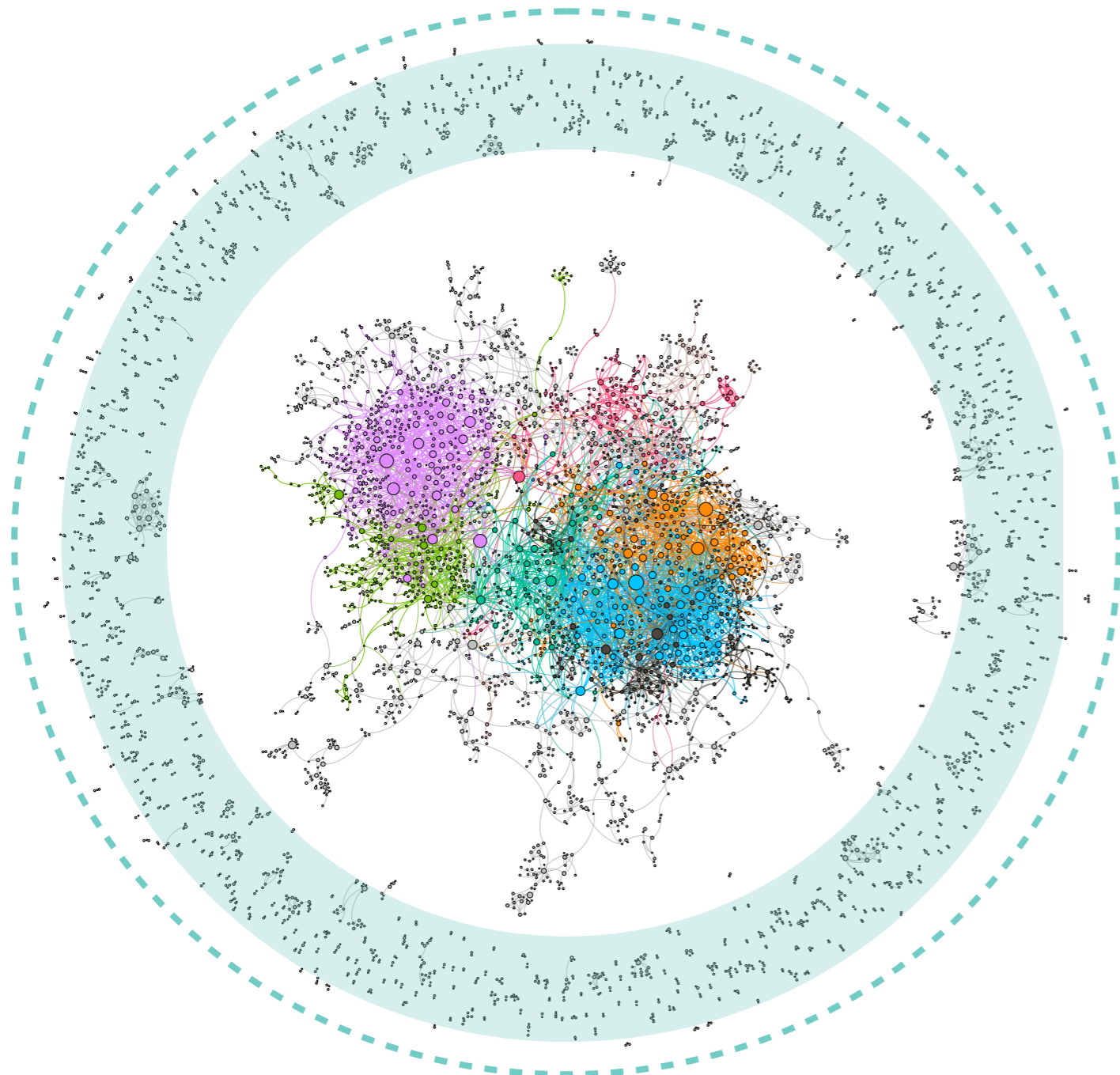


Complex Networks 2018



Temporal Alignment of Reddit Network Embeddings

**Siobhán Grayson
&
Derek Greene**

Insight Centre for Data
Analytics, UCD

1

Motivation

Diachronic Word Embeddings

from the field of Natural Language Processing (NLP)



Hamilton, W. L., et al. ACL (2016)

