

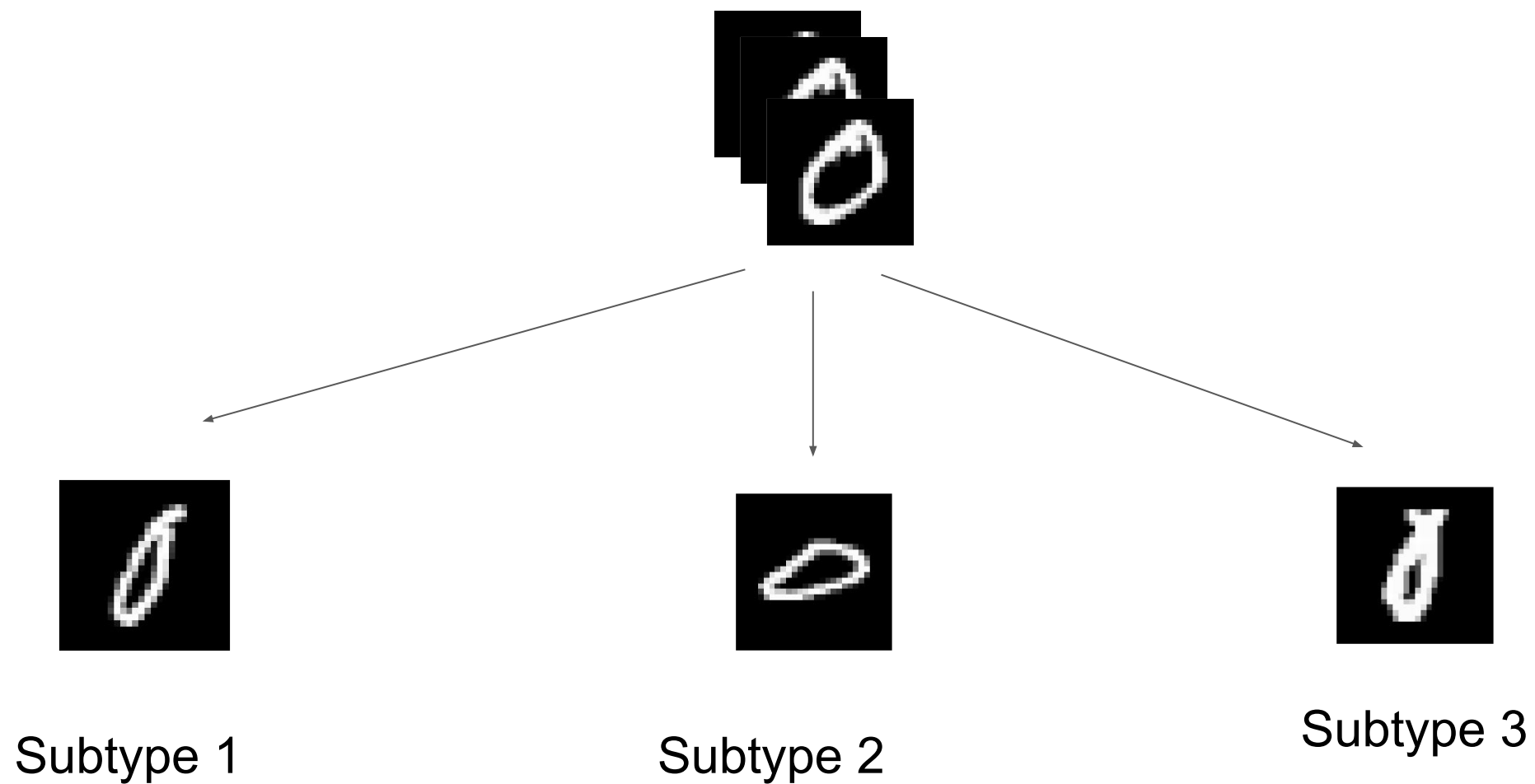


FAKULTÄT FÜR
INFORMATIK

Categorizing Classification Errors

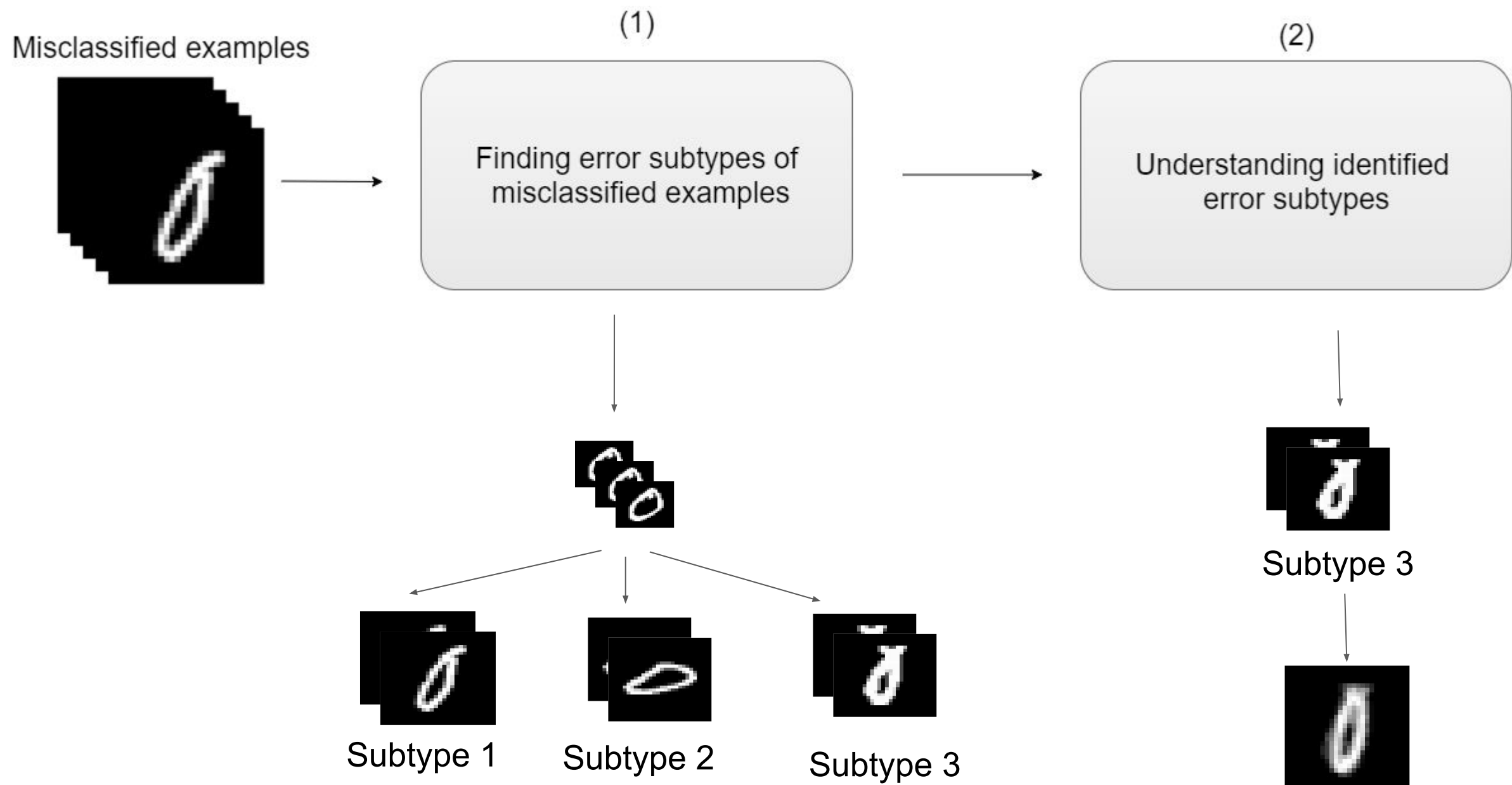
Overview

Misclassified examples of 0



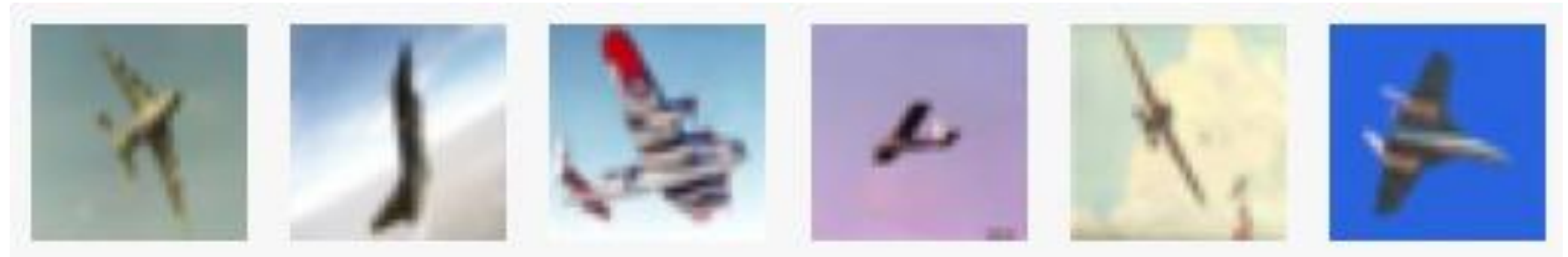
