

Persistent Roles in Online Social Networks

ECML-PKDD 2016, M. Revelle, C. Domeniconi, and A. Johri

Persistent Roles in Online Social Networks

2017-01-24

Persistent Roles in Online Social Networks
ECML PKDD 2016, M. Revelle, C. Domeniconi, and A. Johri

Contents

1 Introduction

2 Methodology

3 Results

4 Conclusion

2017-01-24

Contents

- Introduction
- Methodology
- Results
- Conclusion

- Introduction
- Methodology
- Results
- Conclusion

Introduction

2017-01-24

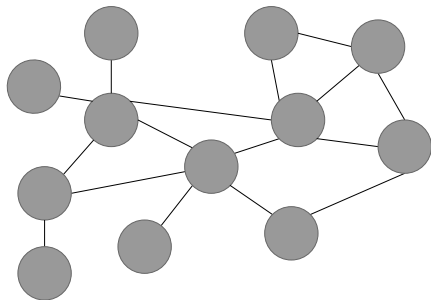
Persistent Roles in Online Social Networks

└ Introduction

Introduction

Social Network Analysis

The study of relationship between actors.

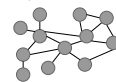


Persistent Roles in Online Social Networks

Introduction

Social Network Analysis

2017-01-24



Persistent roles should occur in any social network
Based on the structure of the network

2017-01-24

Persistent Roles in Online Social Networks

└ Introduction

Persistent roles should occur in any social network
Based on the structure of the network

Applications

graph mining
Targeted advertisement

Persistent Roles in Online Social Networks

2017-01-24

└ Introduction

└ Applications

Applications

graph mining
Targeted advertisement

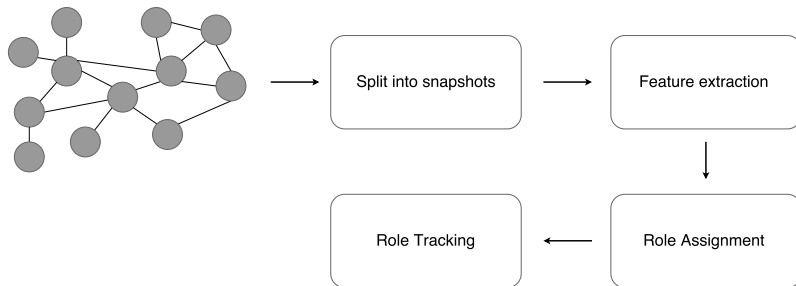
Methodology

2017-01-24

Persistent Roles in Online Social Networks
└─ Methodology

Methodology

The Approach



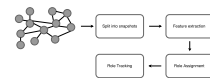
2017-01-24

Persistent Roles in Online Social Networks

Methodology

The Approach

The Approach



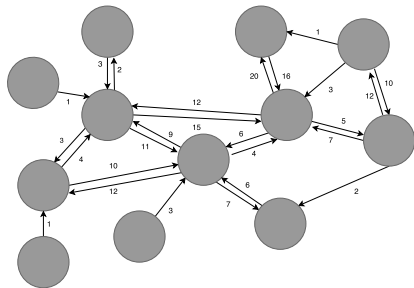
Feature-based approach

The Data

Datasets:

- Facebook - Wall posts from one user to another
- Scratch - Comments on uploaded programming projects

Directed, timestamps.



Persistent Roles in Online Social Networks

Methodology

The Data

2017-01-24

The Data

Datasets:
 • Facebook - Wall posts from one user to another
 • Scratch - Comments on uploaded programming projects
 Directed, timestamps.



Snapshot Split-up

The dataset is split into a total of 26 snapshots:

- 7 from facebook
- 19 from Scratch

Non-overlapping

Same length = observation window Ω .

Something with node interaction being smaller than Omega. (90th percentile?)

Persistent Roles in Online Social Networks

└─ Methodology

└─ Snapshot Split-up

2017-01-24

Snapshot Split-up

The dataset is split into a total of 26 snapshots:

- 7 from facebook
- 19 from Scratch

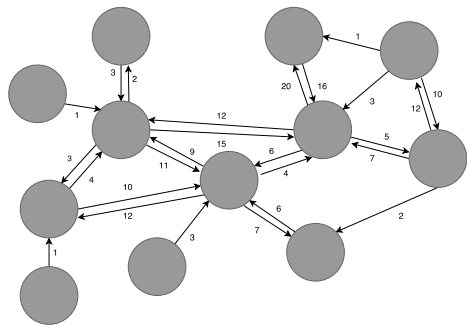
Non-overlapping

Same length = observation window Ω .

Something with node interaction being smaller than Omega. (90th percentile?)

Feature Selection

12 features based upon the graph.



In-degree
Out-degree
Weighted in-degree
Weighted out-degree
Reciprocity
New activity
Social strategy
Betweenness centrality
PageRank
Weighted PageRank
Transitivity
Weighted transitivity

Persistent Roles in Online Social Networks

2017-01-24

Methodology

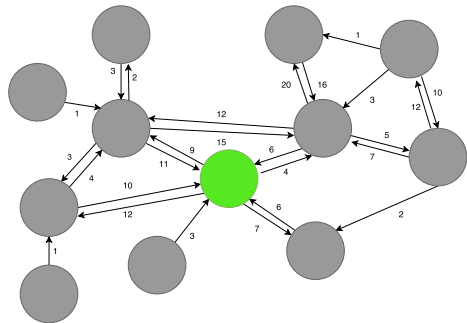
Feature Selection

Feature Selection

12 features based upon the graph.



Feature Example



In-degree	5
Out-degree	4
Weighted in-degree	36
Weighted out-degree	32
Reciprocity	4
New activity	0
Social strategy	0
Betweenness centrality	38.7
PageRank	0.21
Weighted PageRank	-
Transitivity	$\frac{1}{3}$
Weighted transitivity	-

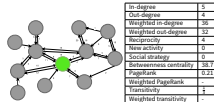
Persistent Roles in Online Social Networks

Methodology

Feature Example

2017-01-24

Feature Example

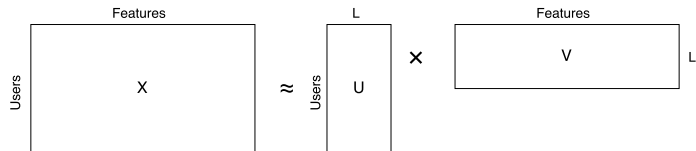


In-degree	5
Out-degree	4
Weighted in-degree	36
Weighted out-degree	32
Reciprocity	4
New activity	0
Social strategy	0
Betweenness centrality	38.7
PageRank	0.21
Weighted PageRank	-
Transitivity	$\frac{1}{3}$
Weighted transitivity	-

Role Discovery and Membership

Non-negative Matrix Factorization

$$X \approx UV$$



2017-01-24

Persistent Roles in Online Social Networks

Methodology

Role Discovery and Membership

Role Discovery and Membership



- Frobenius NMF updated with euclidean distance
- U and V are initialized with left and right matrix from nndsvd (Modified svd)

Selection of L

Root Mean Squared Error

$$RMSE = \sqrt{\frac{1}{|X|} \sum_{(u,f) \in X} (X_{u,f} - X'_{u,f})^2}$$

2017-01-24

Persistent Roles in Online Social Networks

Methodology

Selection of L

Selection of L

$$RMSE = \sqrt{\frac{1}{|X|} \sum_{(u,f) \in X} (X_{u,f} - X'_{u,f})^2}$$

Tracing Roles

The sim between snapshots.

2017-01-24

- Persistent Roles in Online Social Networks
 - Methodology
 - Tracing Roles

The sim between snapshots.

Results

2017-01-24

Persistent Roles in Online Social Networks

Results

Results

Persistent Roles

2017-01-24

Persistent Roles in Online Social Networks

Results

Persistent Roles

Persistent Roles

Role Transition

2017-01-24

Persistent Roles in Online Social Networks

└─ Results

└─ Role Transition

Conclusion

2017-01-24

Persistent Roles in Online Social Networks

└ Conclusion

Conclusion

Conclusion

2017-01-24

Persistent Roles in Online Social Networks

└ Conclusion

└ Conclusion

Conclusion

Shortcomings

They does not argue for their selection of features or give a reference to an article that does.
Number of snapshots.

2017-01-24

Persistent Roles in Online Social Networks

└ Conclusion

└ Shortcomings

Shortcomings

They does not argue for their selection of features or give a reference to an article that does.
Number of snapshots.