



A pipeline for in-situ plankton imaging data: Improving our understanding of ocean particle distribution and carbon fluxes using morphological traits

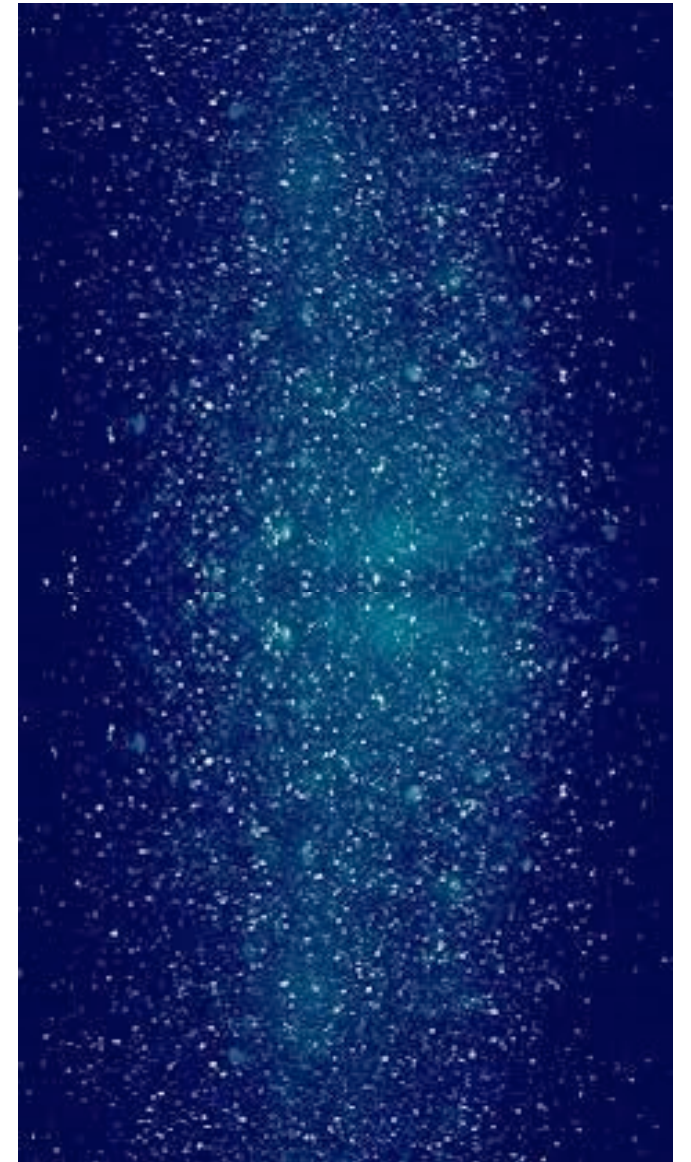
Miriam Beck, Sakina-Dorothee Ayata, Marc Picheral, Fabien Lombard,
Rainer Kiko, Lars Stemmann, Lionel Guidi, Jean-Olivier Irisson

Joint Meeting SFE² - GfÖ - EEF
21.-25.11.22 Metz, France



Marine snow

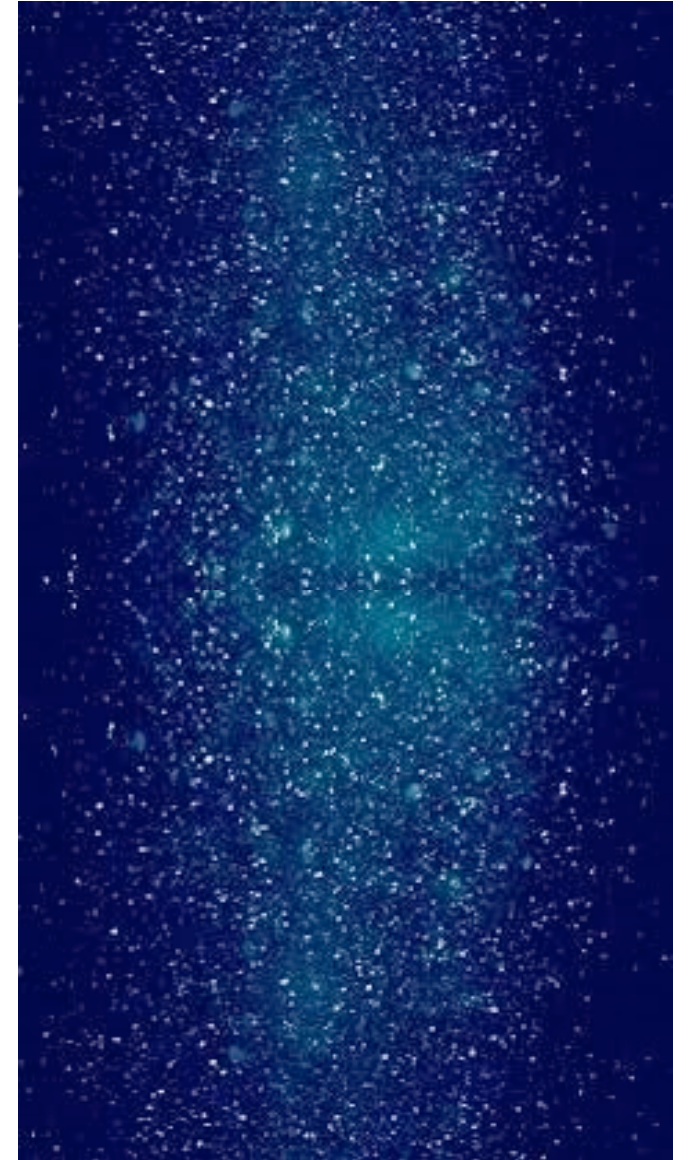
- Up to **XX** of organic biomass in the ocean//
Carbon export up to xx
- High diversity
- Carbon export to deep ocean largely driven
by gravity
—> size



Banerjee et al. 2014 (modified)

Marine snow

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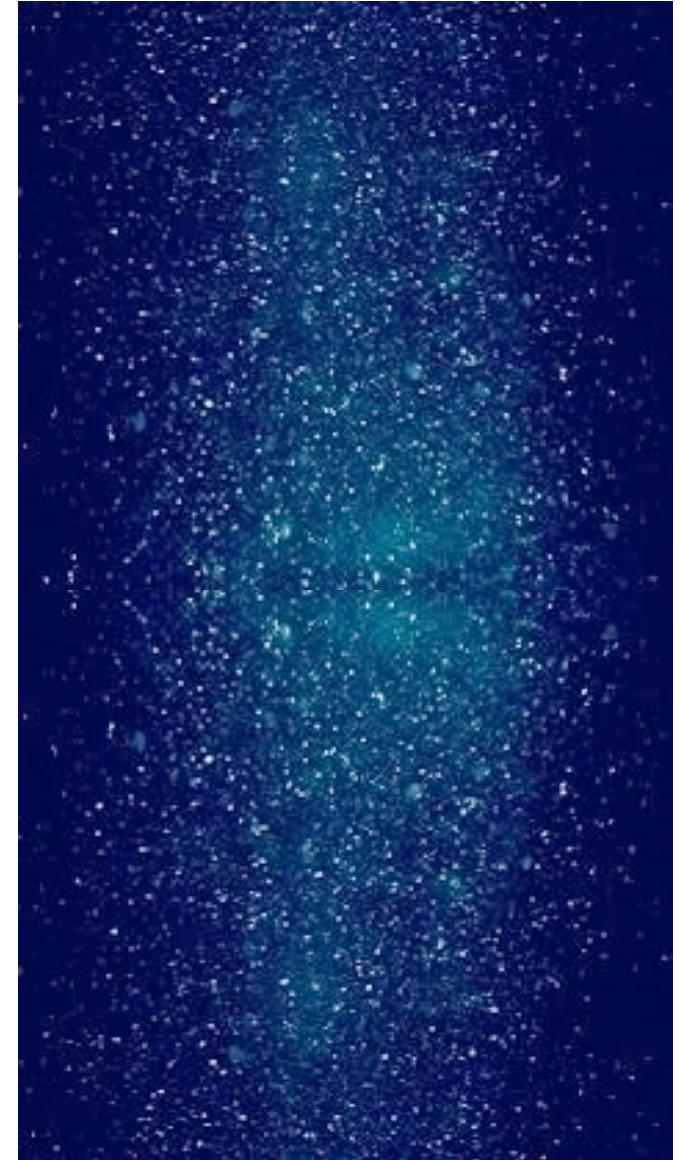
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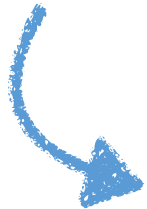
Morphological traits



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Morphological traits

Article | [Open Access](#) | [Published: 14 May 2021](#)