Method: Concept

2 Stages:



Stage 1 overview Approaches

- CNN



- Autoencoders



- Embeddings



TSNE visualisation (Autoencoder)



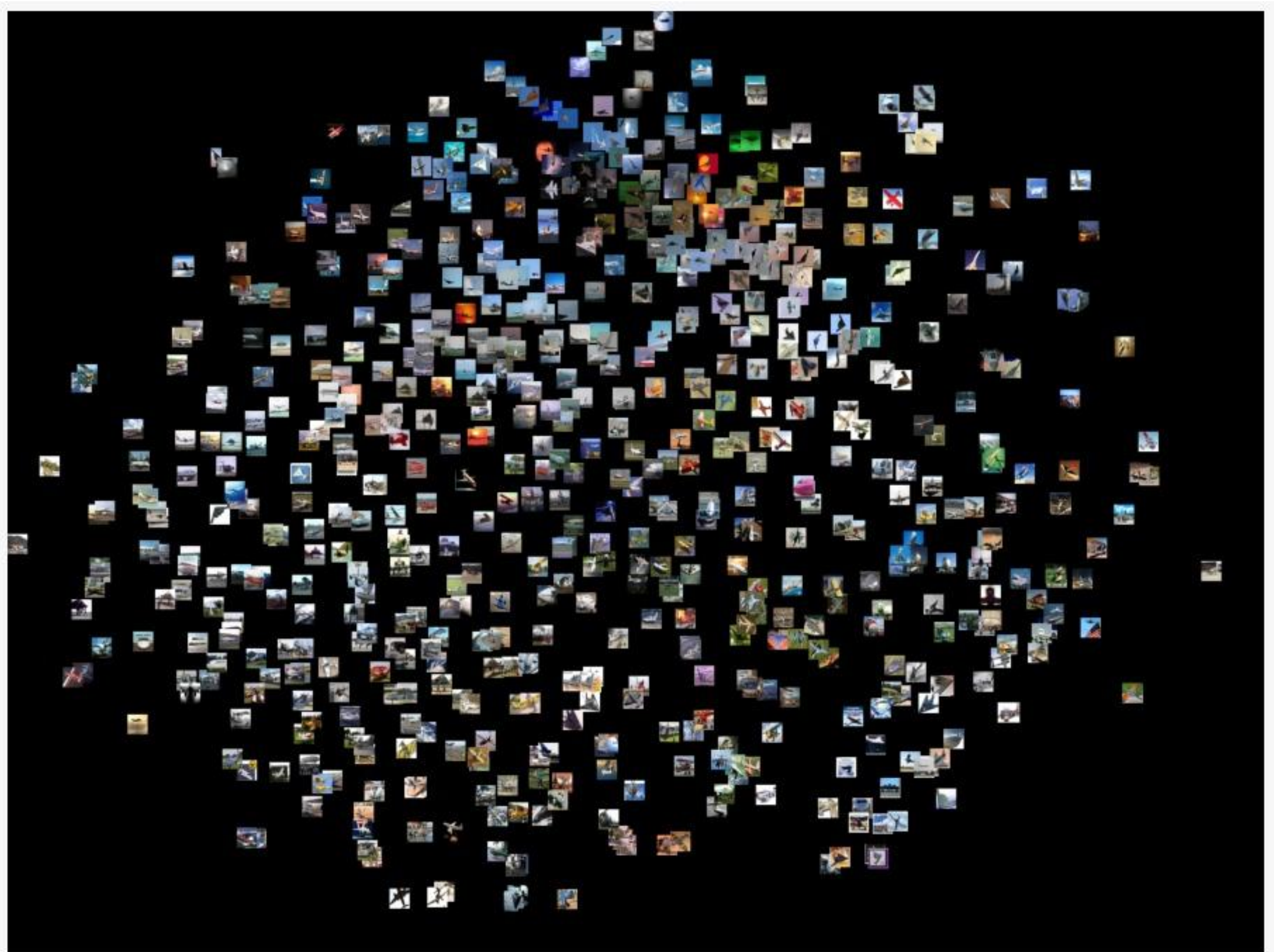
TSNE visualisation (Autoencoder)



