

On the Effects of Self-supervision and Contrastive Alignment in Deep Multi-view Clustering

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Motivation

- Currently: many new approaches are emerging for selfsupervision-based components in deep MVC.
 - E.g. contrastive alignment

 However, lack of direction and consistent advancements makes it difficult to conduct further research.

Contributions

 Prove that contrastive alignment is harmful to cluster separability as the number of views increases.

- DeepMVC framework.
 - Open-source implementation!
 - 6 new instances (models).

Extensive experimental evaluation.

Main findings

New instances with state-of-the-art performance.

- Contrastive alignment works well with few views, but not with many views
 - In-line with theoretical findings.

Outline

- Introduction
- Drawbacks of alignment
- DeepMVC framework
- New instances
- Experimental findings

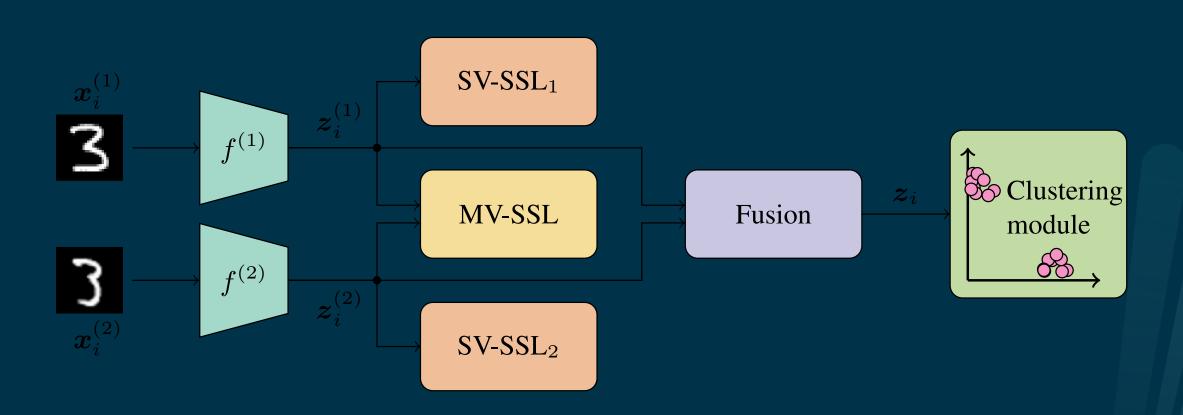
Drawbacks of alignment

 Cluster separability in the representation space depends on cluster separability in the worst view.

 Encoders can make clusters overlap but cannot separate inseparable clusters.

Probability of bad views existing increases with the view count.

DeepMVC framework



DeepMVC framework

- Can be extended to arbitrary number of views.
- Includes many recent methods as instances.
- Open-source implementation available on GitHub:



New instances

- Objective: Investigate effects of alignment and address drawbacks
- Self-supervision:
 - Contrastive alignment
 - Mutual information maximization
 - Autoencoder
- Clustering modules:
 - Deep divergence-based clustering (DDC)
 - K-means
- Simple baselines!

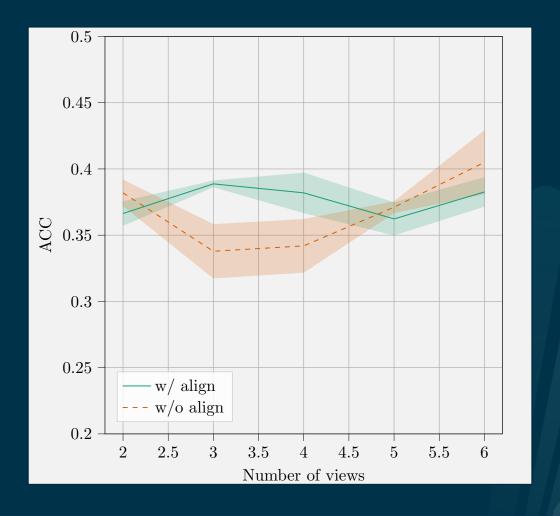
Experimental findings

- Contrastive alignment works well with few views
- Maximization of mutual information works better with many views
- Dataset properties significantly impact performance.
- New instances out-perform previous methods.
- All methods benefit from some form of self-supervision

Alignment vs. number of views

 Performance with alignment decays after 3 views

 Performance without alignment is best with all views



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Check out our GitHub repo:

