

IMPROVING RECOMMENDER SYSTEM NAVIGABILITY THROUGH DIVERSIFICATION

A CASE STUDY OF IMDB

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Florian Geigl

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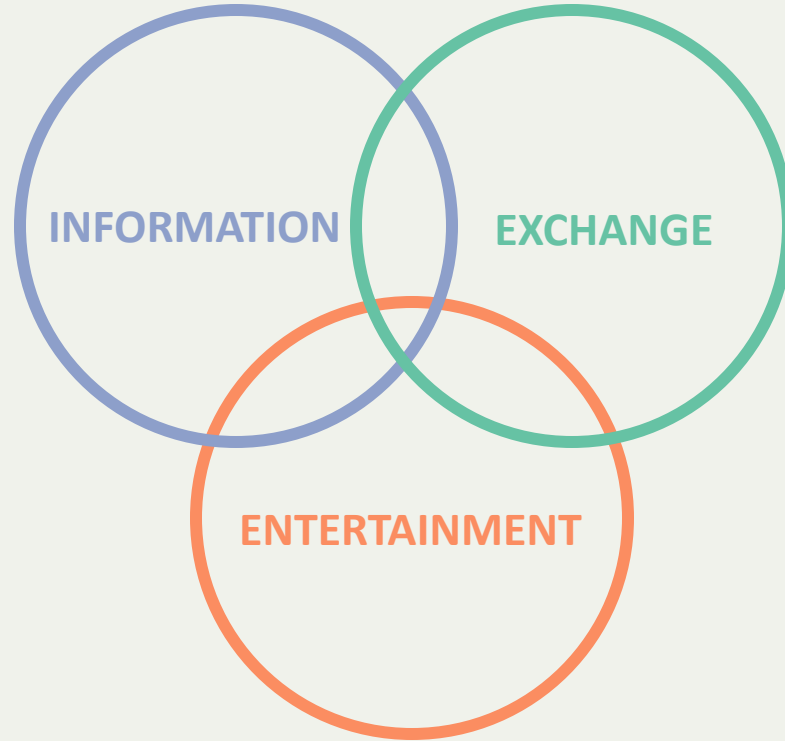
Denis Helic

Markus Strohmaier



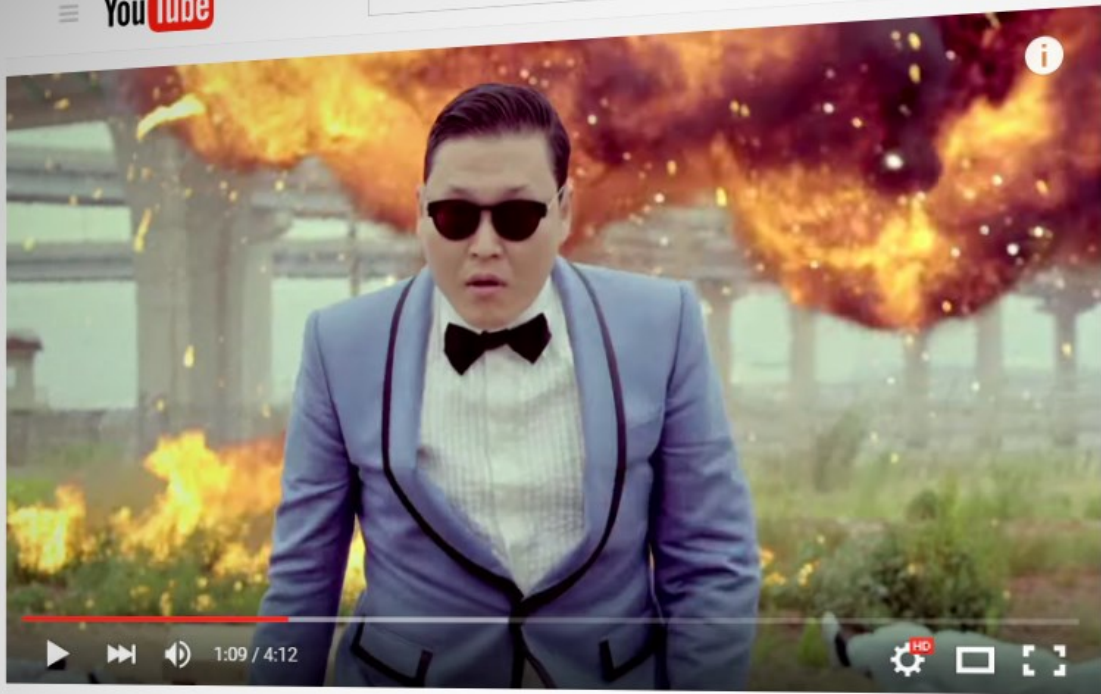
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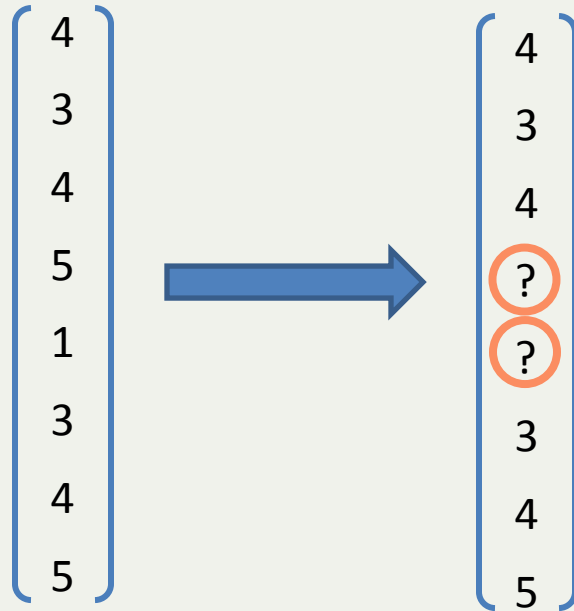
ZOMBIE PSY