TSNE visualisation (CNN)



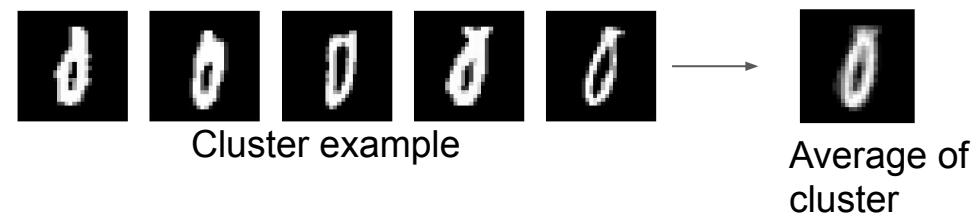
TSNE visualisation (VGG16)



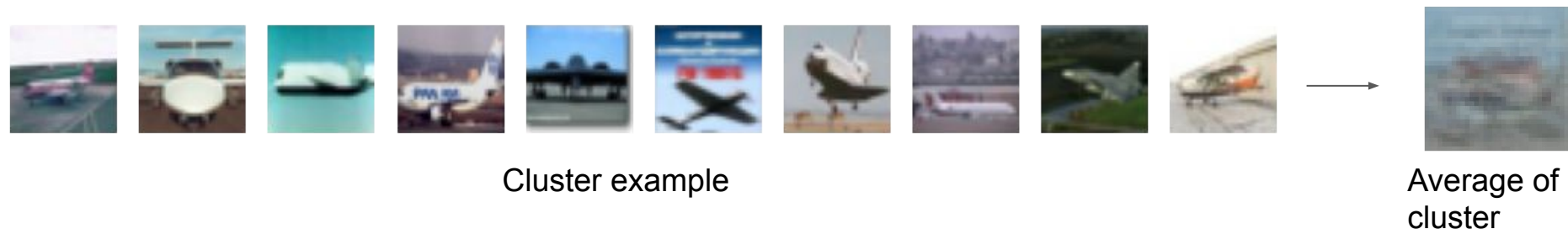
Method: Baseline approach problem

- (1) Simple clustering approaches (e.g. K-means) will not easily group such images
- (2) Averaging over all the examples in the group will result in a noisy image

- Example (MNIST):



- Example (CIFAR10):

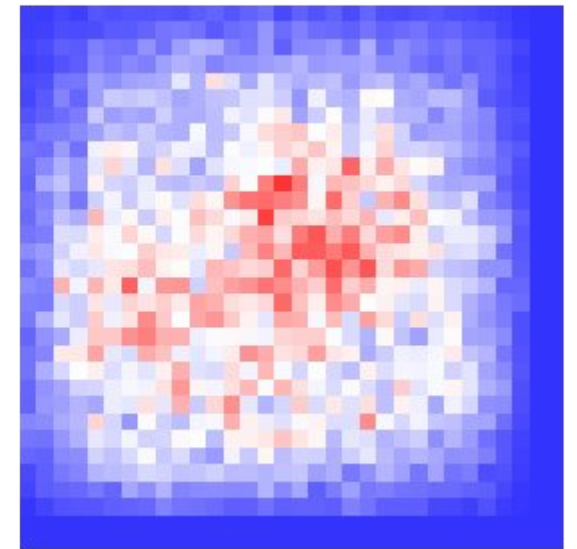
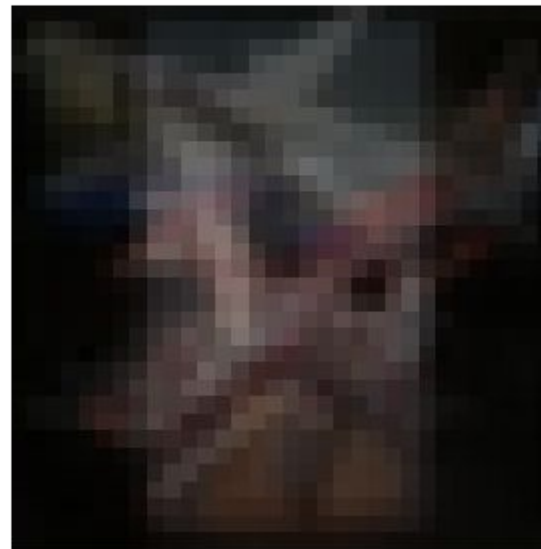


