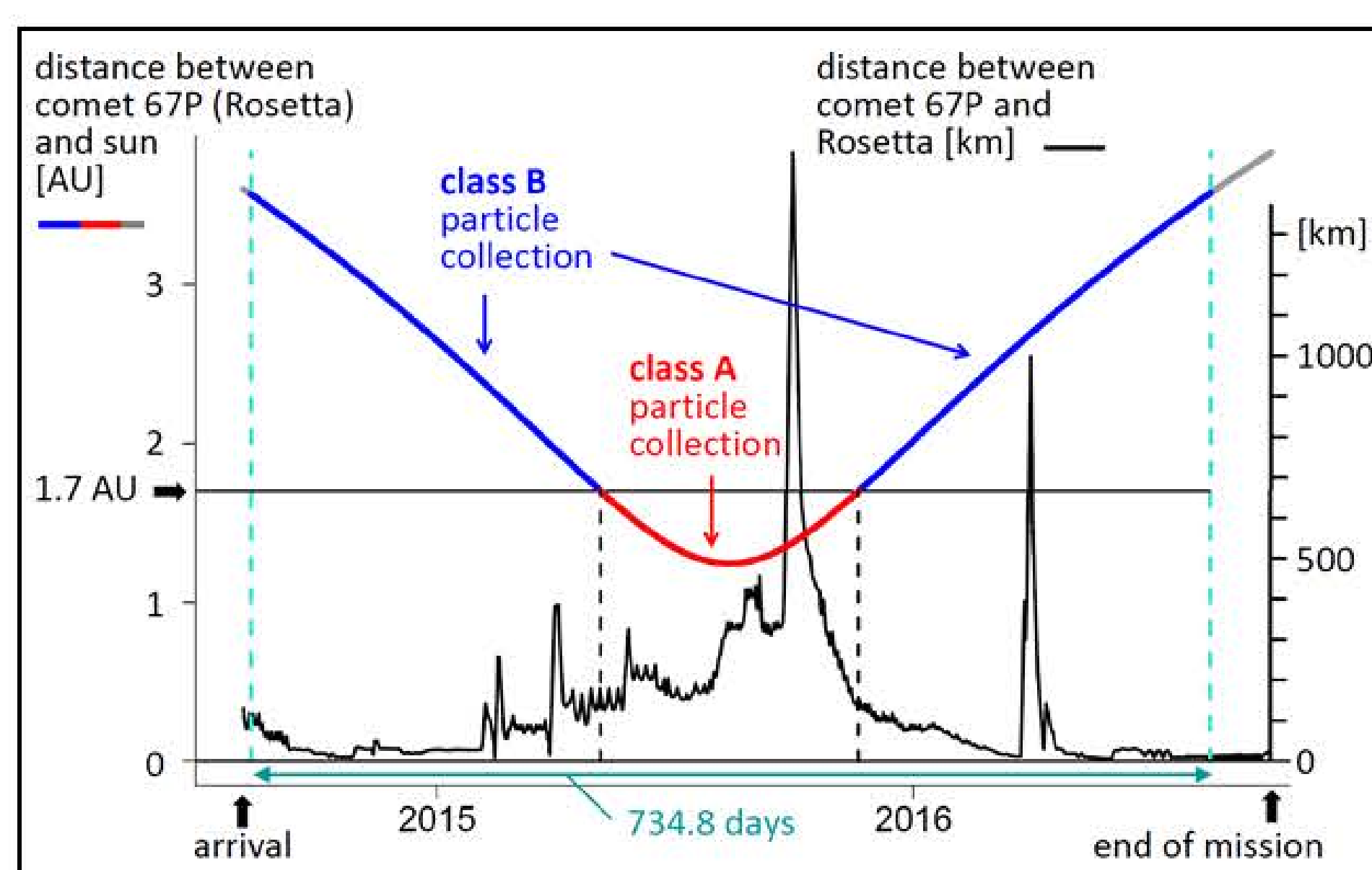
$n = 2863$ TOF-SIMS spectra measured at 256 particles