1

Motivation

Diachronic Word Embeddings

from the field of Natural Language Processing (NLP)

**Can this be applied
to social networks to study
how user roles change
over time?**

a daft gay
flaunting
tasteful
frolic
w
gays
gay (1990s)
lesbian

850s)

pensive
gloomy

wonderful
ul (1990s)
weird
wfully

Hamilton, W. L., et al. ACL (2016)

2

Methodology

Dataset consists of 29 subreddits identified by Hamilton et al. as exhibiting the most “loyal” or “vagrant” user features

Class	#SR	#V _{T1}	#E _{T1}	#V _{T2}	#E _{T2}	#V _{T3}	#E _{T3}
Loyal	13	15,319	89,496	15,193	91,138	14,531	87,149
Vagrant	16	13,462	22,323	14,030	23,831	13,314	22,247

Table: Notation - SR: Subreddits, VT 1: Nodes in Temporal Window 1, ET 1: Edges in temporal window 1

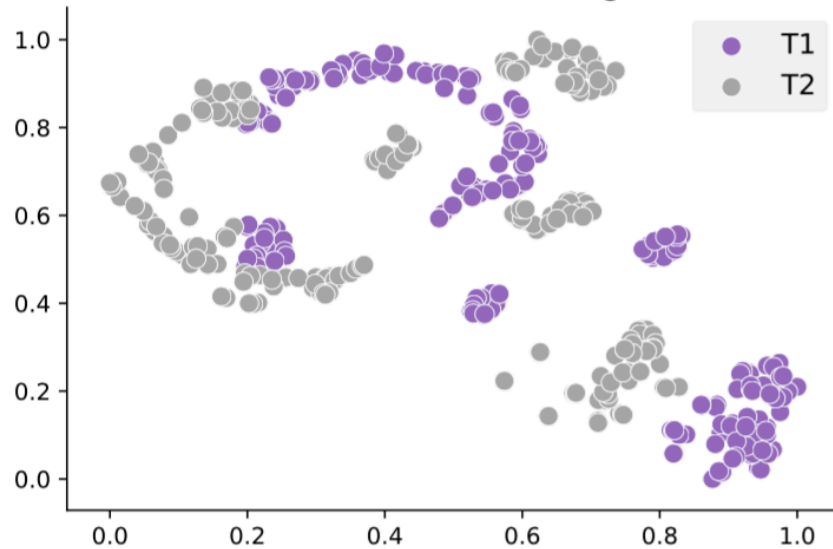
- **Loyal** - Teams and sports related subreddits
- **Vagrant** - Picture submission subreddits such as “r/earthporn” or “r/foodporn”.

2

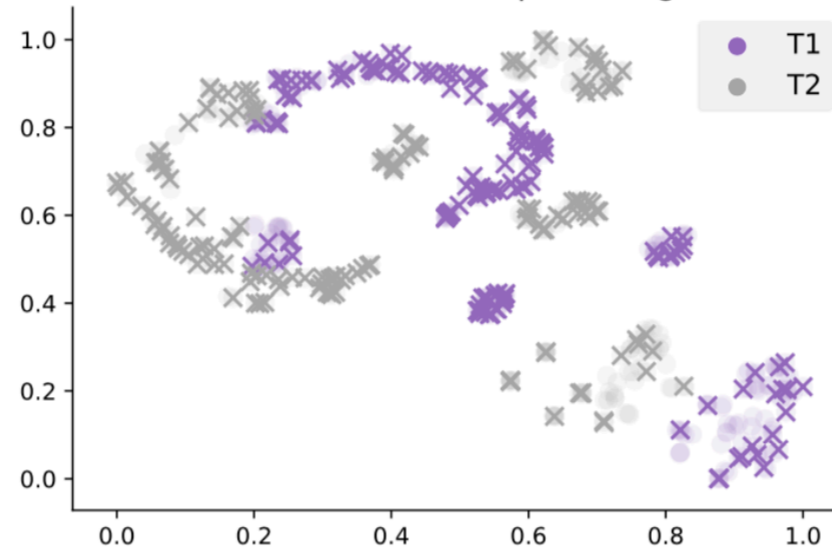
Methodology

Temporal Role Alignment

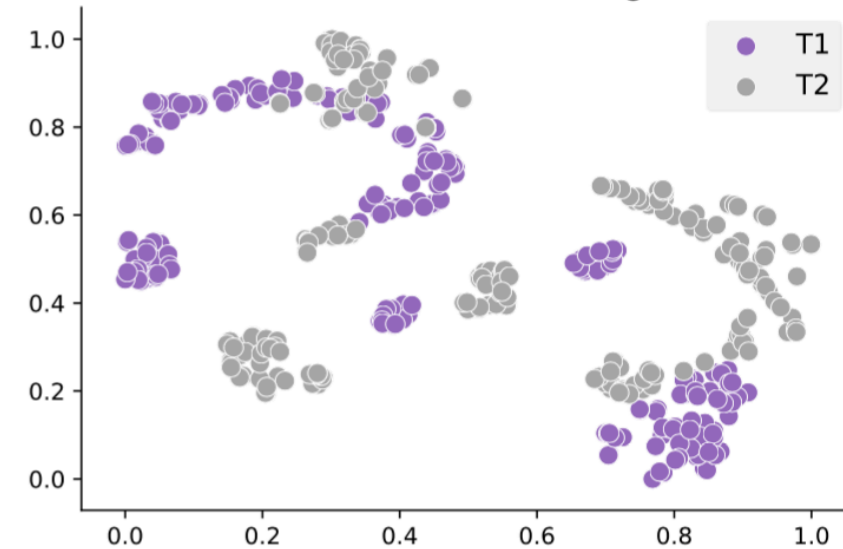
t-SNE r/ACMilan12 Pre-Alignment



t-SNE r/ACMilan Overlap Pre-Alignment



t-SNE r/ACMilan12 Post-Alignment



(a) Pre-Alignment Embeddings

(b) User Overlap Embeddings

(c) Post-Alignment Embeddings

- Graph embeddings are generated using ***struc2vec*** (Ribeiro et al, KDD'17)
- Spaces are aligned using **normalised orthogonal Procrustes**