Recap- Method: Approach

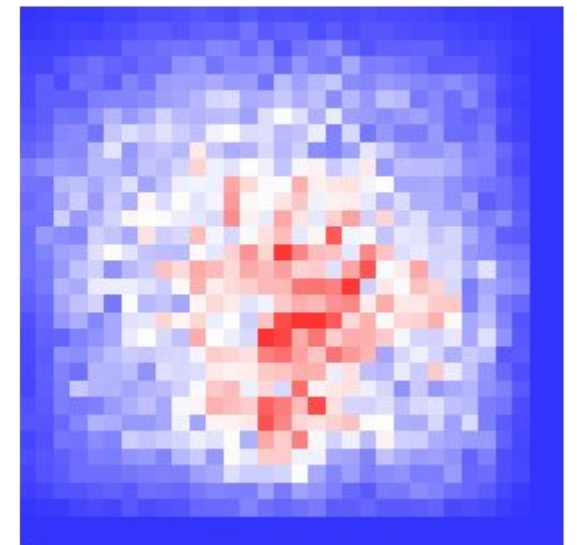
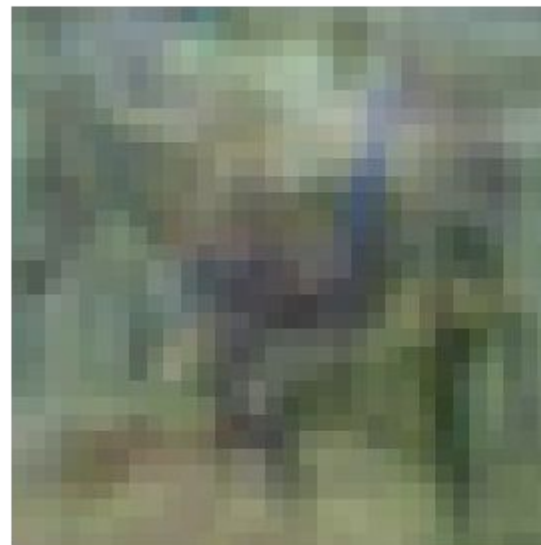
- Improve how to represent the error subtype
 - Hierarchical clustering representations
 - Other approaches:
 - Circular clustering
 - Investigating clustering in multiple stages
 - Saliency maps

