

Categorization of Meteorological Data by Contrastive Clustering

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Tackling Climate Change with Machine Learning
ICLR 2024



1

Deutscher Wetterdienst
Wetter und Klima aus einer Hand



2



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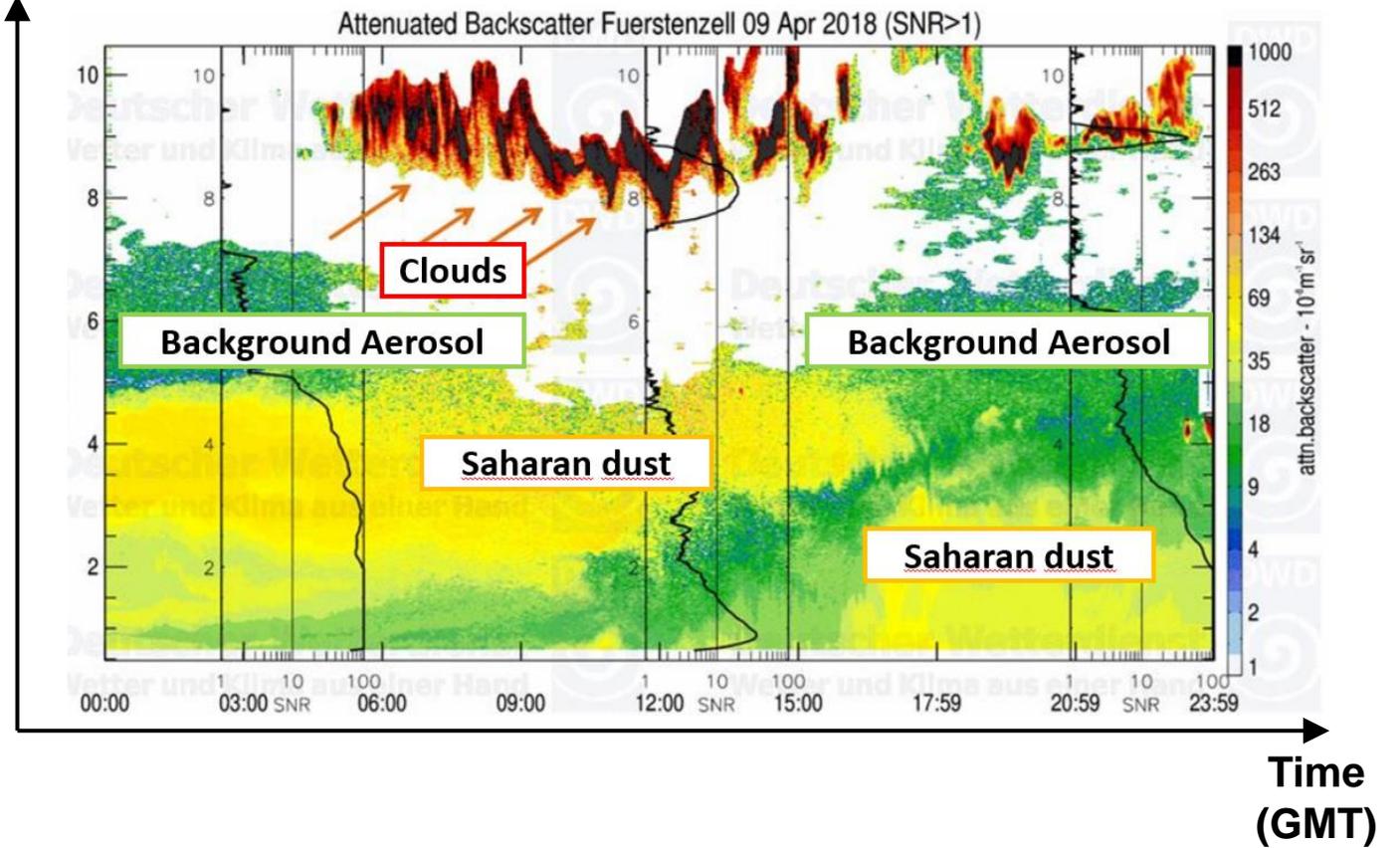
3