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Recommendations serve to

- reduce information overload
- recommend matching items
- explore and consume content
- enable browsing
- help to discover novel content

Recommenders are evaluated
mainly with accuracy measures



Does accuracy evaluate all use cases?

reduce information overload

recommend matching items

explore and consume content

enable browsing

help to discover novel content

Does accuracy evaluate all use cases?

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The image shows the IMDb logo, which consists of the text "IMDb" in a bold, black, sans-serif font. The text is centered within a yellow rounded rectangle. This yellow rectangle is itself centered within a larger, dark gray rounded rectangle. The overall design is clean and modern.

IMDb

Back to the Future

People who liked this also liked...

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Back to the Future Part II (1989)

PG Adventure | Comedy | Sci-Fi

★★★★★★★★★★ 7,8/10

After visiting 2015, Marty McFly must repeat his visit to 1955 to prevent disastrous changes to 1985... without interfering with his first trip.

Director: Robert Zemeckis

Stars: Michael J. Fox, Christopher LL...

Recommenders of IMDb

Collaborative filtering (CF) recommendations:

based on „people who liked this also liked...“

169k titles

Content-based (CB) recommendations:

based on title, genres, actors, etc.

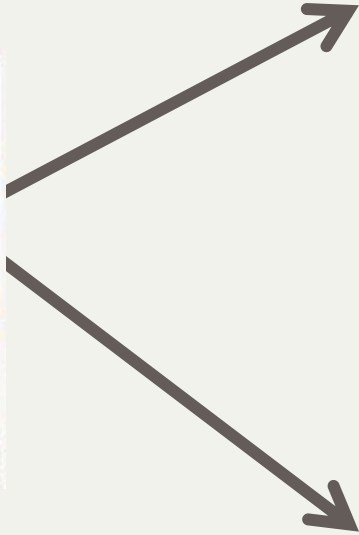
785k titles

Recommendation networks

Recommendation networks



Recommendation networks



Recommendation networks