$n_1 = 1459$ in **class A**: collection at ≤ 1.7 AU (**near sun, warmer**)

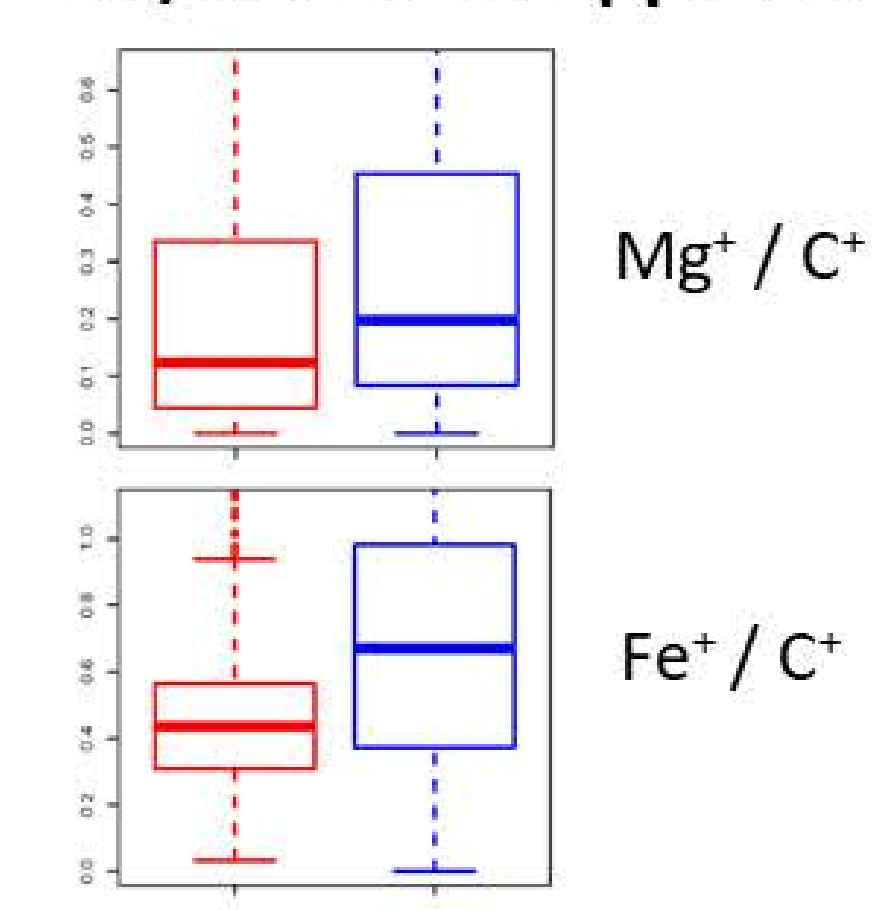
$n_2 = 1404$ in **class B**: collection at > 1.7 AU (**far from sun, cooler**)

$m = 9$ variables: ion counts for C⁺, CH⁺, CH₂⁺, CH₃⁺, Mg⁺, C₂H₃⁺, C₃H₃⁺, C₃H₄⁺, Fe⁺, [4],

normalized to sum 100 or transformed as compositional data by *centered log-ratios (clr)* [5].