Ceilometers



Altitude
[km]

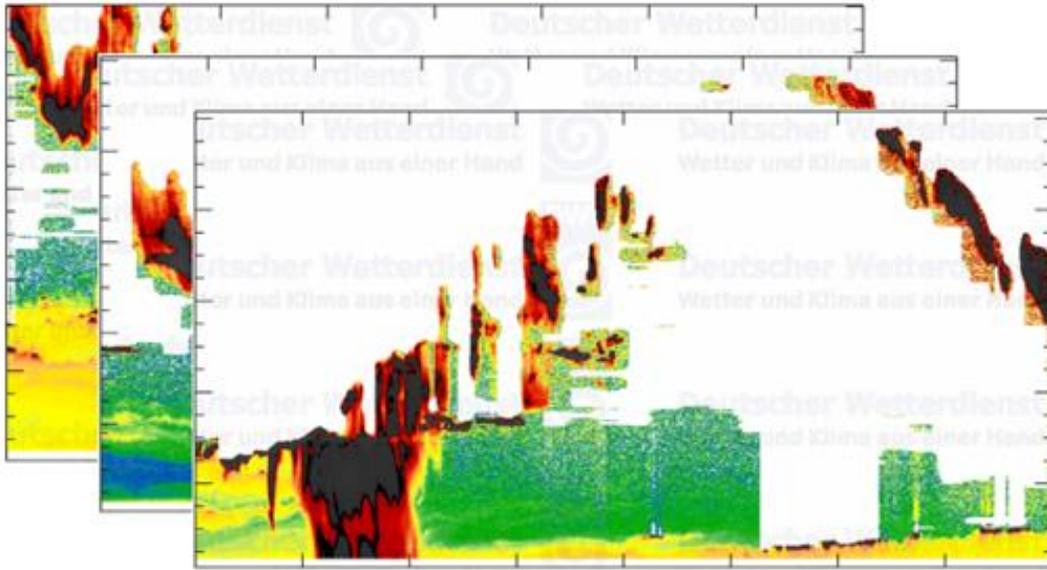
Example measurement - "Quick Look"



Simple LIDAR system
Vertical laser beam
Continuously measuring backscattered light

<https://www.dwd.de/DE/service/lexikon/Functions/glossar.html?lv2=100510&lv3=100538>
https://www.dwd.de/DWD/forschung/projekte/ceilomap/files/Saharan_dust_example_en.pdf

The Problem



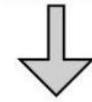
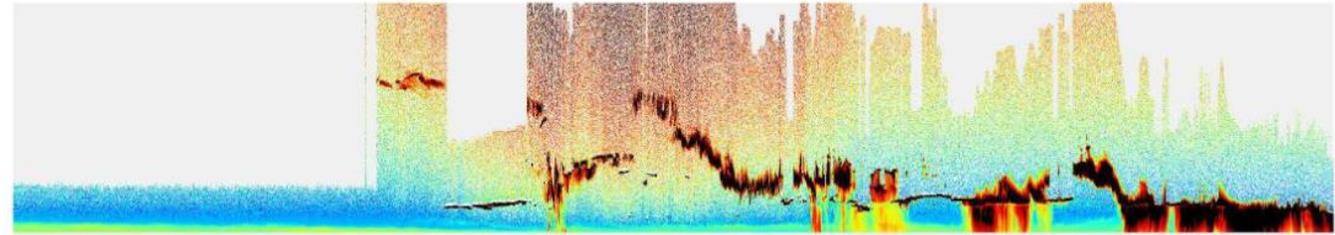
Data is unlabeled