Saliency map approach

Average Saliency maps
(6 images) **same
cluster**

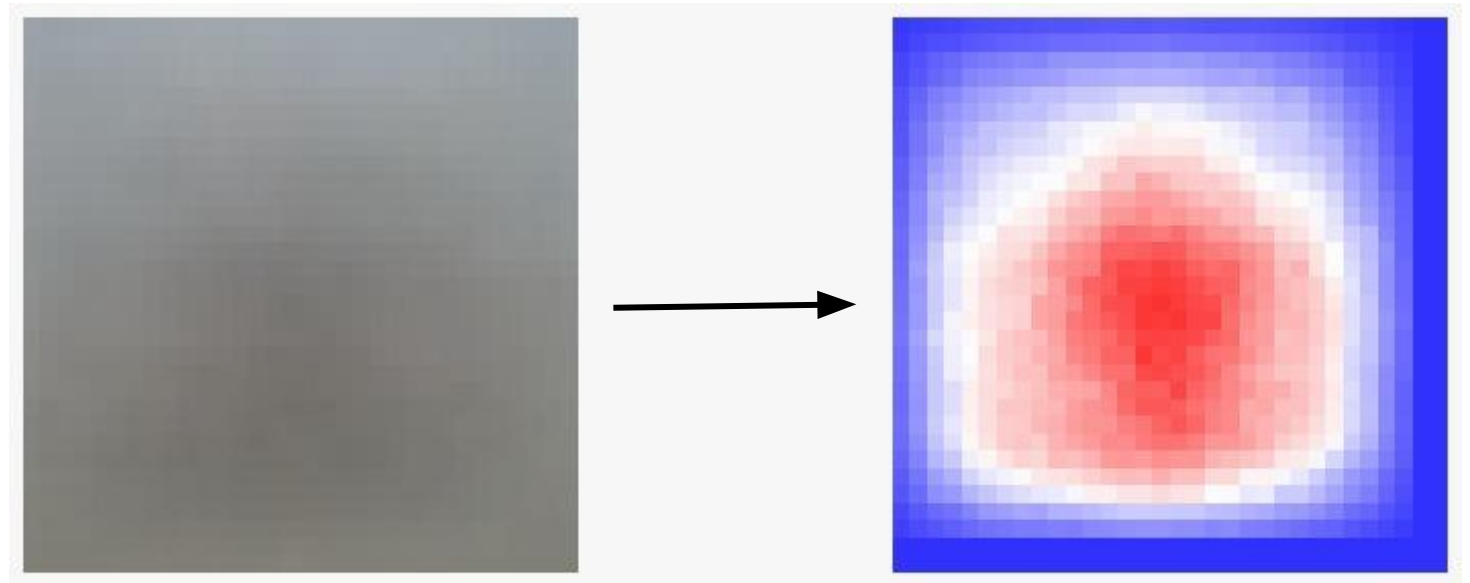


Average Saliency maps
(6 images) **randomly
chosen**

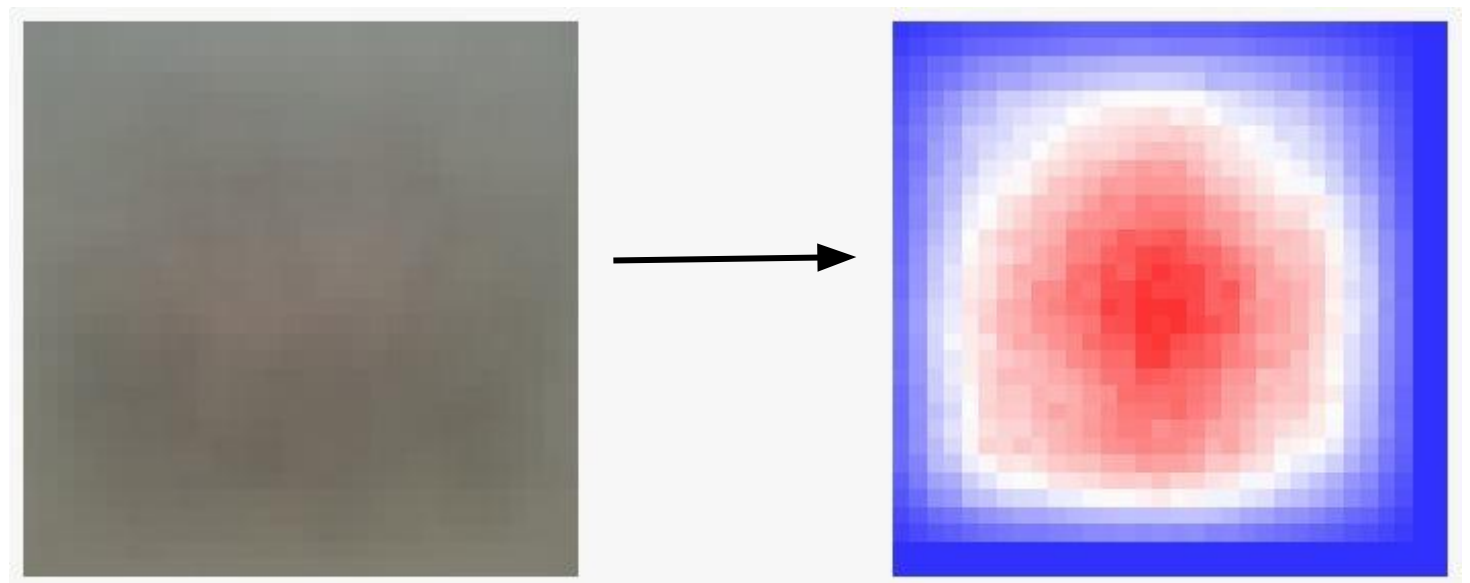


Saliency map approach

Average Saliency maps
(498 images) same
cluster

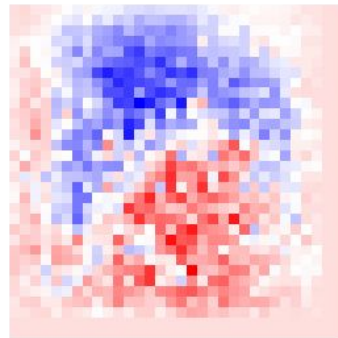
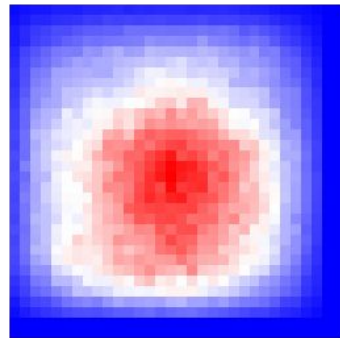


Average Saliency maps
(498 images) randomly
chosen

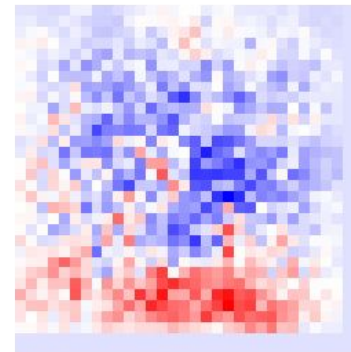
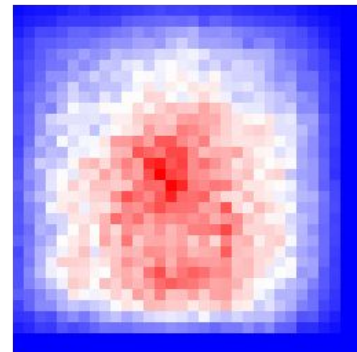


Saliency map approach (Normalization)

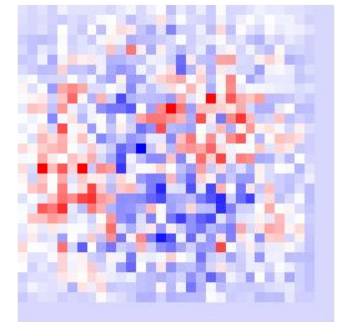
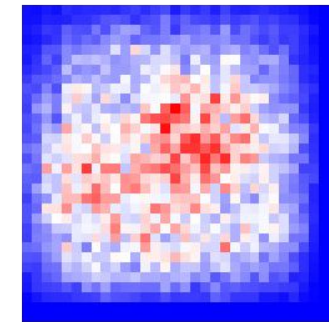
Cluster 1



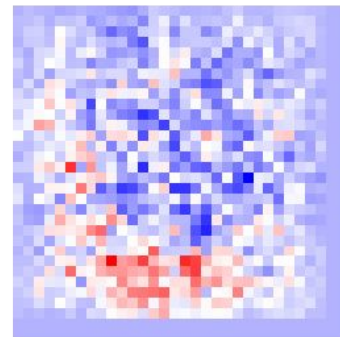
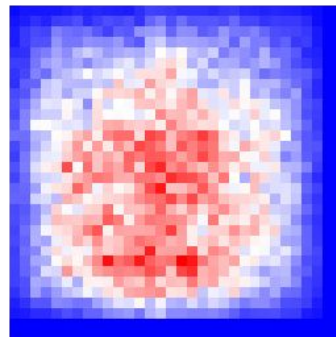
Cluster 2



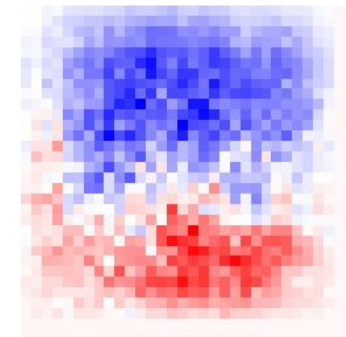
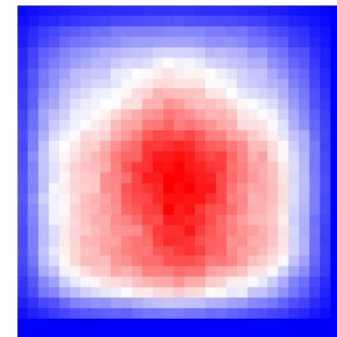
Cluster 3