Recommendation networks



Recommendation networks

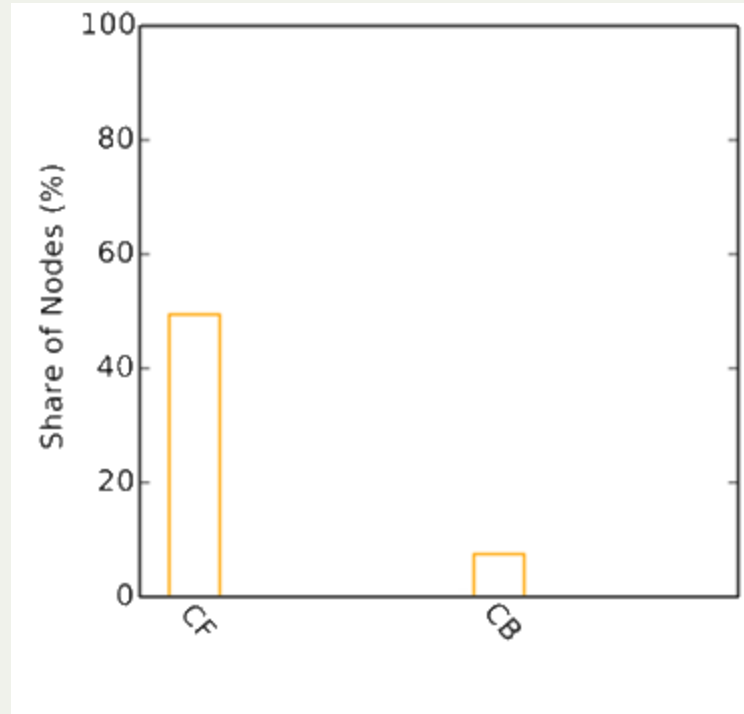


1. Reachability

2. Navigability

Largest network component

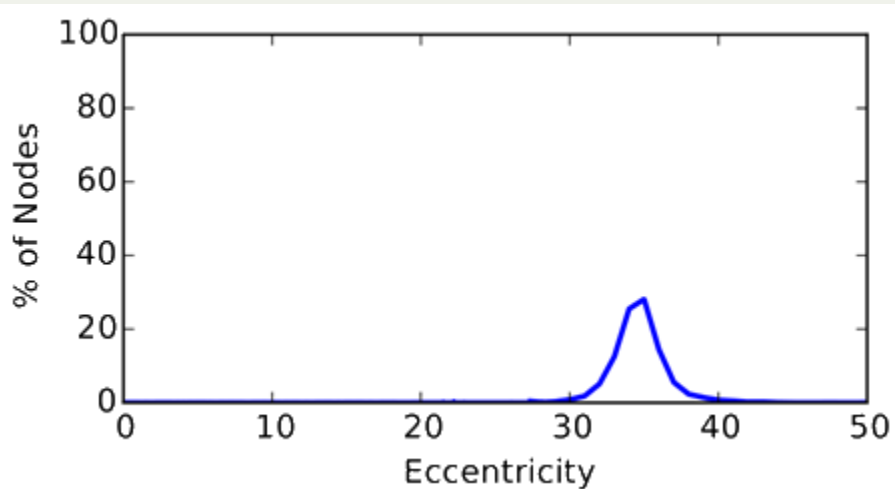
Largest network component



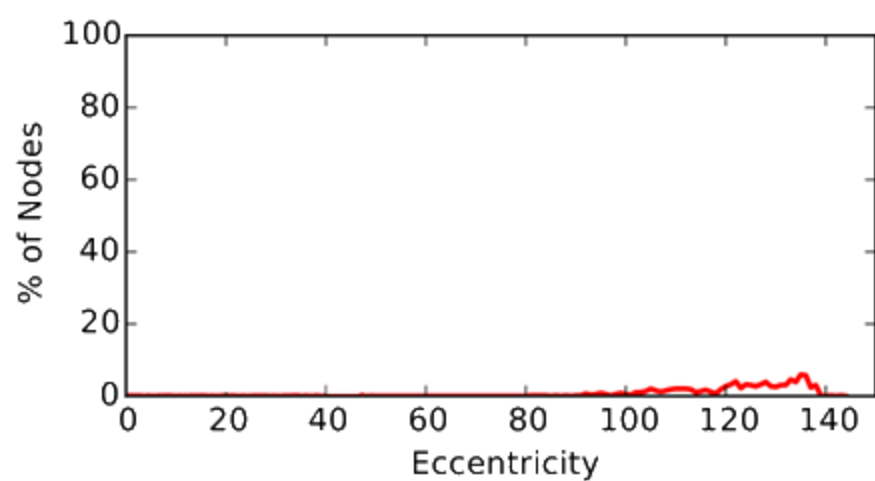
Eccentricity

Eccentricity

Collaborative Filtering



Content-based



Improvement through diversification

Improvement through diversification

1. Random

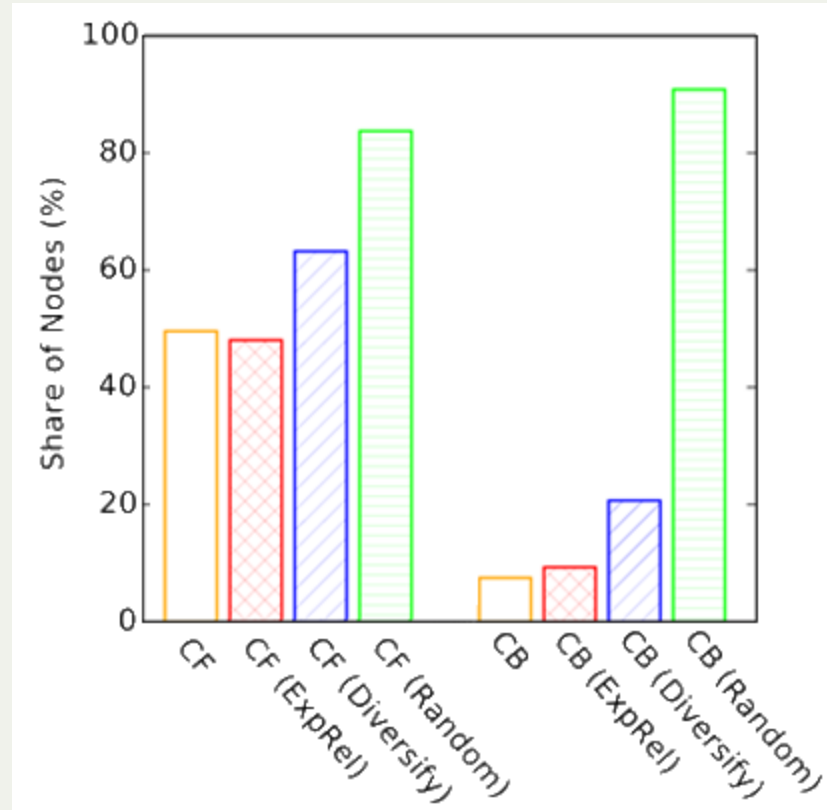
Improvement through diversification

1. **Random**
2. **Diversify**: minimize similarity to others
[Ziegler et al. 2005]

Improvement through diversification

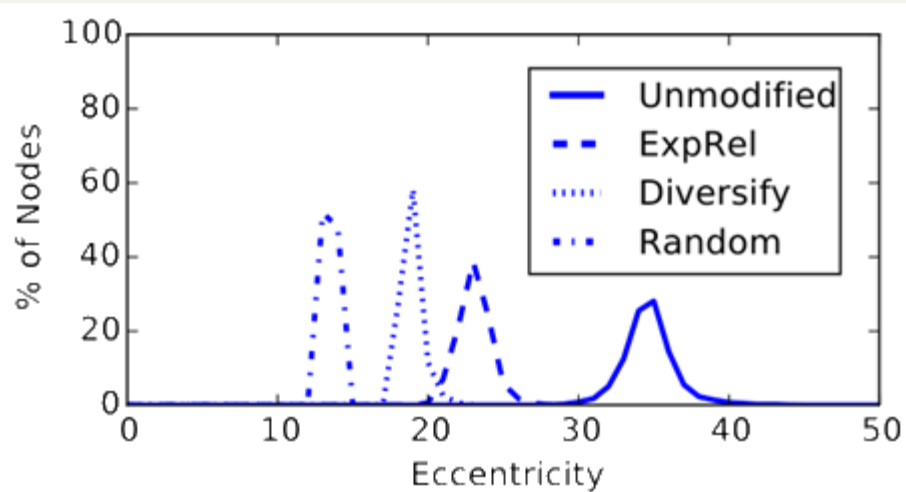
1. **Random**
2. **Diversify**: minimize similarity to others
[Ziegler et al. 2005]
3. **ExpRel**: maximize neighborhood size
[Küçüktunç et al. 2013]