At the moment:
analyzed manually by meteorology
experts

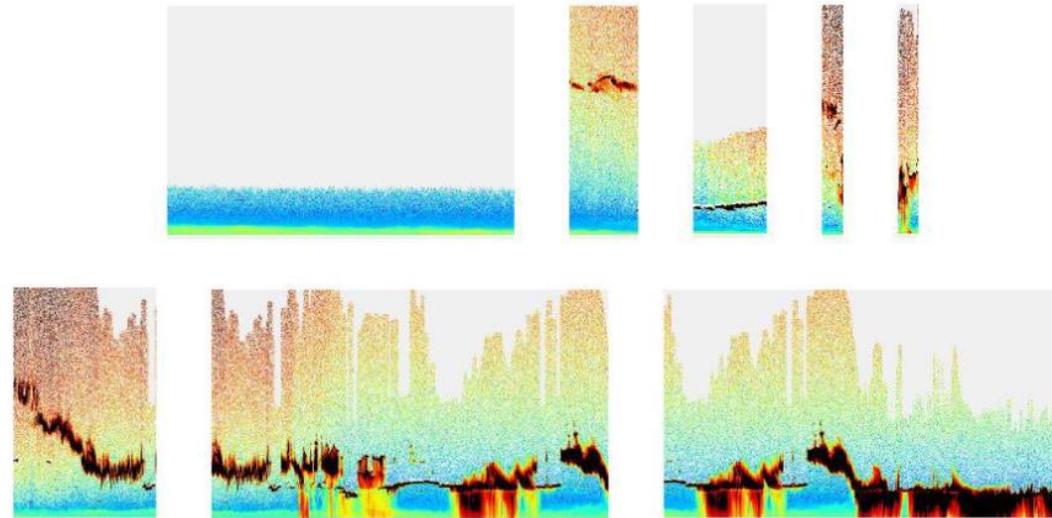
→ Unsupervised Machine Learning

- **Climate science insights**, like frequent, but not necessarily obvious, phenomena
- Automatic detection of situations with specific meteorological conditions for more detailed case studies, e.g., on **aerosol-cloud interactions**

The Approach: Slicing

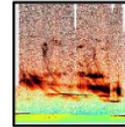
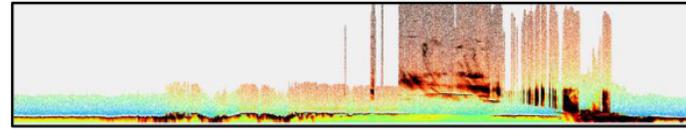


Felzenszwalb-Huttenlocher



The Approach: Slice Feature Engineering

Slice Feature Example: Helgoland, May 4th 2014

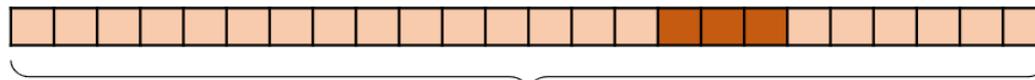


Daytime Encoding (Multi-hot):

Ranges from **15 to 18 pm**



15 to 18 pm



length = 24

Location Encoding:

Longitude: 54.18

Latitude: 7.89



Min-Max-Norm

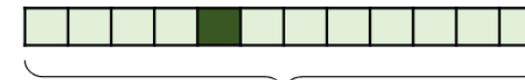
0.8 | 0.2

Month Encoding (One-hot):