Cluster 4

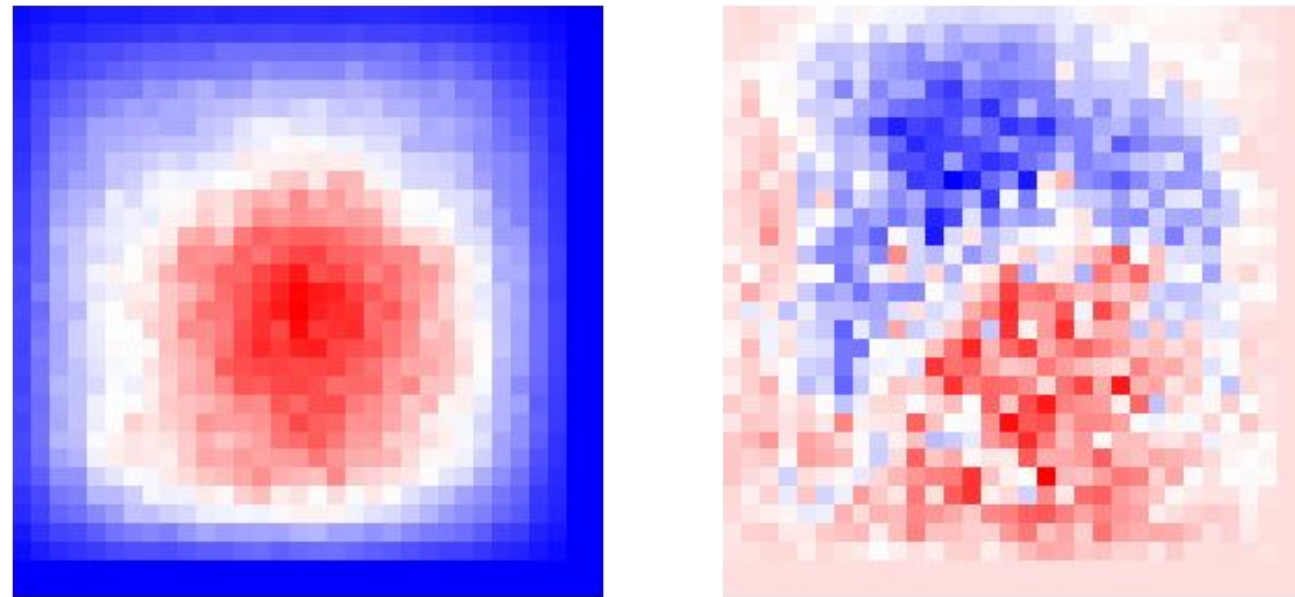


Cluster 5



Saliency map approach (Normalization)

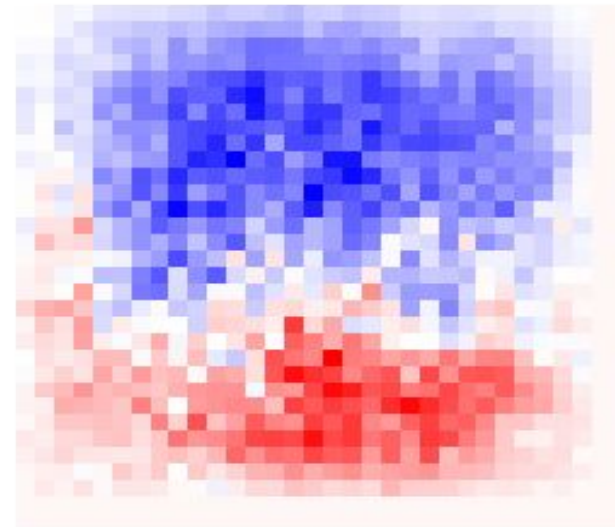
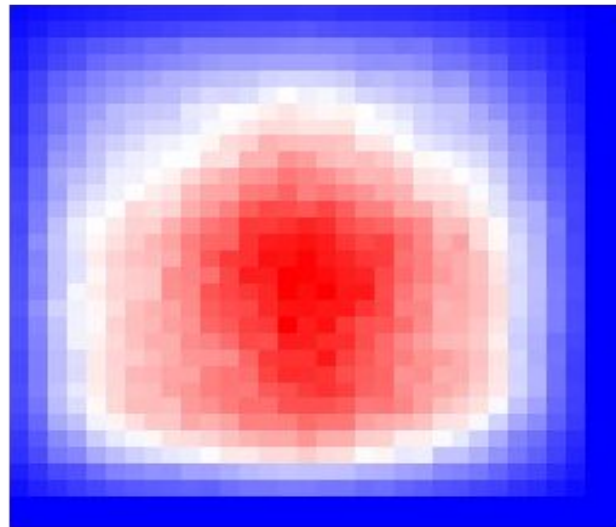
Cluster 1



Images example

Saliency map approach (Normalization)