Evaluation - Cosine Similarity

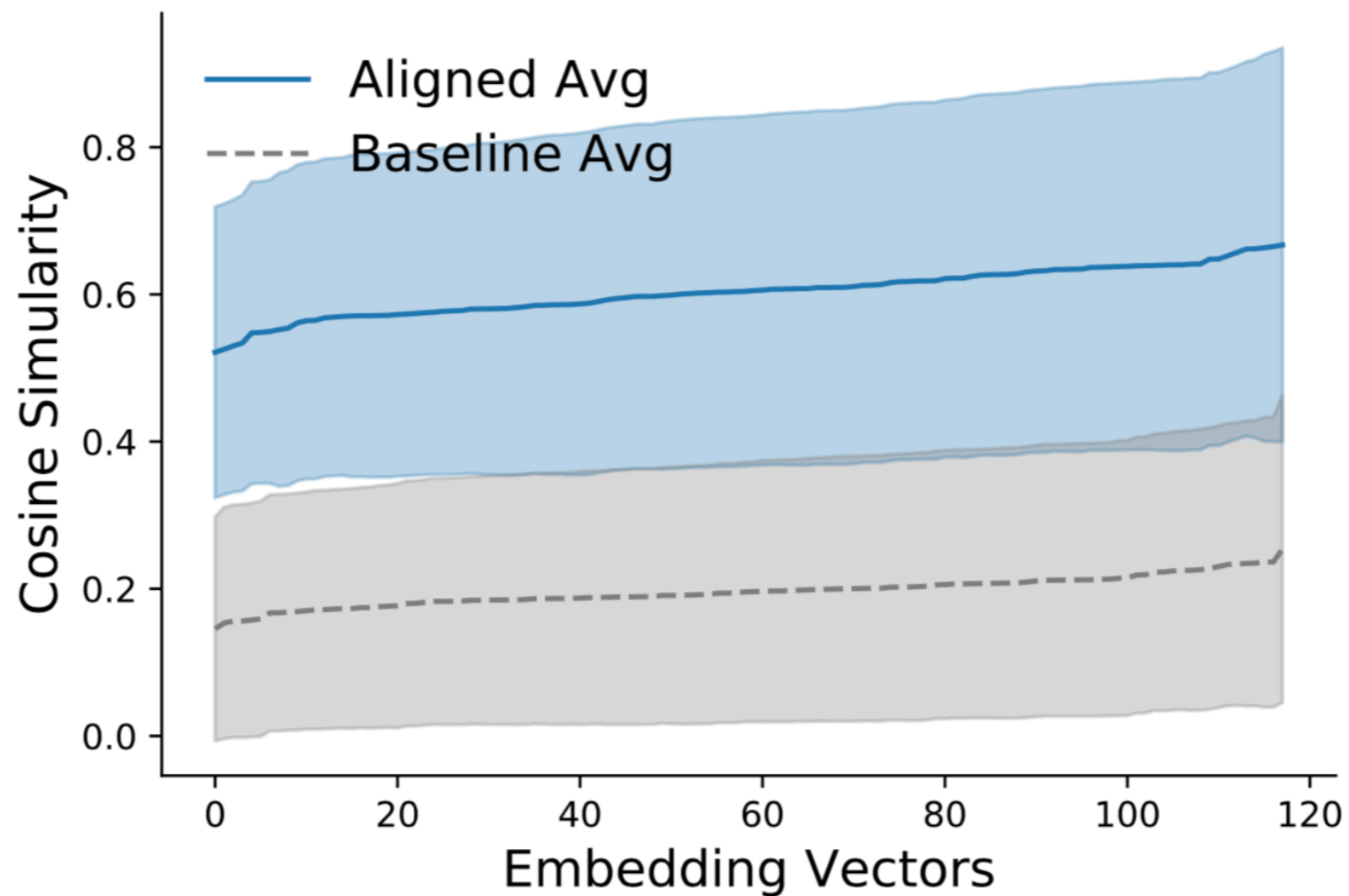
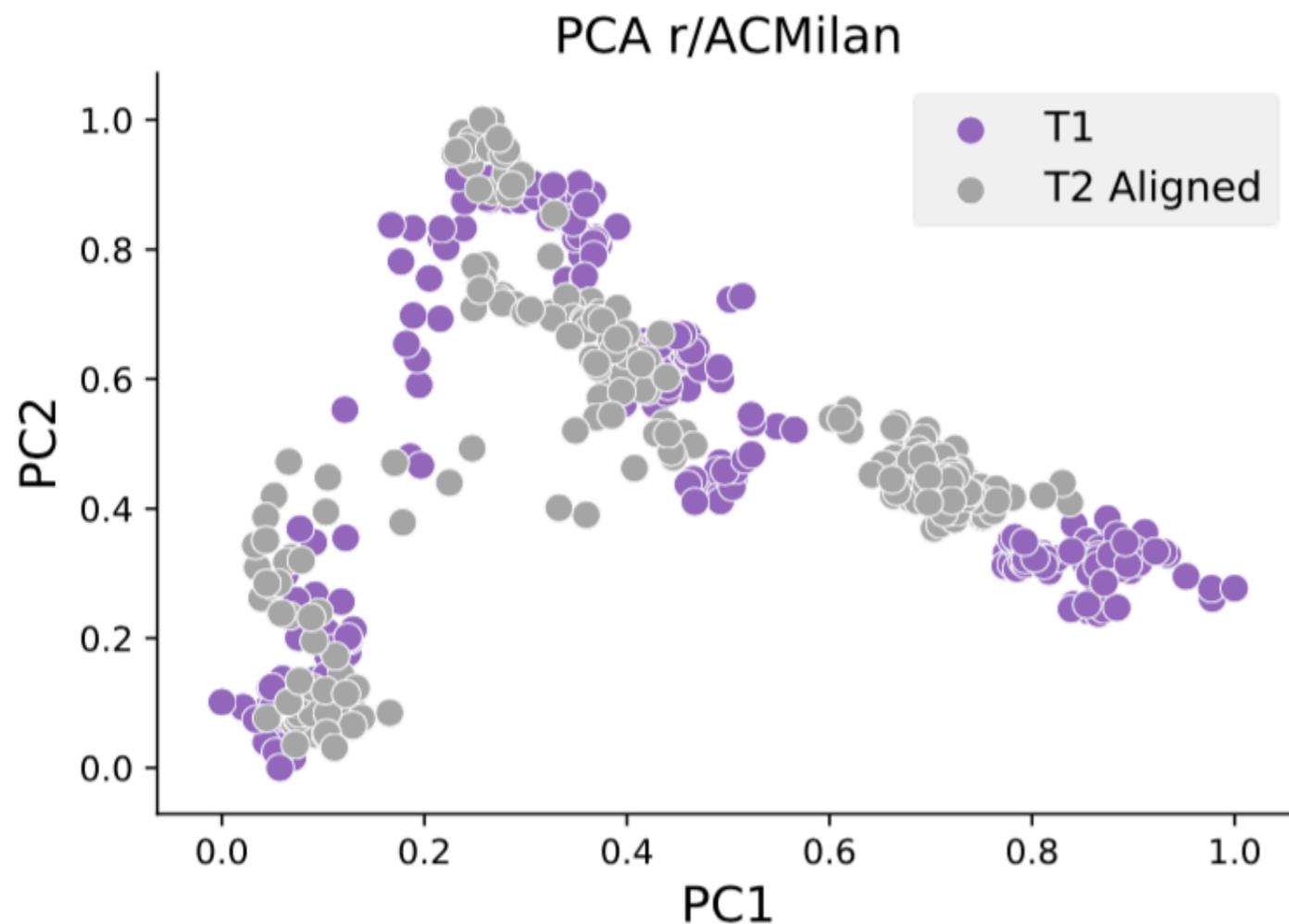