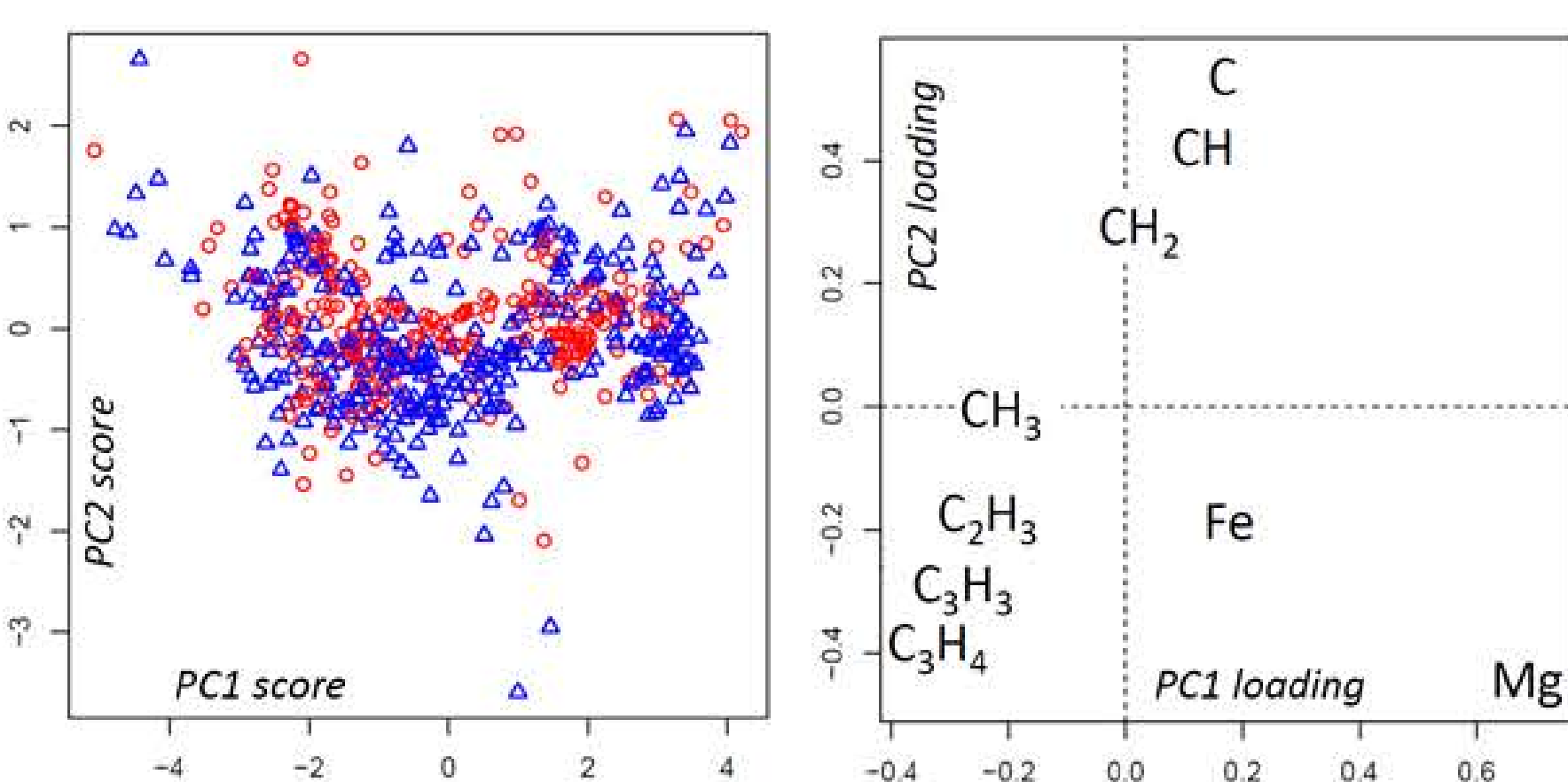
Uni/bi-variate approach



Tendency: enhanced C⁺ in particles from warmer area.