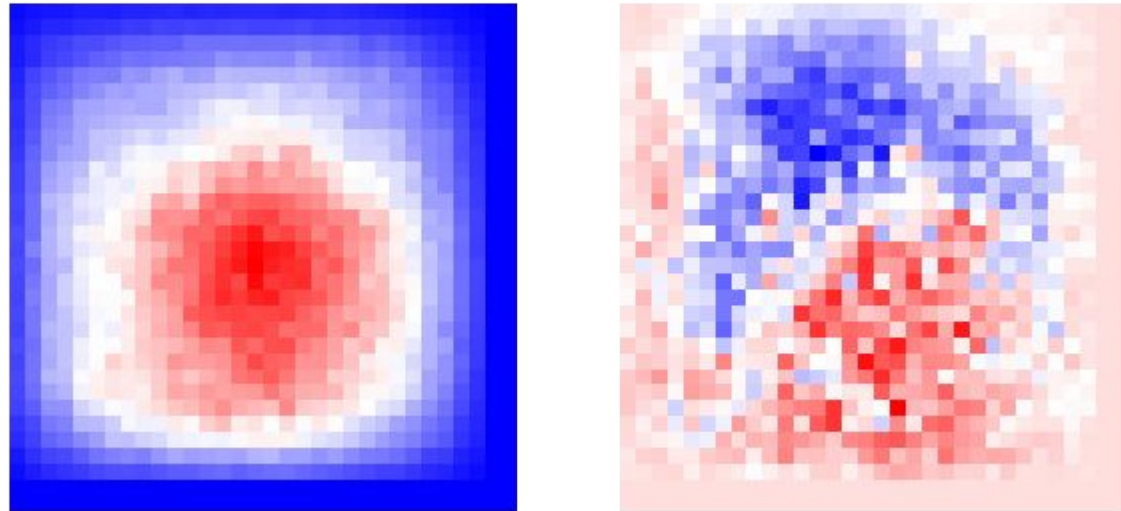
Cluster 5



Images example

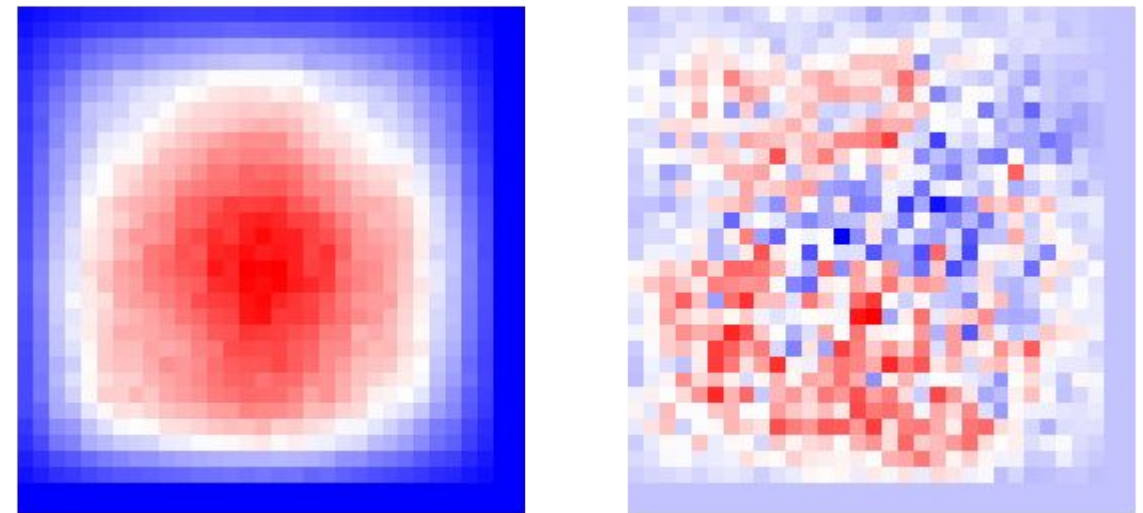
Saliency map approach (Normalization)

Cluster 1
(157 images)

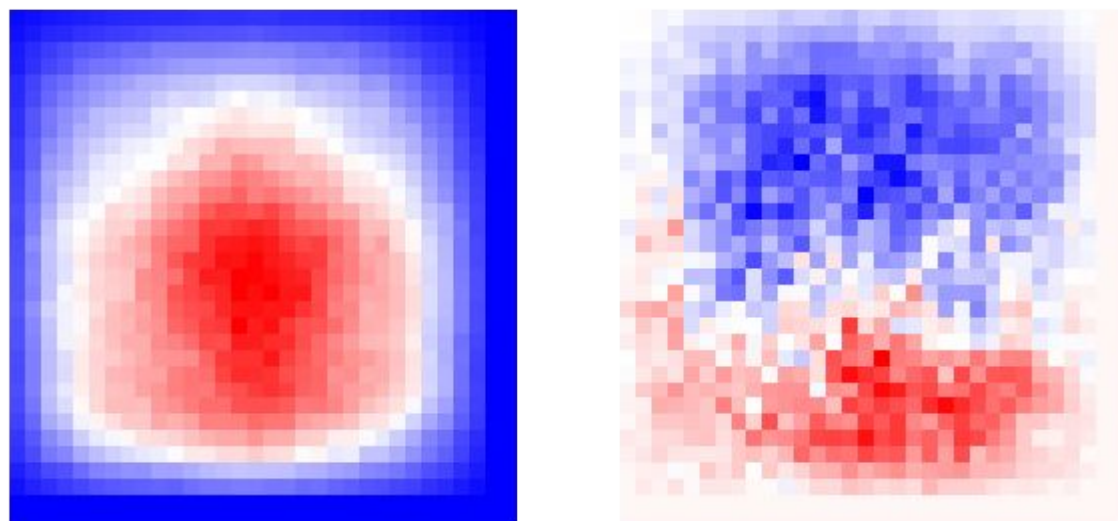


vs.

Random set (157 images)

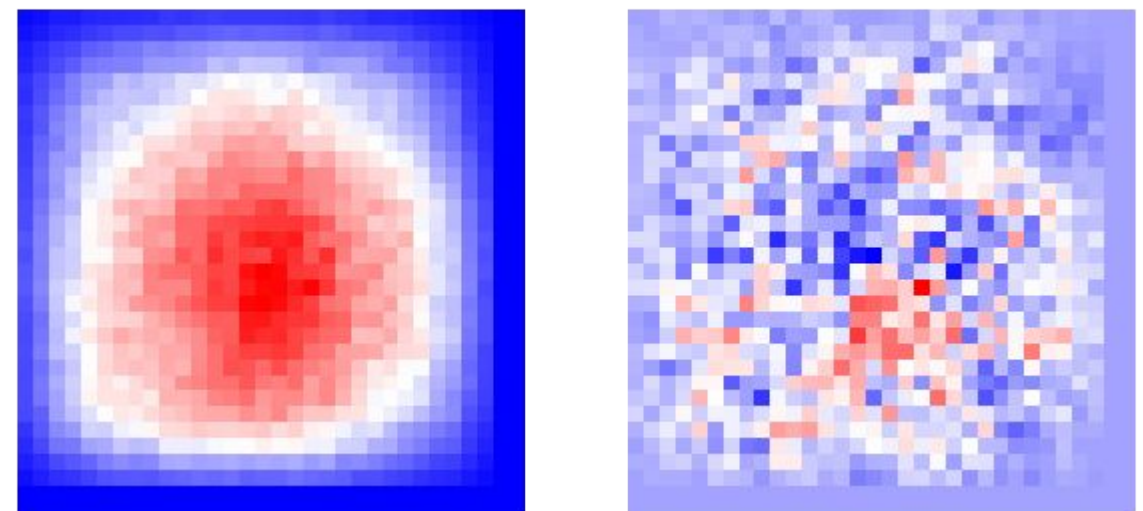


Cluster 5
(477 images)



vs.