Marine snow morphology illuminates the evolution of phytoplankton blooms and determines their subsequent vertical export

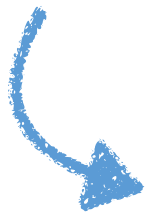
[Emilia Trudnowska](#) , [Léo Lacour](#), [Mathieu Ardyna](#), [Andreas Rogge](#), [Jean Olivier Irisson](#), [Anya M. Waite](#), [Marcel Babin](#) & [Lars Stemann](#)

[Nature Communications](#) 12, Article number: 2816 (2021) | [Cite this article](#)

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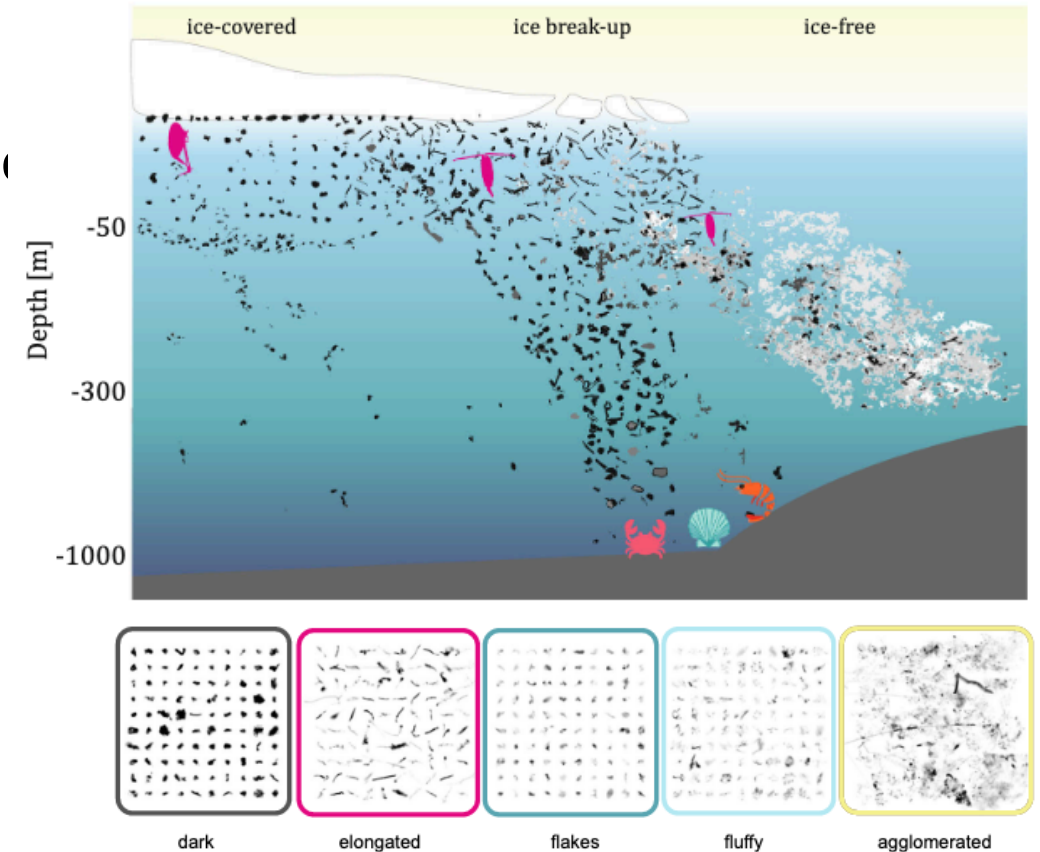
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Marine snow morphology illuminates the evolution of phytoplankton blooms and determines their subsequent vertical export

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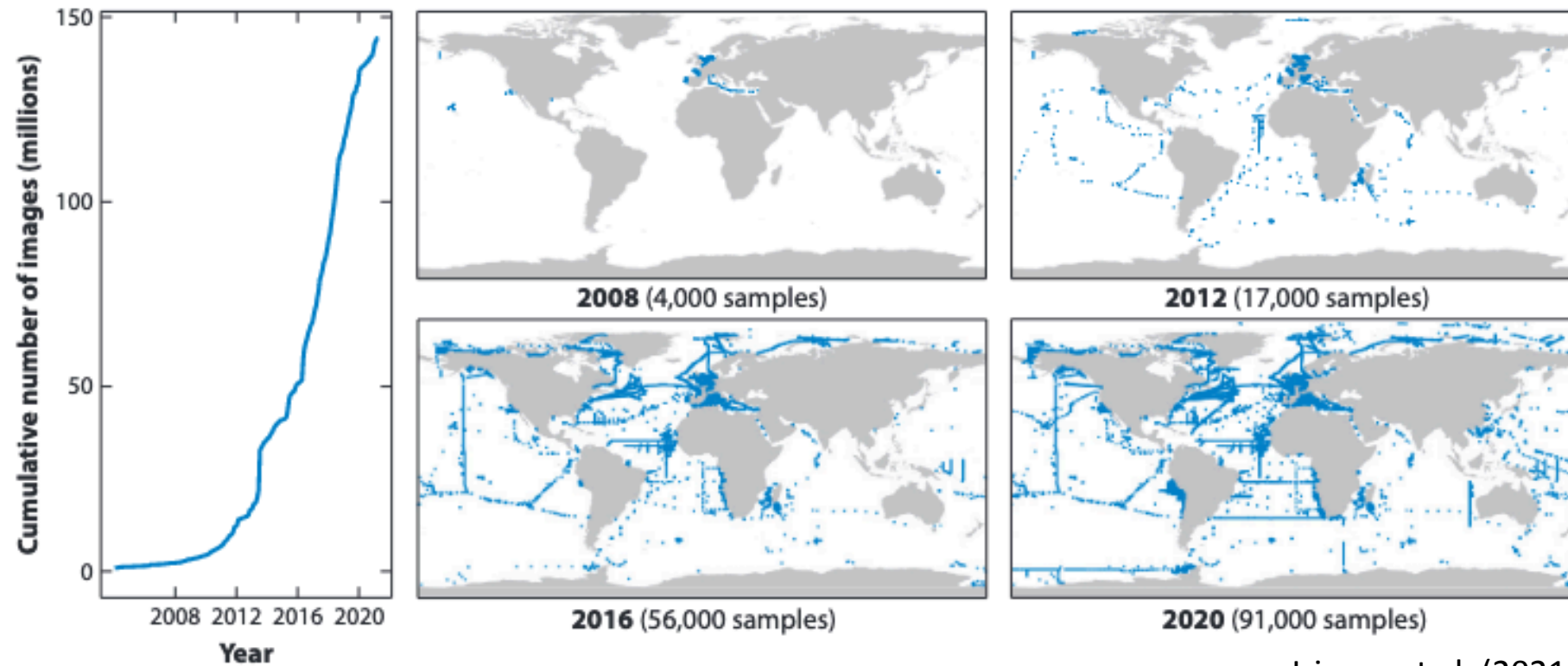