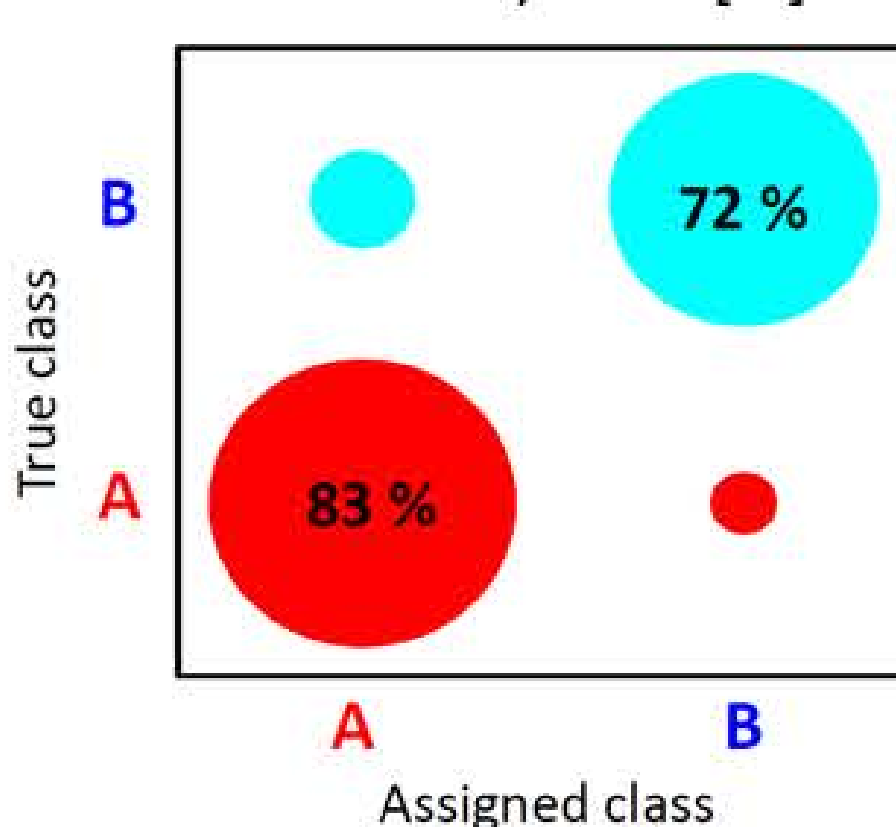
Multivariate approach

PCA. $n_1 = 300$; $n_2 = 300$ (randomly); clr transformed. Variances of PC1, 2: 82.3, 10.9 %



Clear separation of particles from warmer and cooler areas. Particles collected in the first part of the mission (*cool*) are from a dust coat that is removed near the sun. Near sun (*warm*) fresh material from the comet is measured with enhanced carbonaceous matter [1,5].