Random set (477 images)

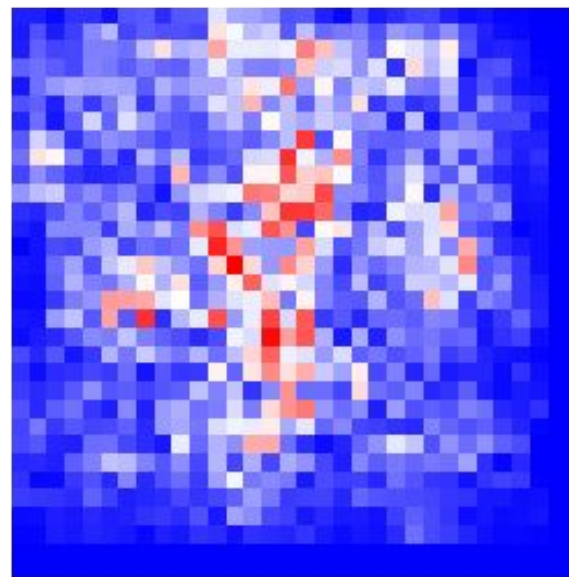


Saliency map approach

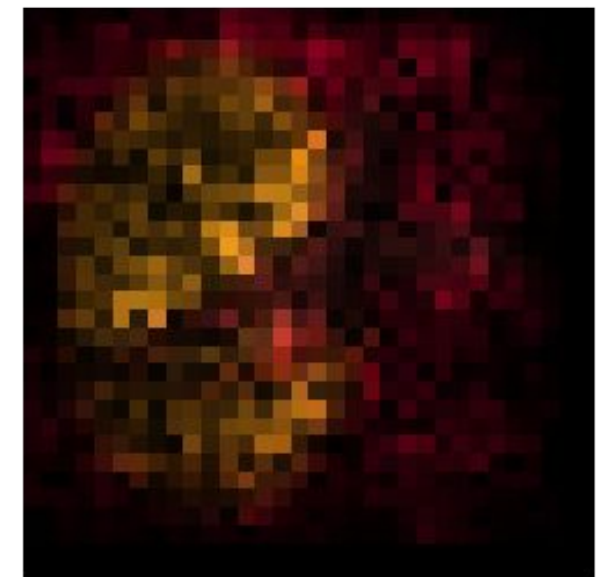
Original Image



Saliency map



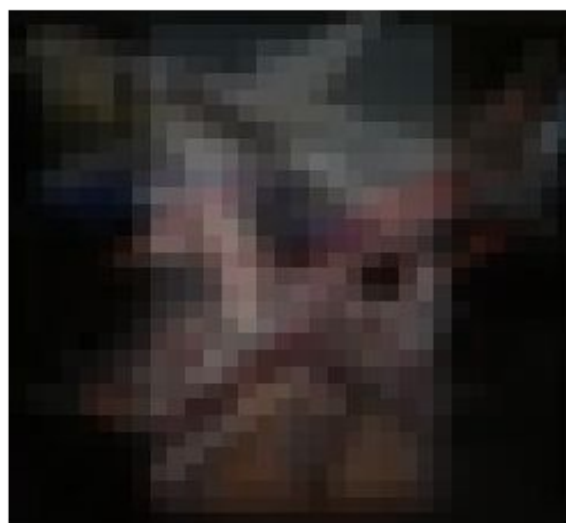
Superimposed heatmap



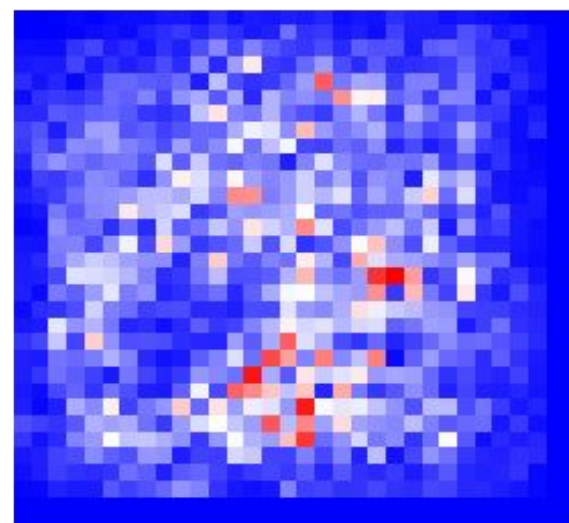
X

=

Average sub-group



Saliency map



Superimposed heatmap



X

=

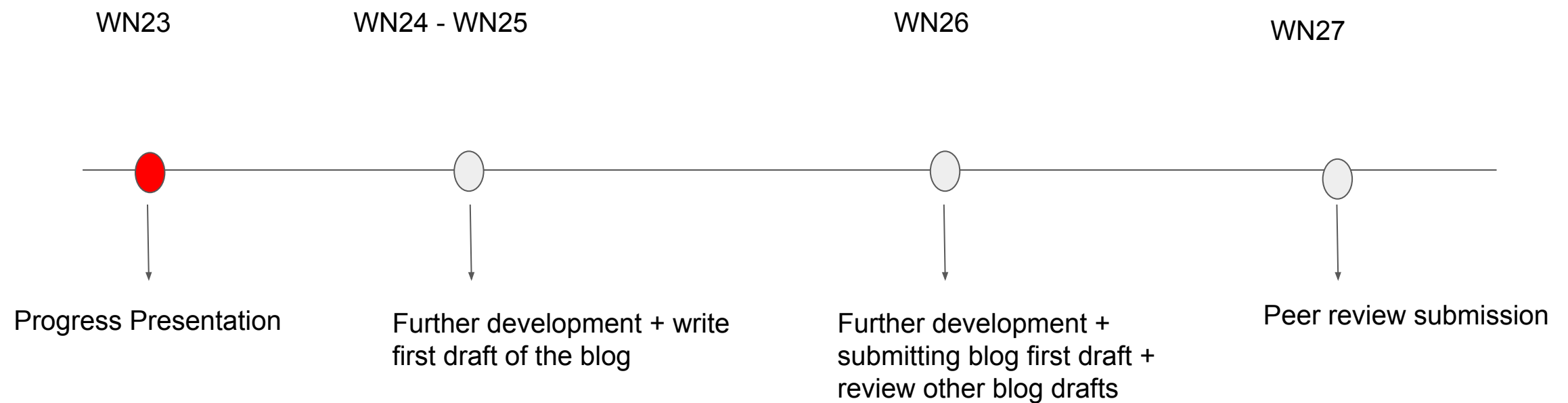
What's next?

- Applying clustering in multiple approaches (Autoencoders and CNN)
- Grouping according to the misclassified label

Nice to have

- Applying a description approach for each cluster

Plan: Time plan



Thank you for your attention