Morphological traits

Can be measured from image-data

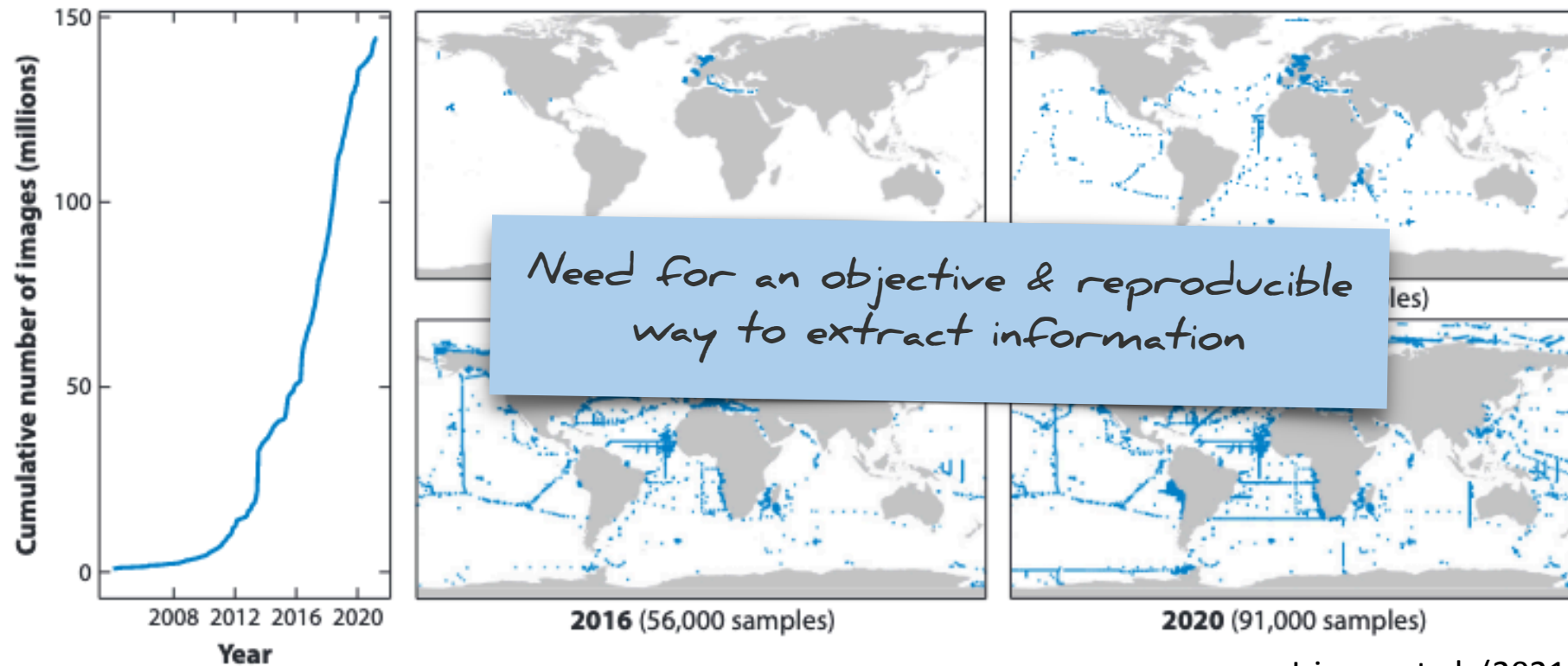
—> automated | objective | 'taxa' independent | big data

Marine (pelagic) imaging



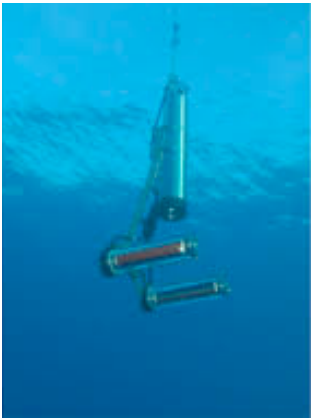
Irison et al. (2021)

Marine (pelagic) imaging



Irison et al. (2021)

Feature extraction



Imaging



Feature extraction

45 morphological features:

- > size
- > shape
- > grey level
- > symmetry

Feature extraction



Imaging



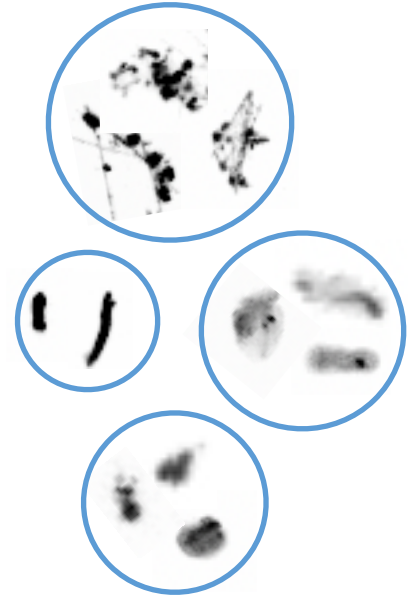
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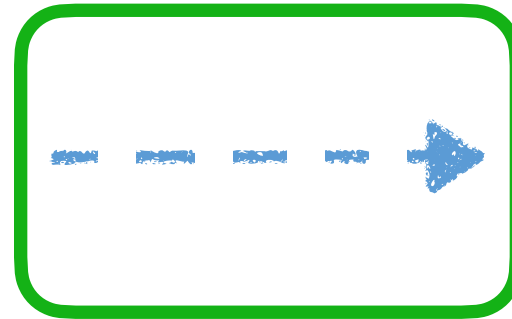
Groups of morphological similar particles



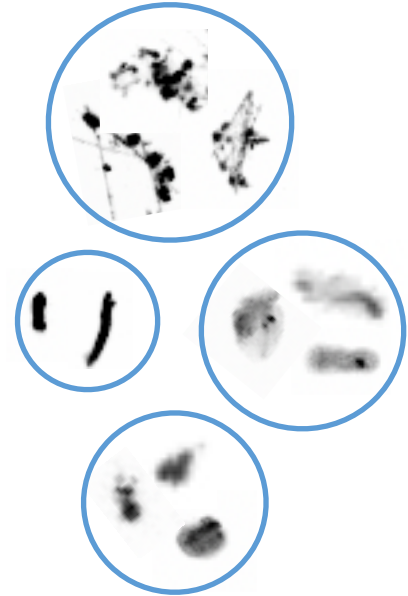
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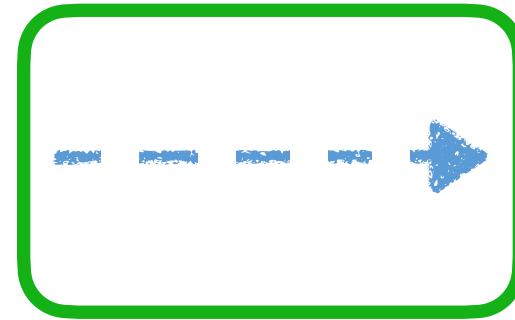


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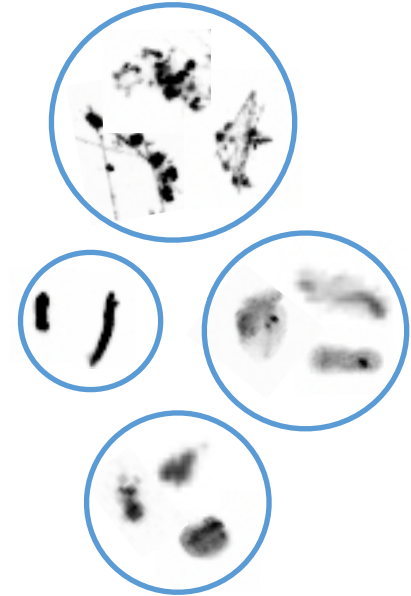
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Pipeline to define particle morphological groups using image-derived features

Groups of morphological similar particles



Feature extraction



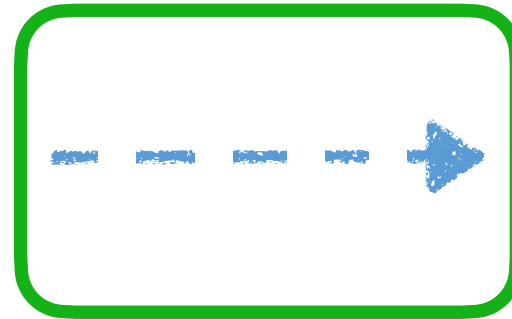
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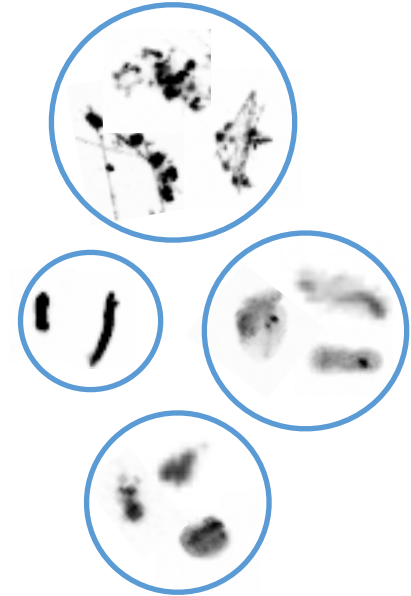
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Pipeline to define particle morphological groups using image-derived features