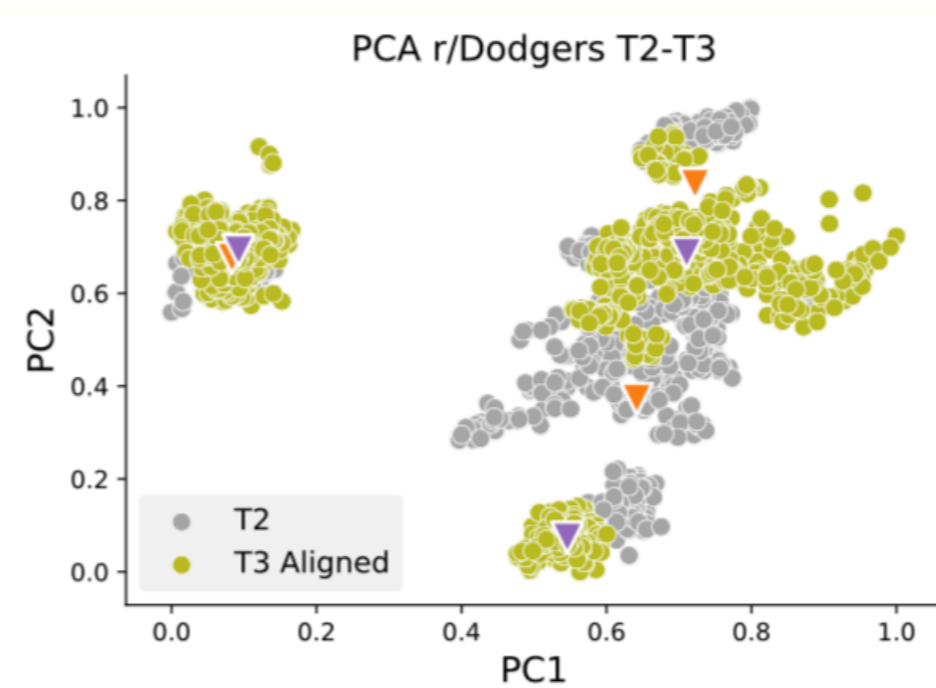
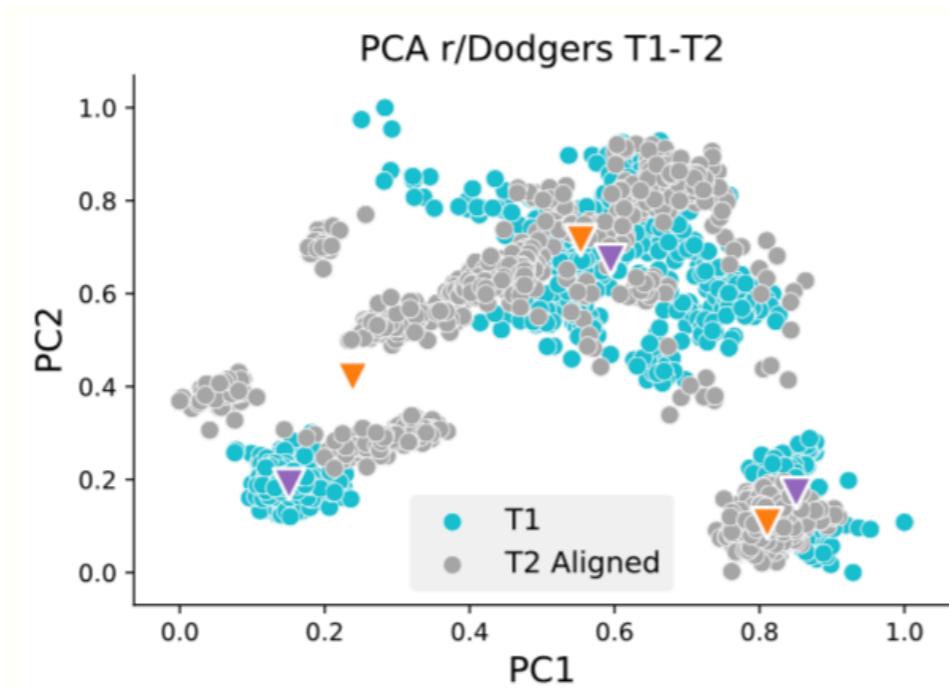
Figure 3: Cosine Similarity results for alignment evaluation.