Largest network component

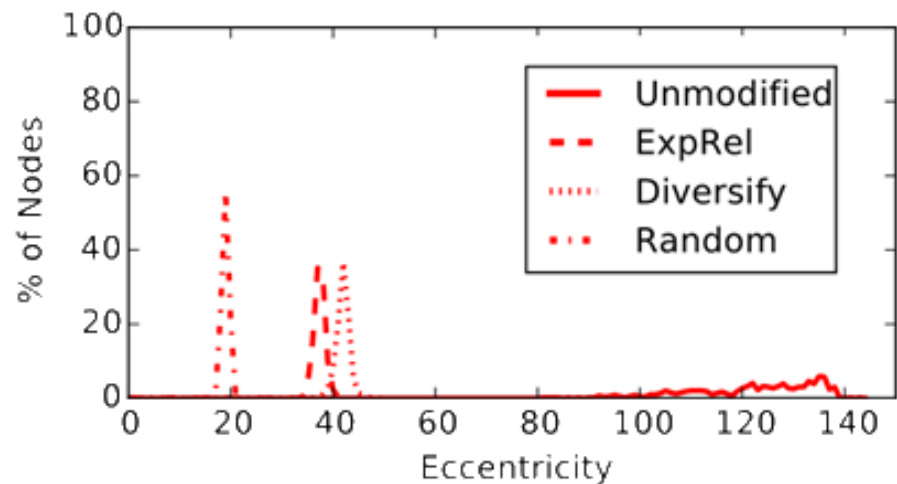


Eccentricity

Collaborative Filtering



Content-based



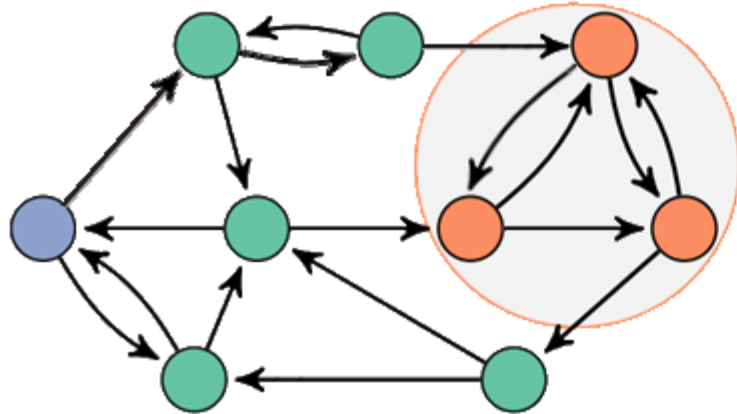
1. Reachability

2. Navigability

Navigability

How well do the networks fare in browsing scenarios?

Navigability



Start Node



Intermediate Node



Target Node

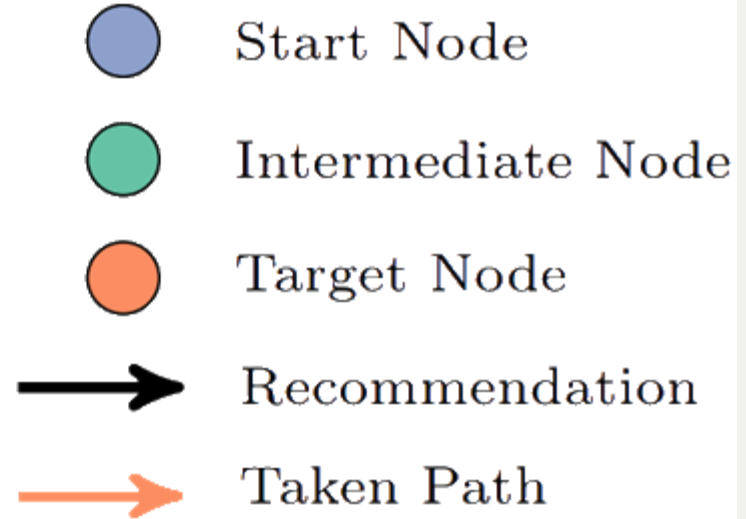
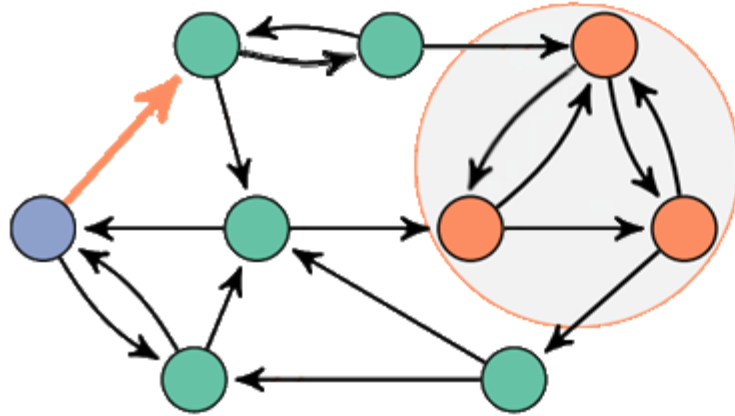


Recommendation

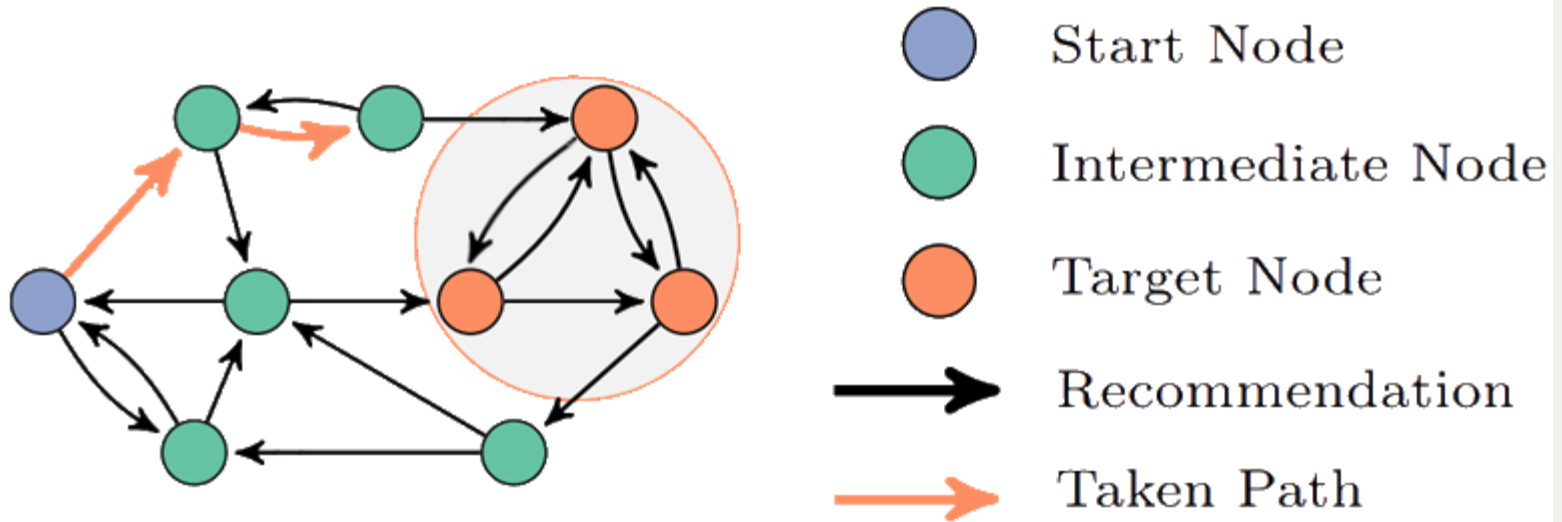


Taken Path

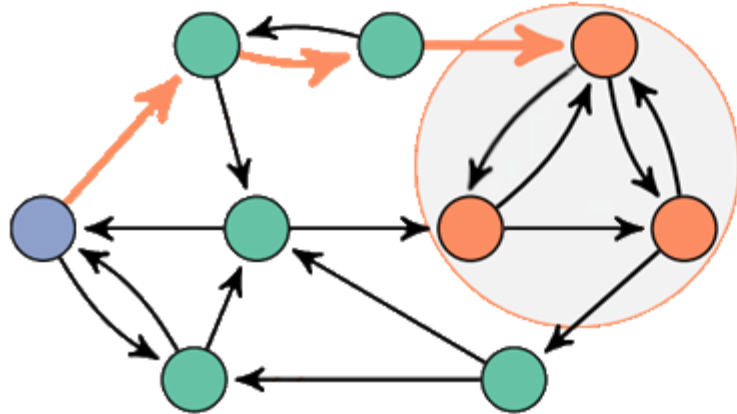
Navigability



Navigability



Navigability



Start Node



Intermediate Node



Target Node

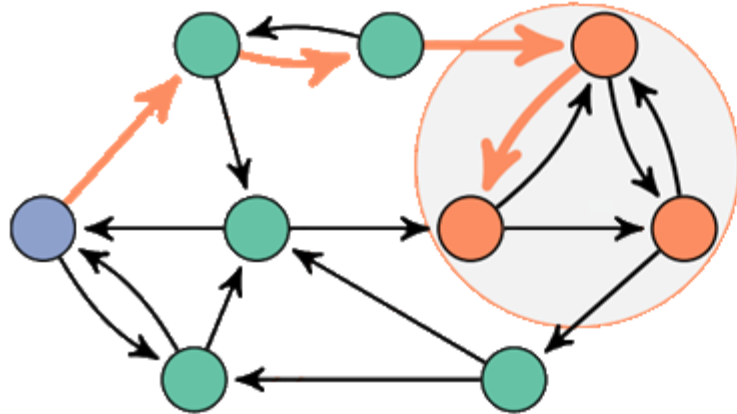


Recommendation



Taken Path

Navigability



Start Node



Intermediate Node



Target Node