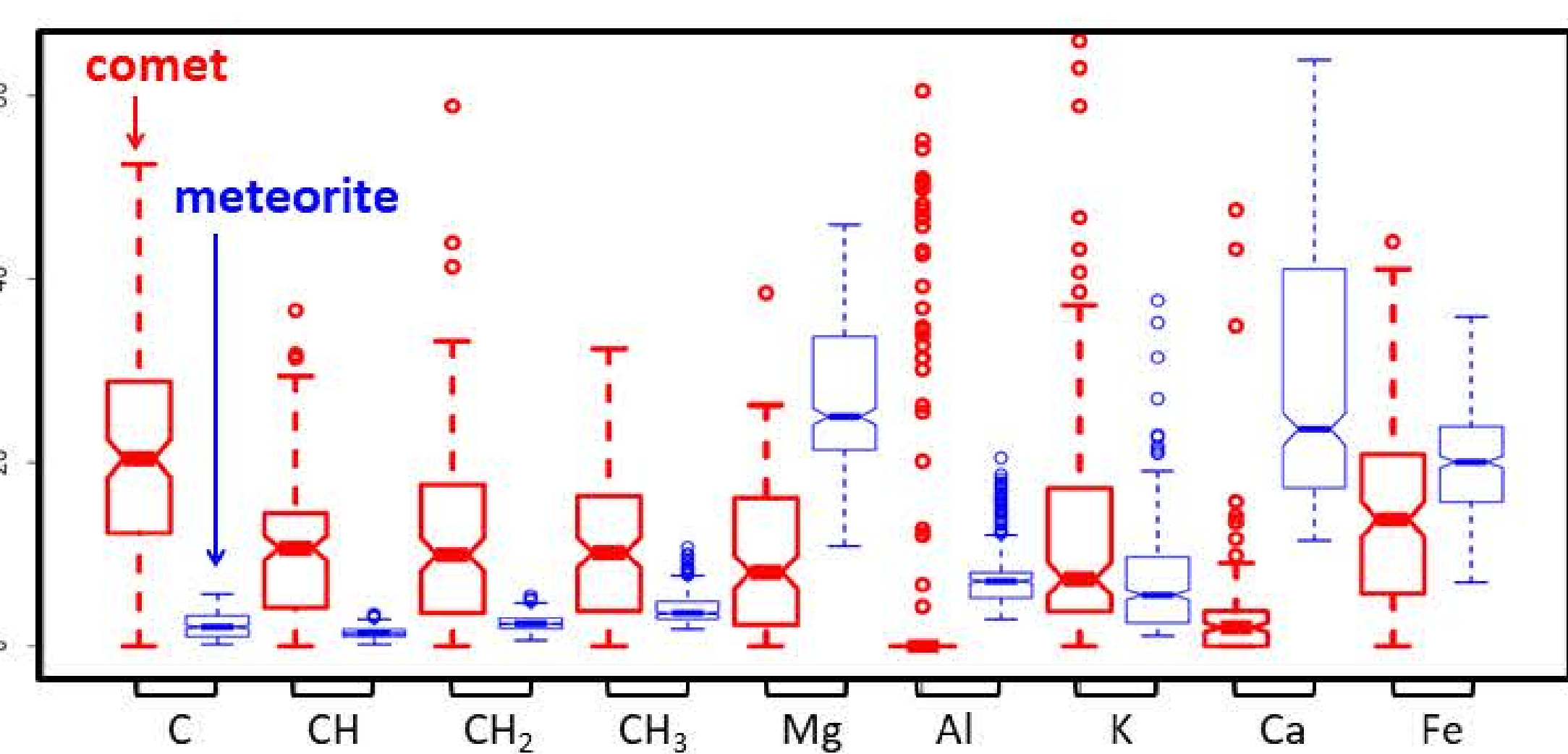
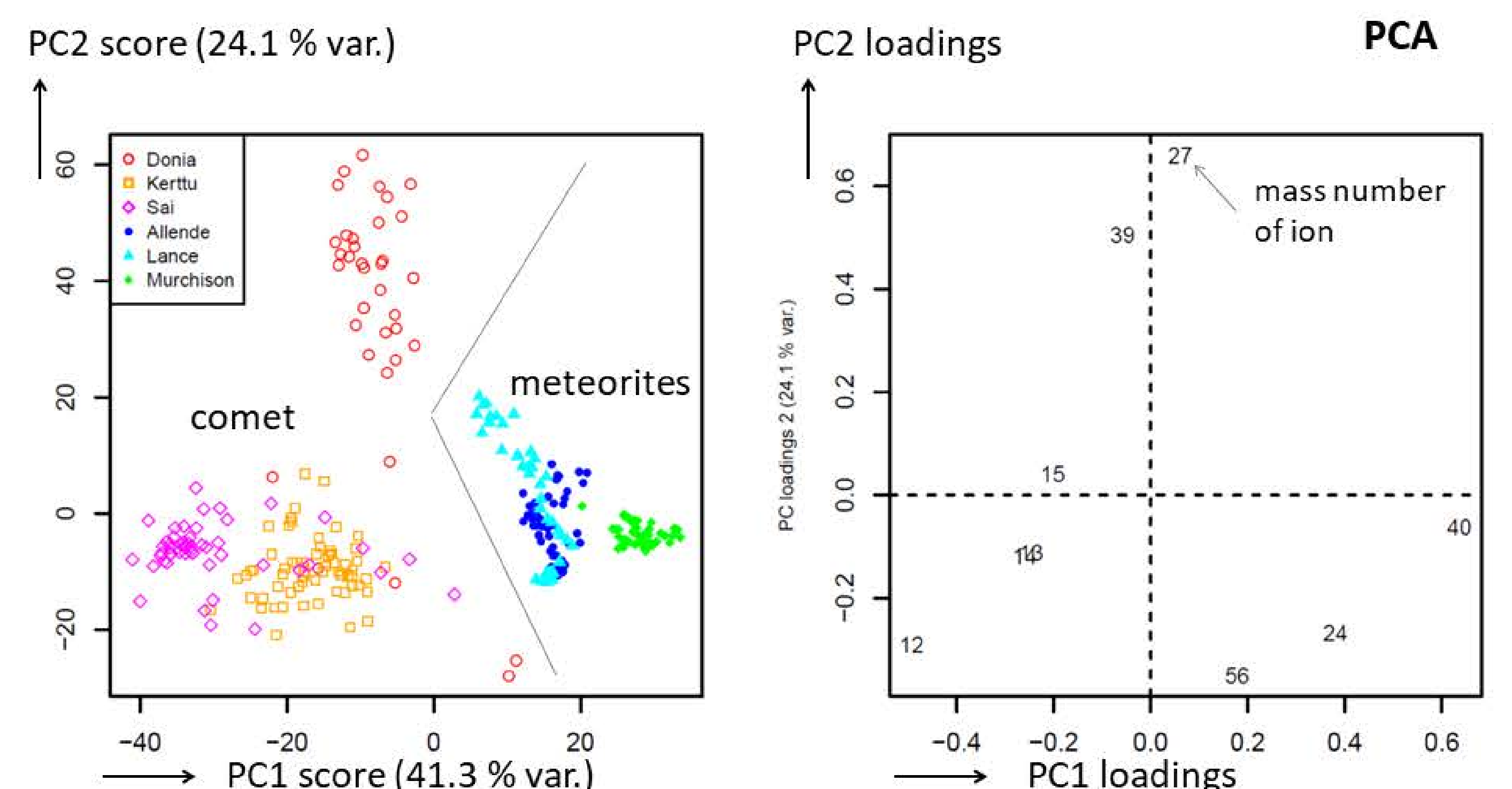
KNN. All data; optimum $k = 3$ estimated by repeated double cross validation, rdCV [7].