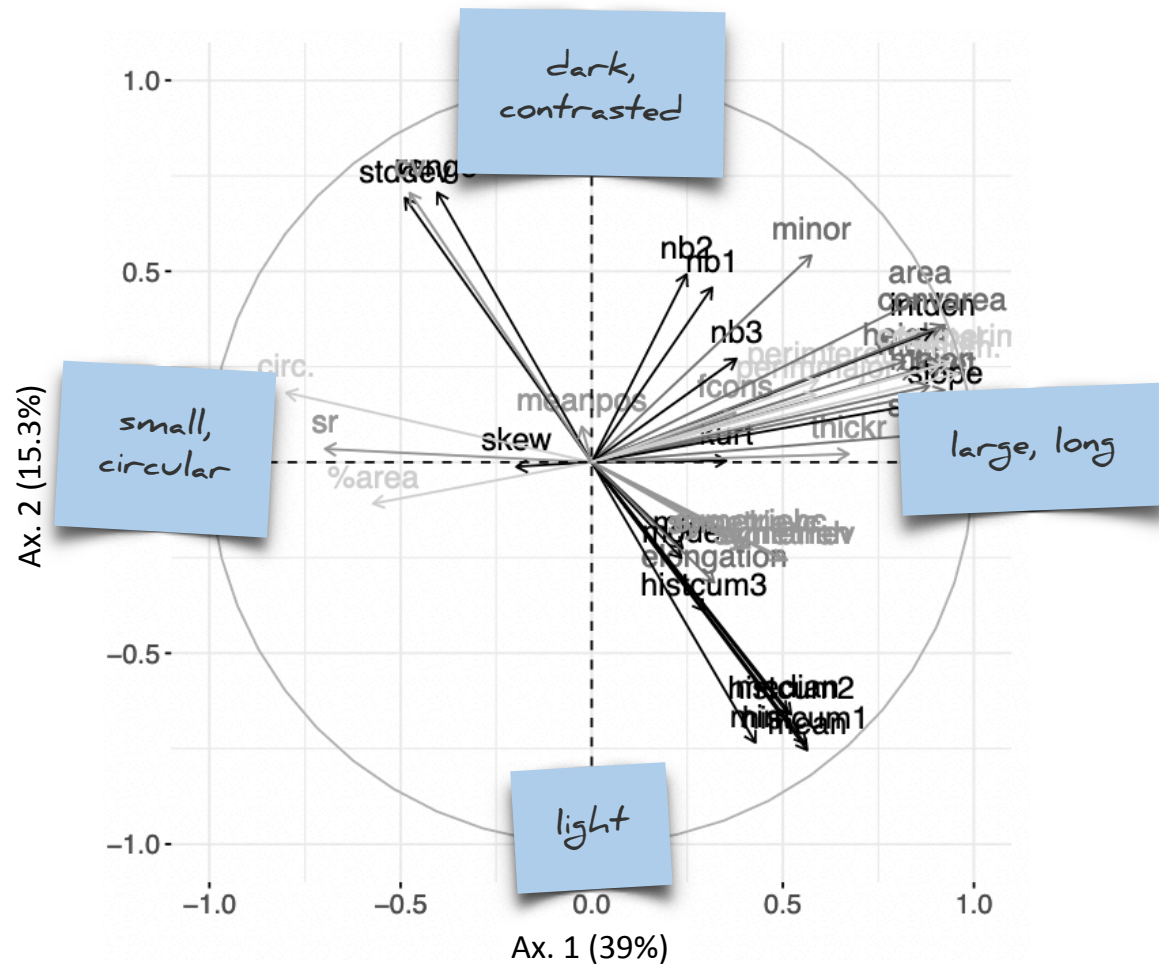
Subset of UVP data by LOV and Geomar
—> n=896,095 images

Groups of morphological similar particles



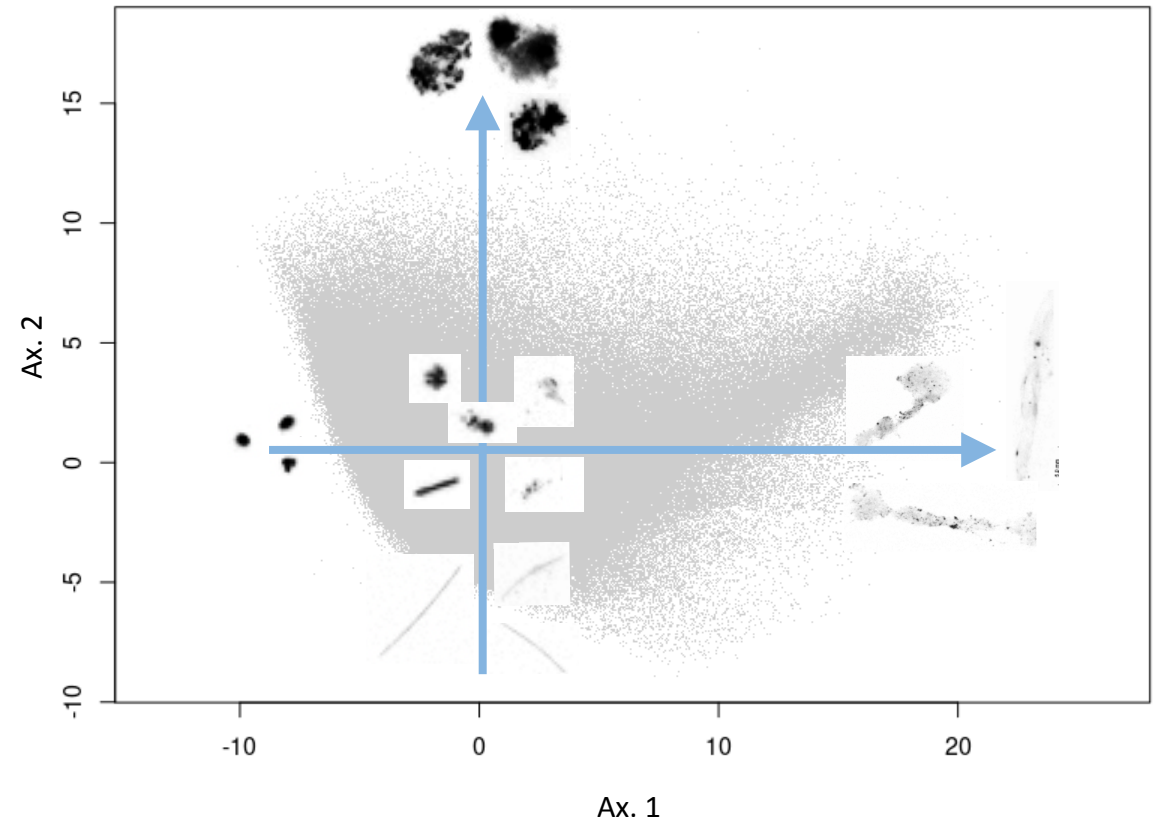
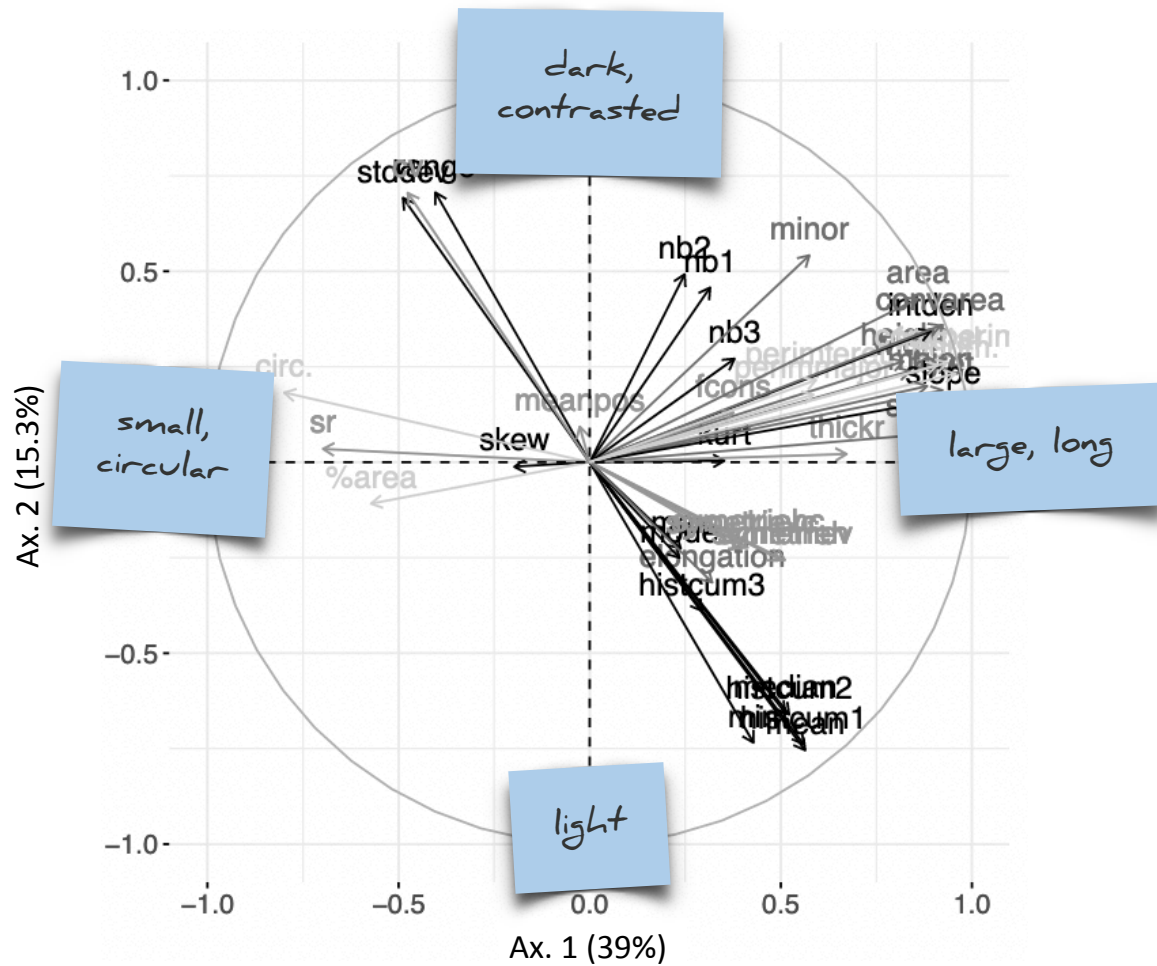
1) Dimension reduction

PCA including all 45 morphological features (1 dot = 1 imaged particle)



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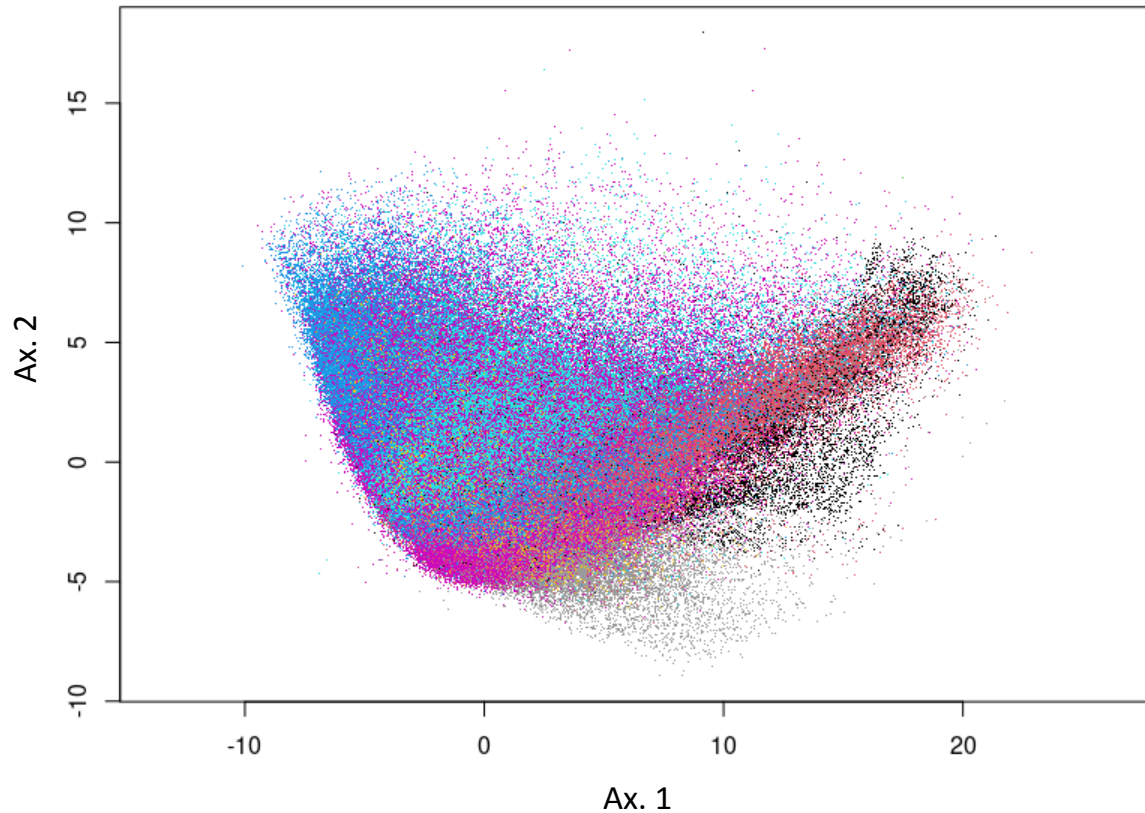
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1) Dimension reduction

I decide if I keep this slide/graph depending on the time when practicing (most likely not not)