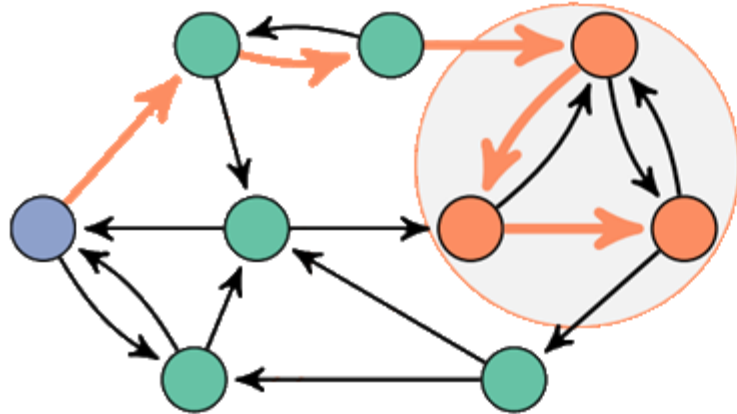


Recommendation



Taken Path

Navigability



Start Node



Intermediate Node



Target Node



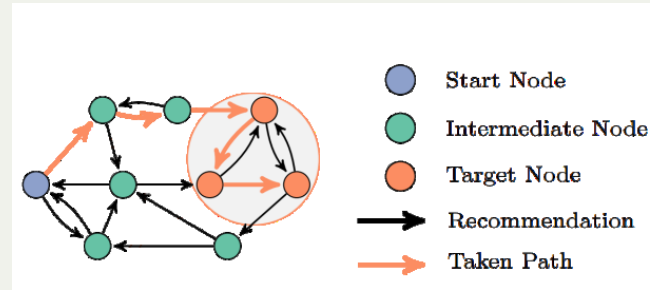
Recommendation



Taken Path

Navigability

Decentralized Search



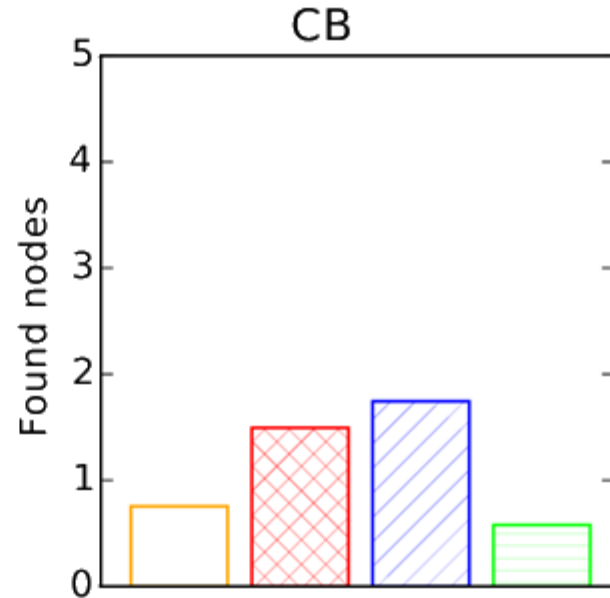
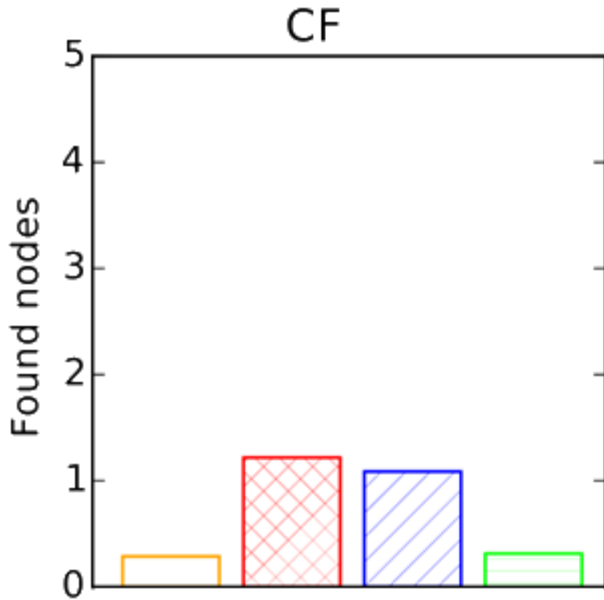
Start: random nodes in the largest component