Temporal Role Alignment - Community Roles

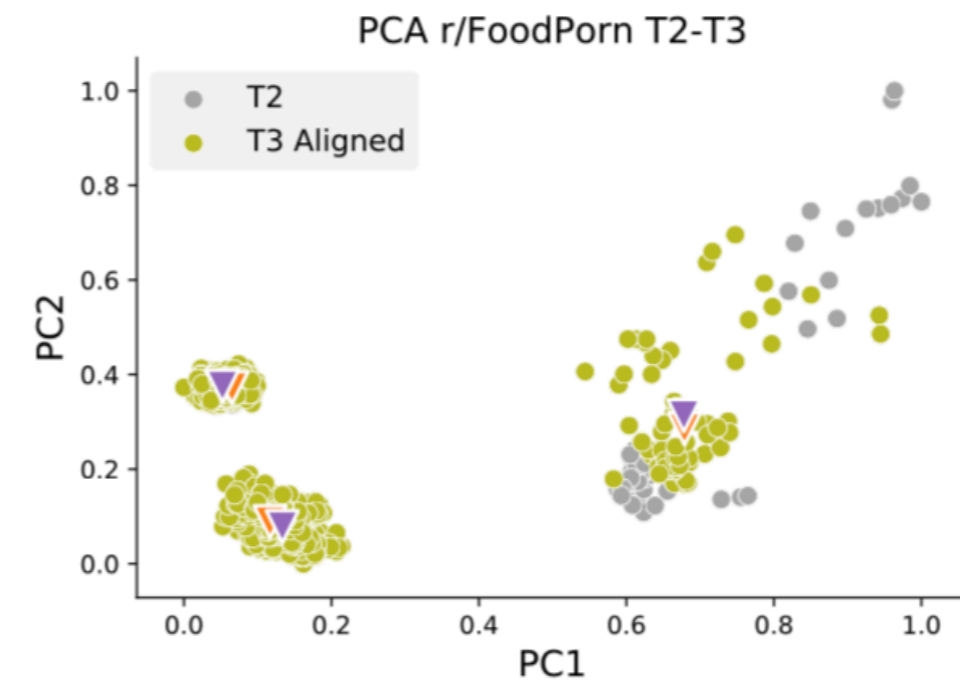
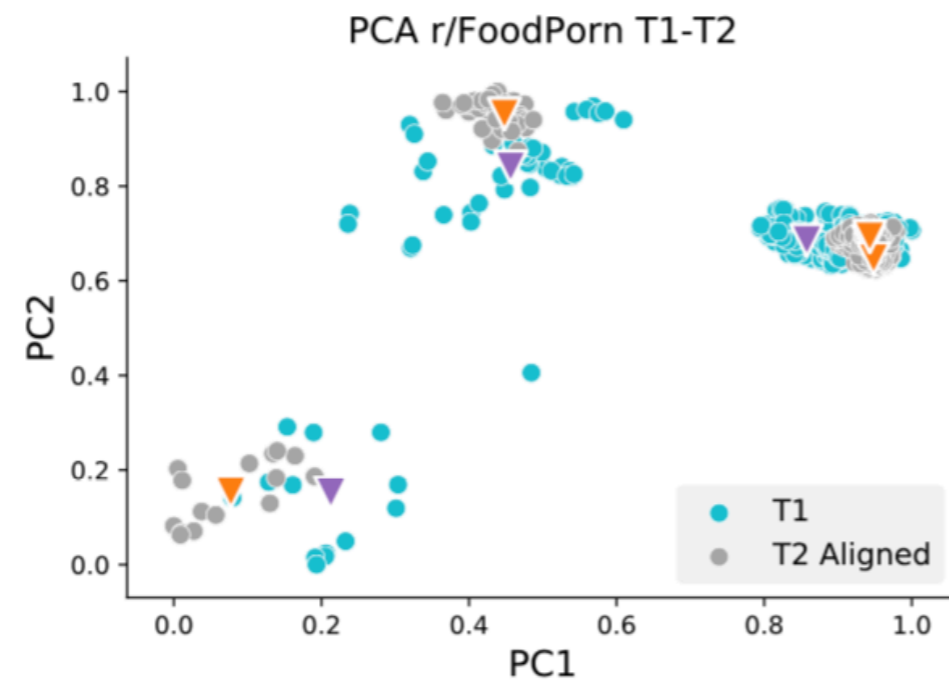