Helgoland, **May** 4th 2014

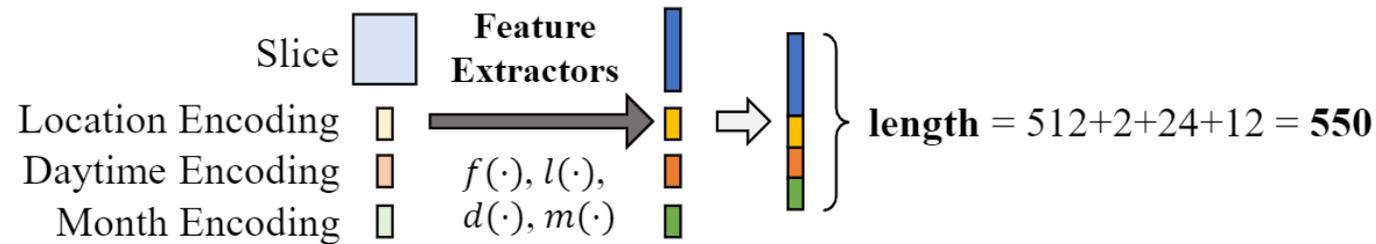


May



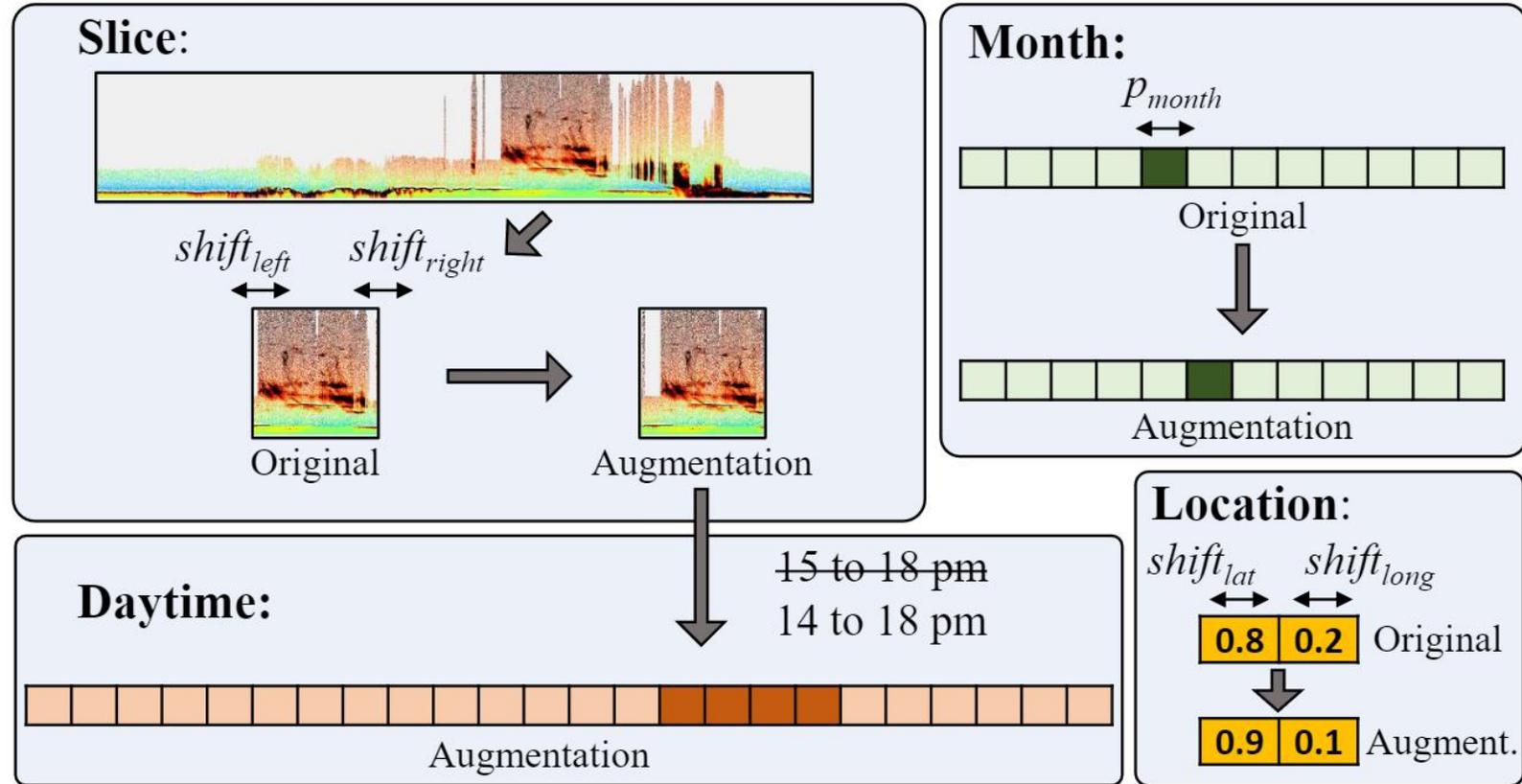
length = 12

Overall Feature Vector:

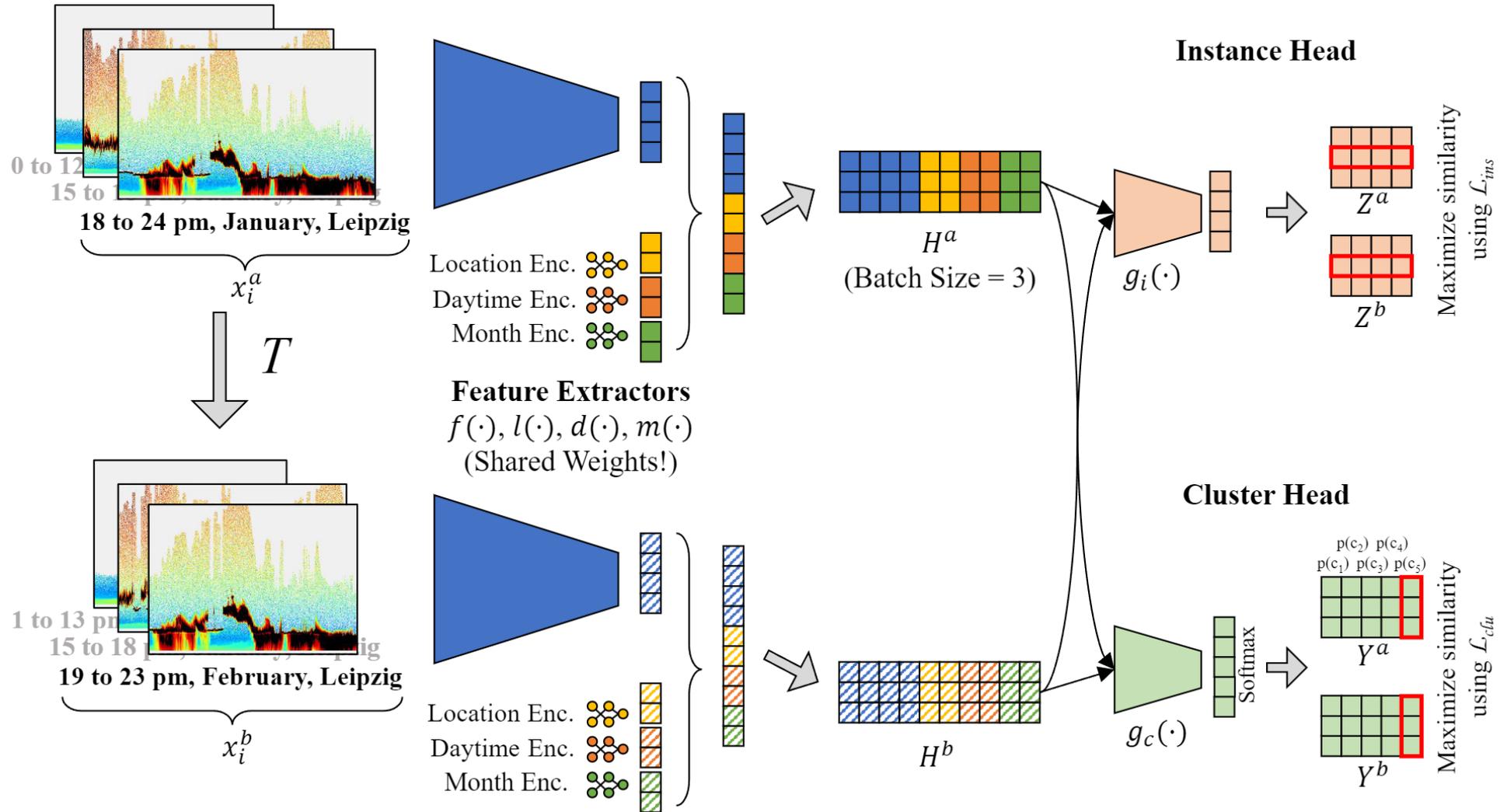


The Approach: Augmentation Regime

Augmentation Example: Helgoland, May 4th 2014

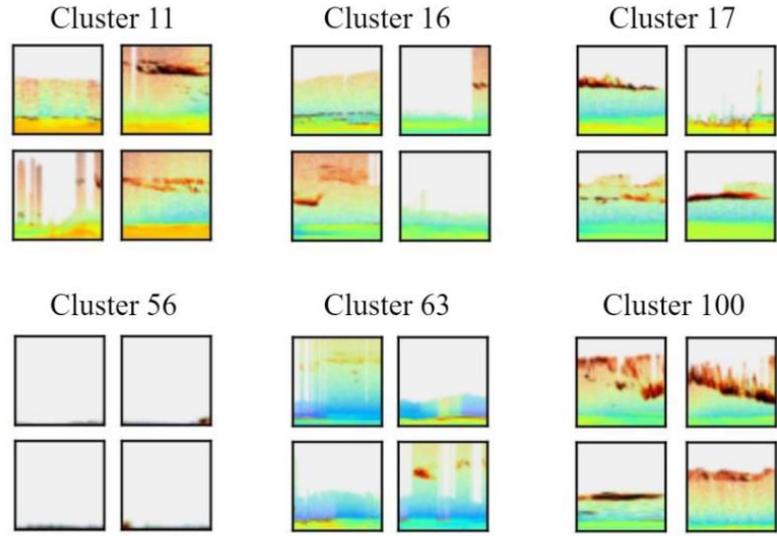


The Approach: Contrastive Clustering



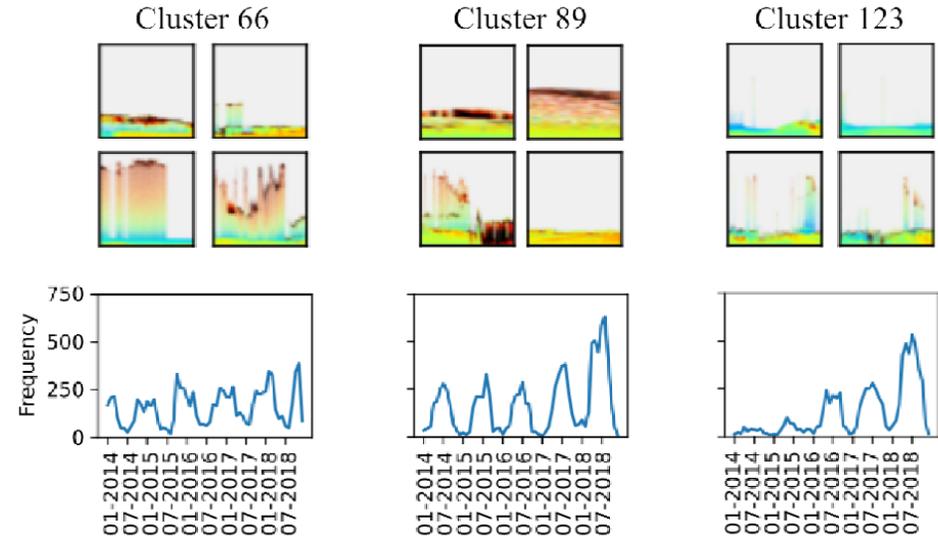
See also: Li et al.: Contrastive Clustering, AAAI 2021.

Results



(a)

Specialized Clusters
E.g., 56: fog, 63: clear sky,
100: certain kind of clouds



(b)

Trend detection
E.g., higher frequency of dry
periods (cluster 123)

Outlook

Utilize cluster assignment for annotation process
Use annotations for supervised training

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