Targets: IMDb genre top lists

Link selection: based on TF/IDF similarity to target

We simulate around 10k missions

Navigability

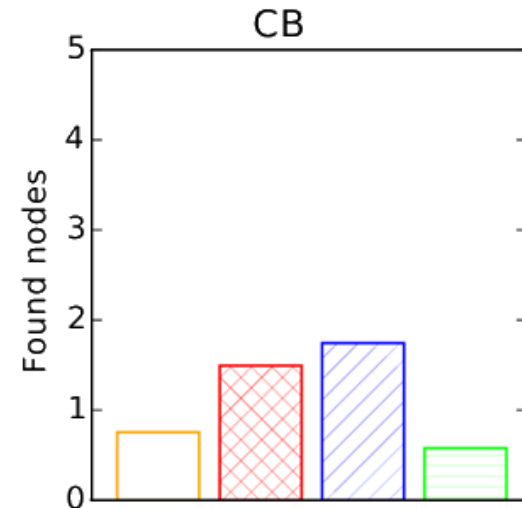
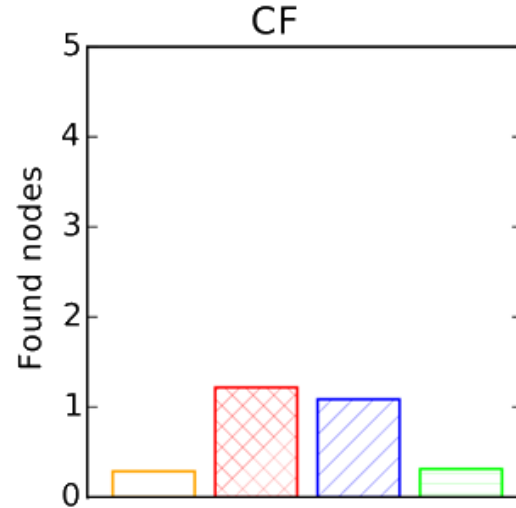
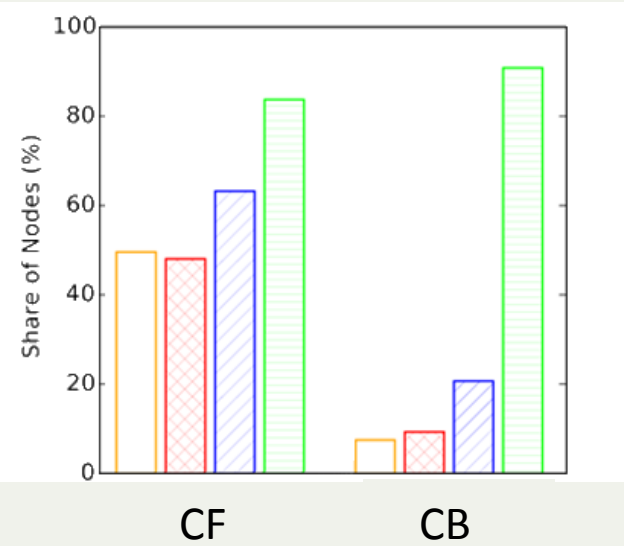


Legend:

- No Diversification (Yellow)
- ExpRel (Red cross-hatch)
- Diversify (Blue diagonal lines)
- Random (Green horizontal lines)

Navigability

Largest Component



Legend: No Diversification (orange), ExpRel (red cross-hatch), Diversify (blue diagonal lines), Random (green horizontal lines)

Wrap-up

- IMDb does not support explorative scenarios well
- Diversification improves **navigability & reachability**
- CF leads to a larger component, but poorer navigability
 - **trade-off** coverage & navigability
- Implement more advanced recommendation algorithms

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[1] <http://web.archive.org/web/19961103094738/http://dsiegel.com/balkanization/intro.html>

[2] Ziegler et al. Improving recommendation lists through topic diversification. WWW'05

[3] Küçüktunç et al. Diversified recommendation on graphs: pitfalls, measures, and algorithms. WWW'13