Cometary dust compared with carbon-rich meteorites

$n = 301$ spectra; 50 from each of the 3 meteorites Allende, Lancé and Murchison, and 151 from 3 cometary particles (Donia, Kerttu, Sai)

$m = 9$ variables: ion counts for C⁺, CH⁺, CH₂⁺, CH₃⁺, Mg⁺, Al⁺, K⁺, Ca⁺, Fe⁺, (organics and inorganics), normalized to sum 100.



Univariate distributions of ion abundances

sum 100
 $n = 591$

Carbon-containing ions are prominent in comet data [7,8].

Ca⁺ and Mg⁺ are more abundant in meteorites than in the comet particles. The comet composition data are more diverse than the meteorite data.

- [1] Schulz R. et al.: *Nature*, **518**, 216 (2015)
- [2] Kissel J. et al.: *Space Sci. Rev.*, **128**, 823 (2007)
- [3] Hilchenbach M. et al.: *The Astrophys. J. Lett.*, **816**: L32 (2016)
- [4] Varmuza K. et al.: *J. Chemometrics*, **2018**, e3001 (2018)
- [5] Filzmoser P. et al.: *Applied compositional data analysis*, Springer Nature (2018)
- [6] Varmuza K. et al.: *J. Chemometrics*, **2020**, e3218 (2020)
- [7] Stenzel O.J. et al.: *MNRAS*, **469**, Suppl_2, S492-S505 (2017)
- [8] Varmuza K.: project website www.lcm.tuwien.ac.at/comets/

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