- PCA: (128D \rightarrow 2D)
- Cluster No: Elbow Method using Euclidean KMeans
- 1NN to record the Euclidean distance between the closest aligned centroids

(d) PCA Embeddings



Loyal

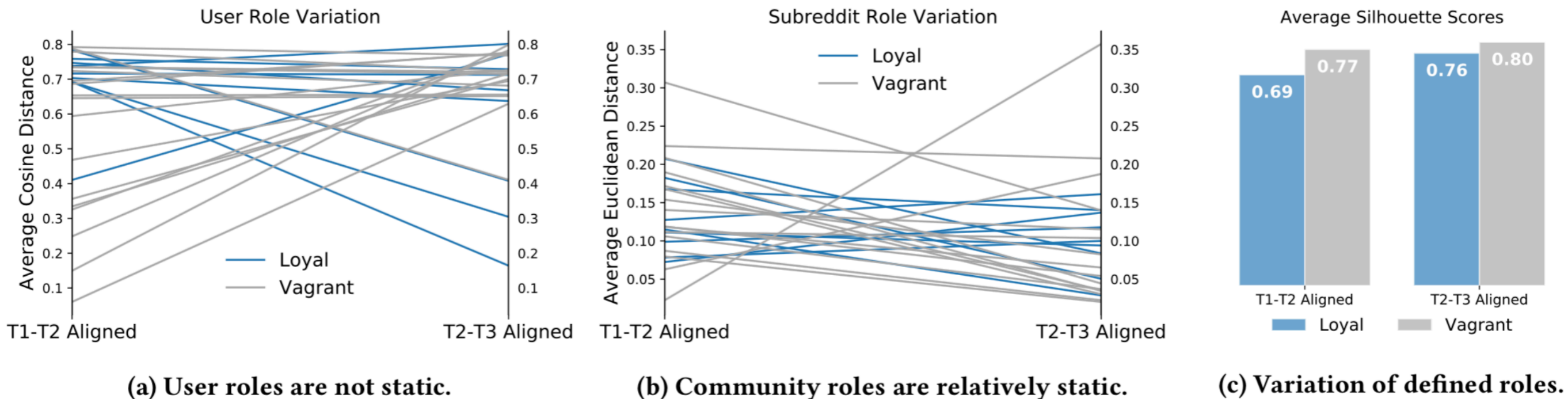


Vagrant

3

Results

Vagrant participants change roles to a greater extent than loyal participants



While loyal participants retain the same role over time in comparison to vagrant participants

Thank You!



Questions? Remarks? Suggestions?



I'm in Cambridge
until tomorrow morning



@siobhan_grayson