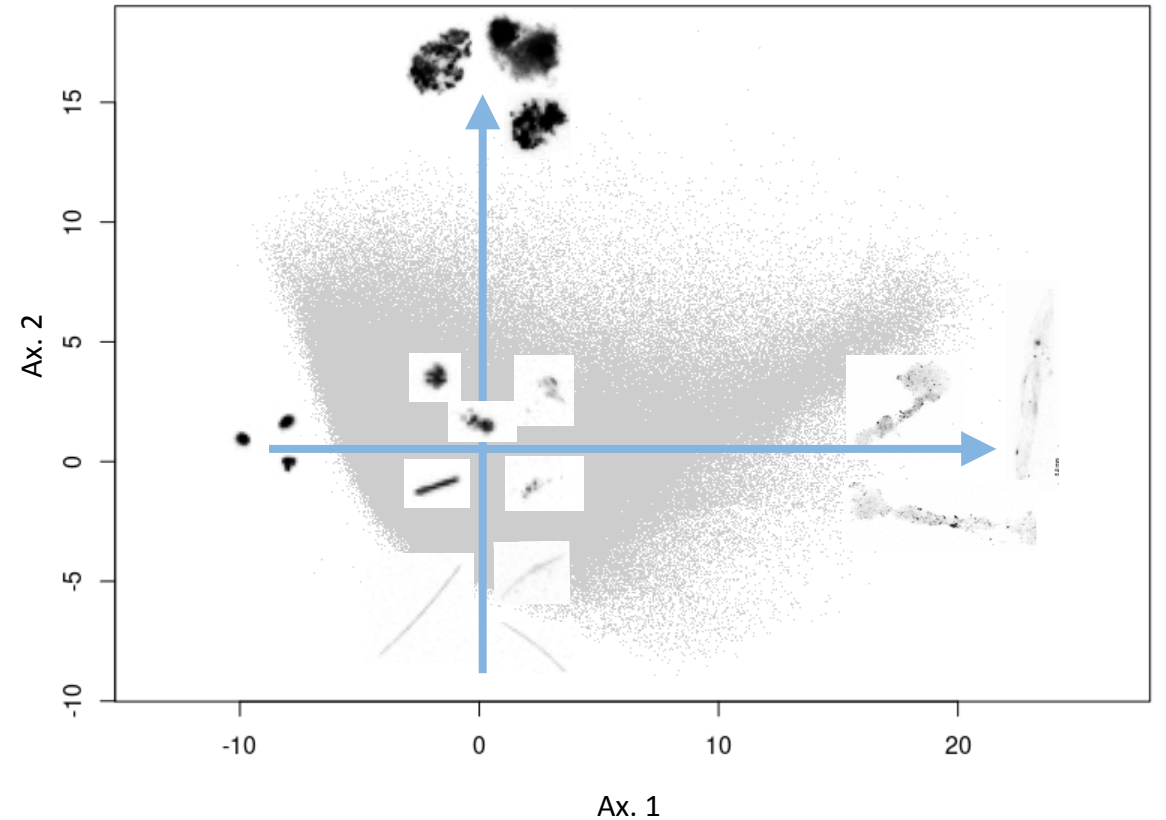
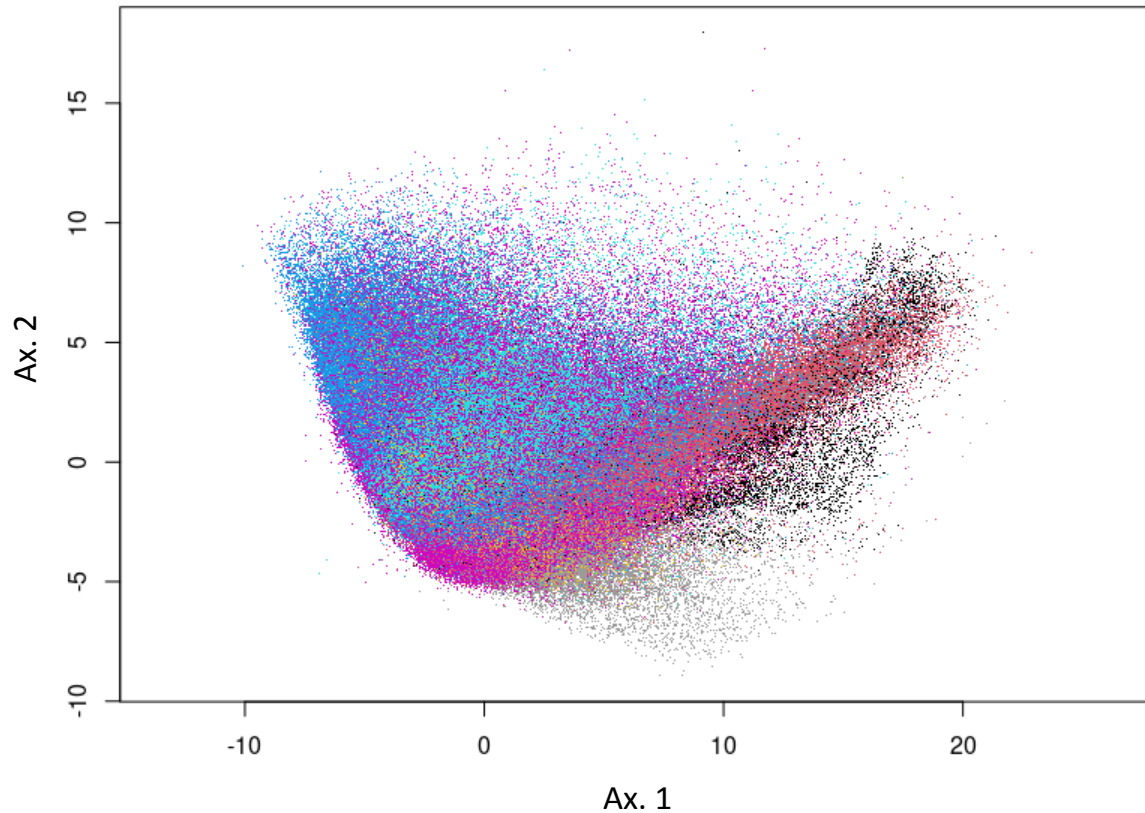
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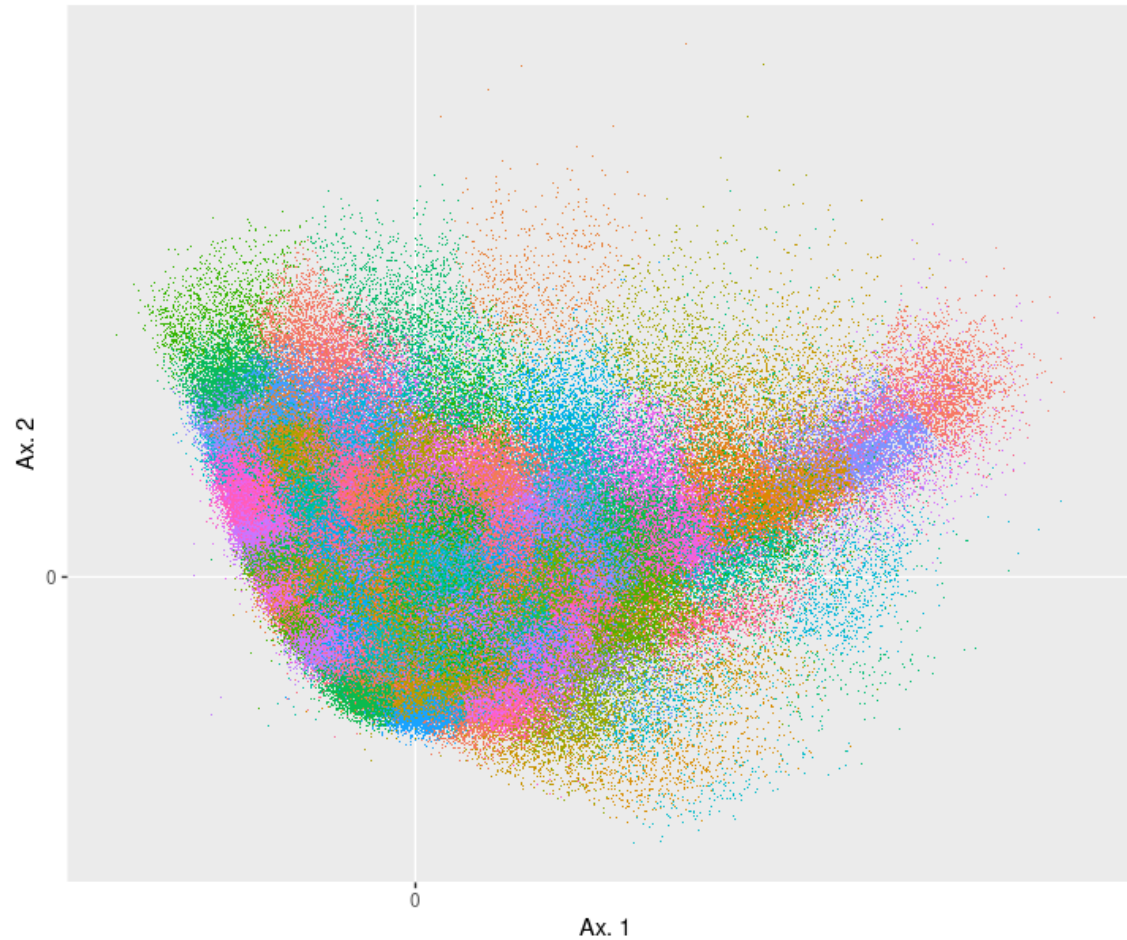
PCA including all 45 morphological features (1 dot = 1 imaged particle)



2) Definition of “morphs”

k=200

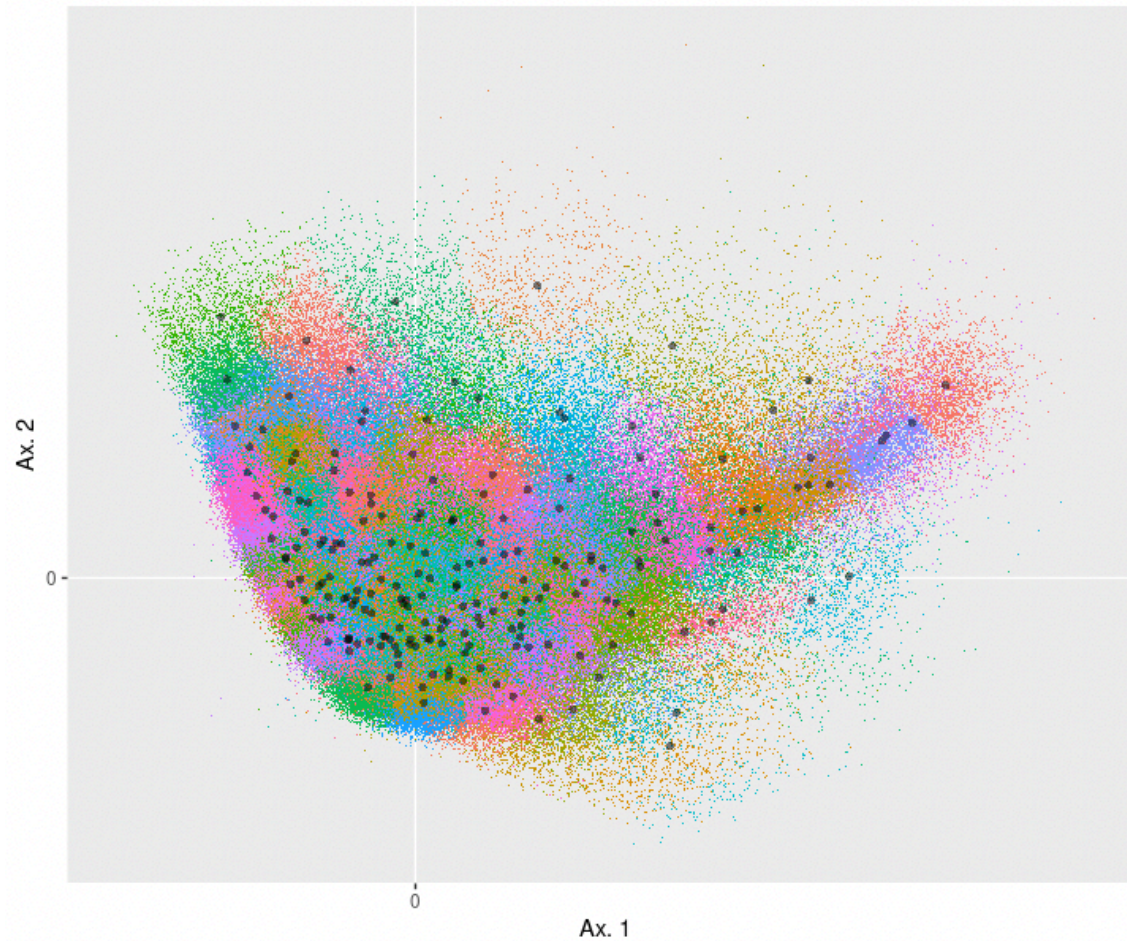
unsupervised clustering (k-means)...



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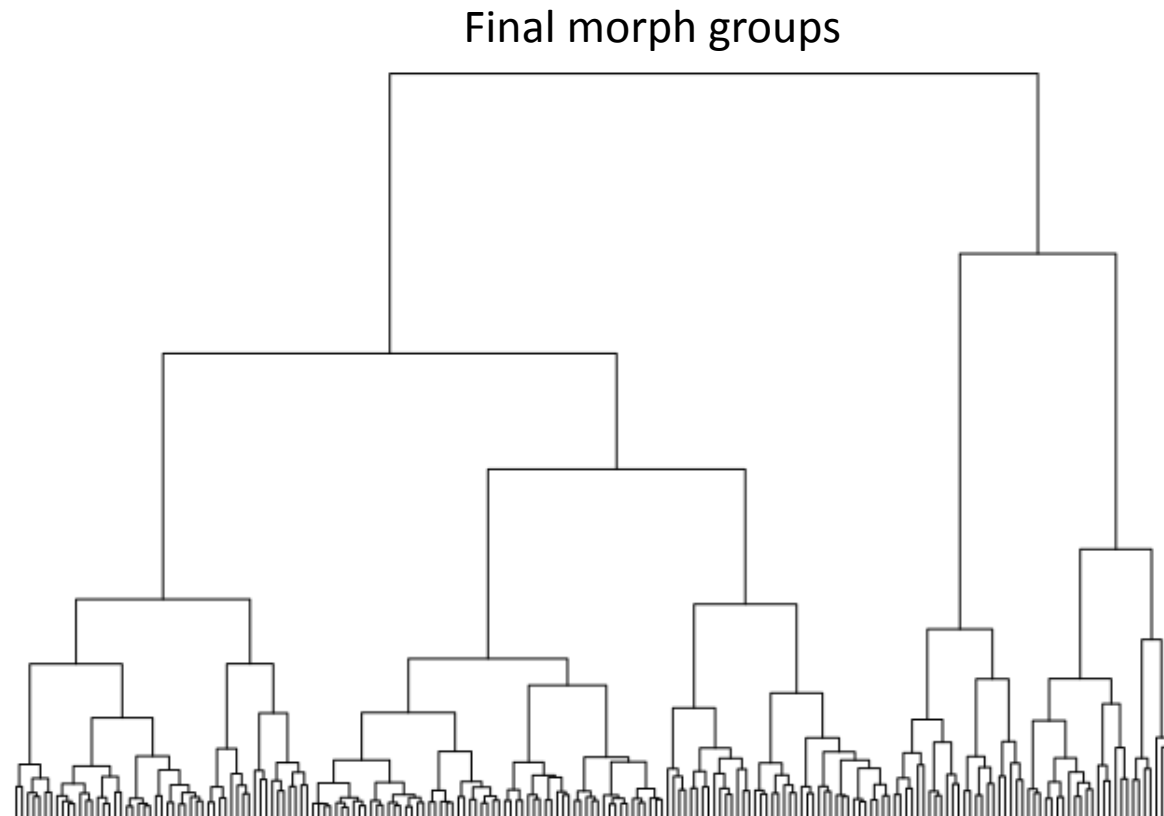


2) Definition of “morphs”

(ward.D2)

unsupervised clustering (k-means)...

...followed by hierarchical clustering on cluster centres

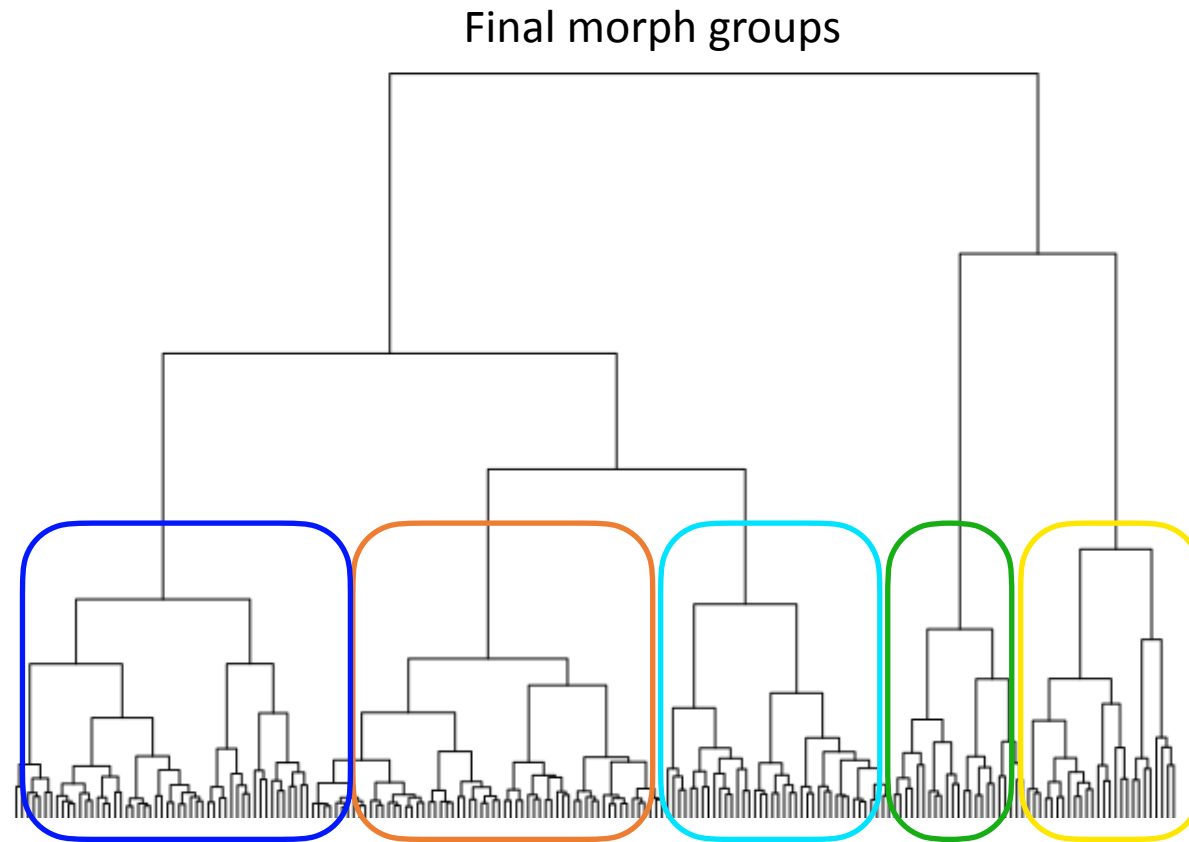


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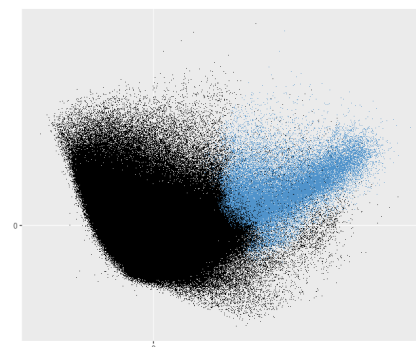
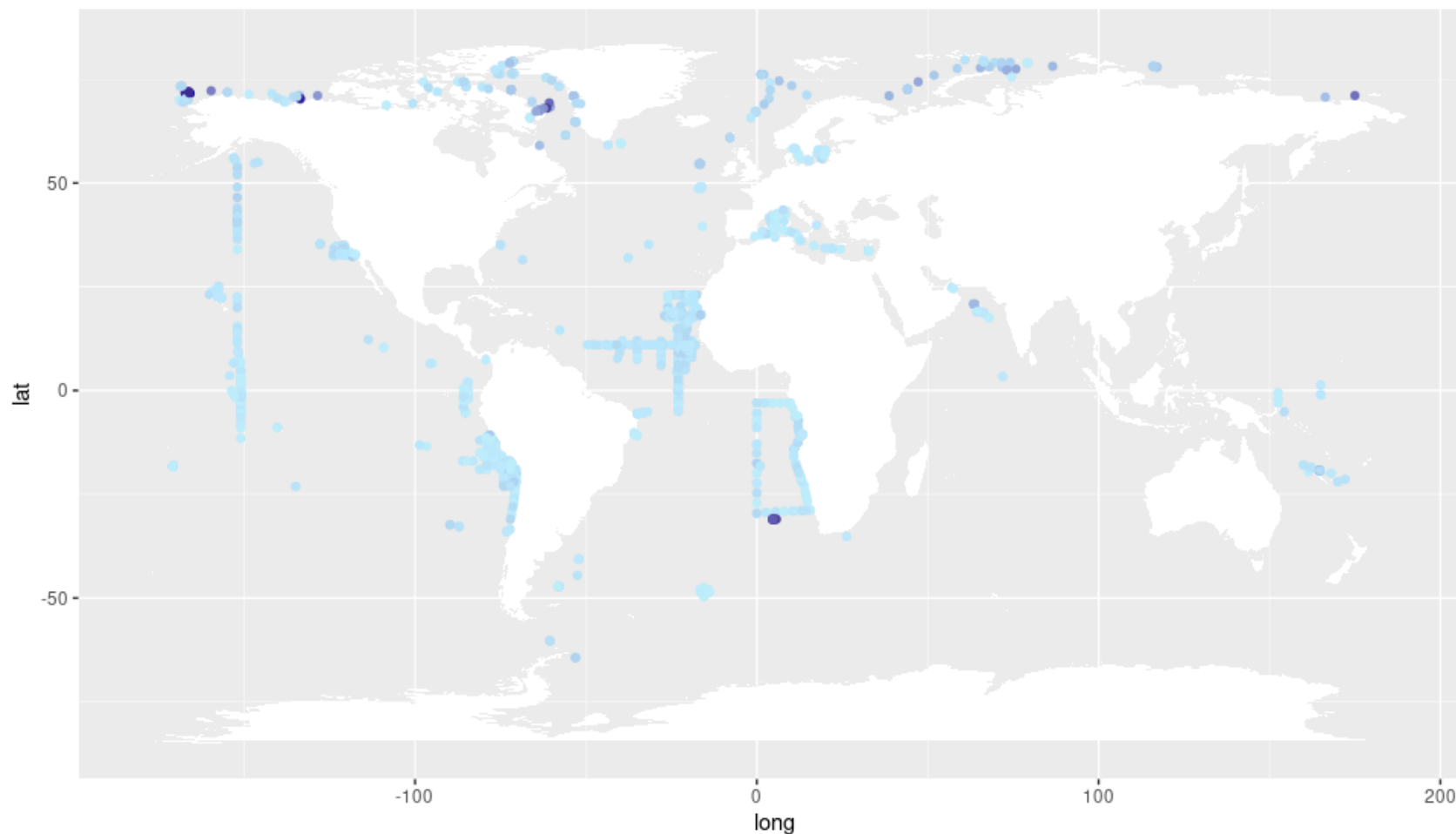
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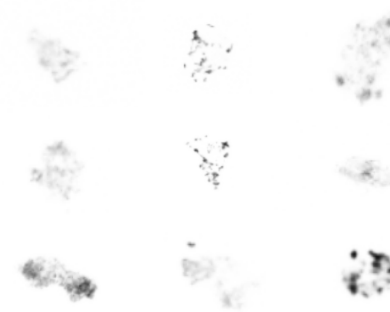
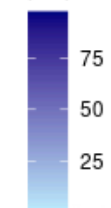
Geographical pattern

I'll decide which one to keep (or which one)
(this one or the next slide)

Proportion of "long & large" objects in surface layer



prop

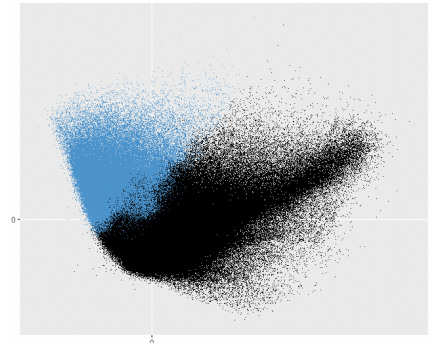
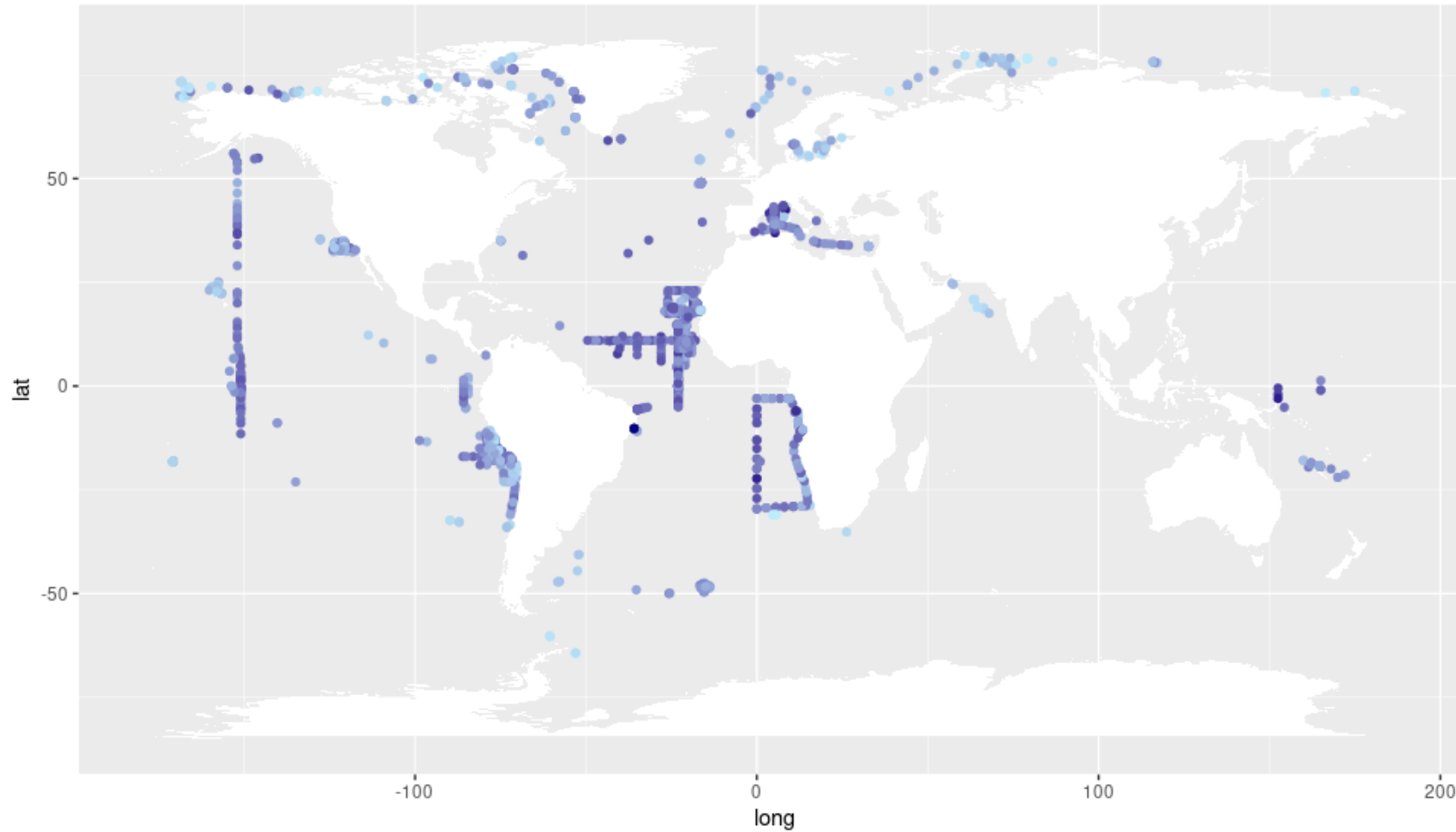


5mm

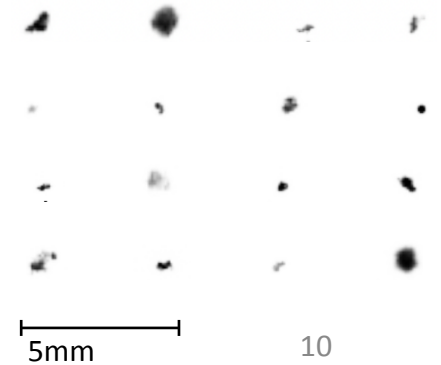
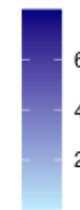
I'll decide which one to keep (or which one)

Geographical pattern

Proportion of "small & dark" objects in surface layer



prop



Conclusion

- ✓ It is possible to define groups of morphological similar particles based on image-derived features
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Next steps

- ➡ Test & identify best methods for each step
- ➡ Scale up the dataset
- ➡ Integration as feature into eco part

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- ➔ Integration as feature into eco part

...and hopefully improve/facilitate our understanding of ecological processes!



Thank you for your attention!

Lionel Guidi

Jean-Olivier Irisson

Sakina-Dorothee Ayata

Marc Picheral

Fabien Lombard

Rainer Kiko

Lars Stemmann

...& all those involved
in the sampling process!



**Institut des sciences
du calcul et des données**
SORBONNE UNIVERSITÉ



Laboratoire d'Océanographie et du Climat
Expérimentations et Approches Numériques



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