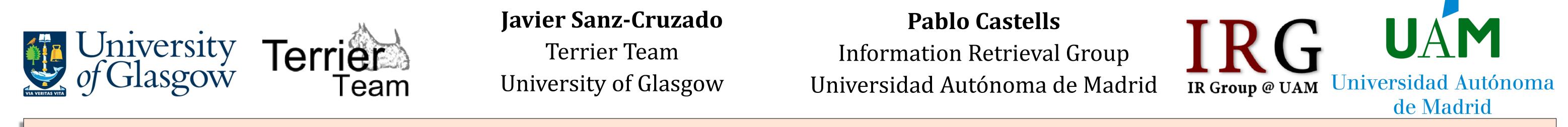
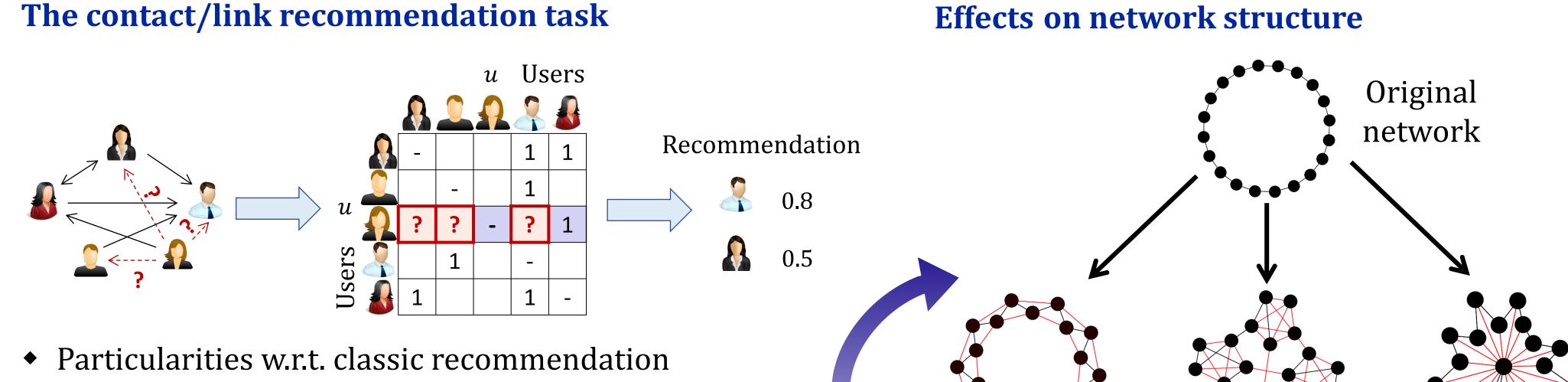
# **RELISON: A Framework for Link Recommendation in Social Networks**



**RELISON** is an **extensible** Java framework for running **link recommendation** experiments. It includes algorithms and metrics that

consider the **potential effect of recommendations** on the properties of social networks: **network structure** and **information diffusion** 



#### Why is it necessary? **Effects on network structure**

Algorithm 2

Algorithm 3

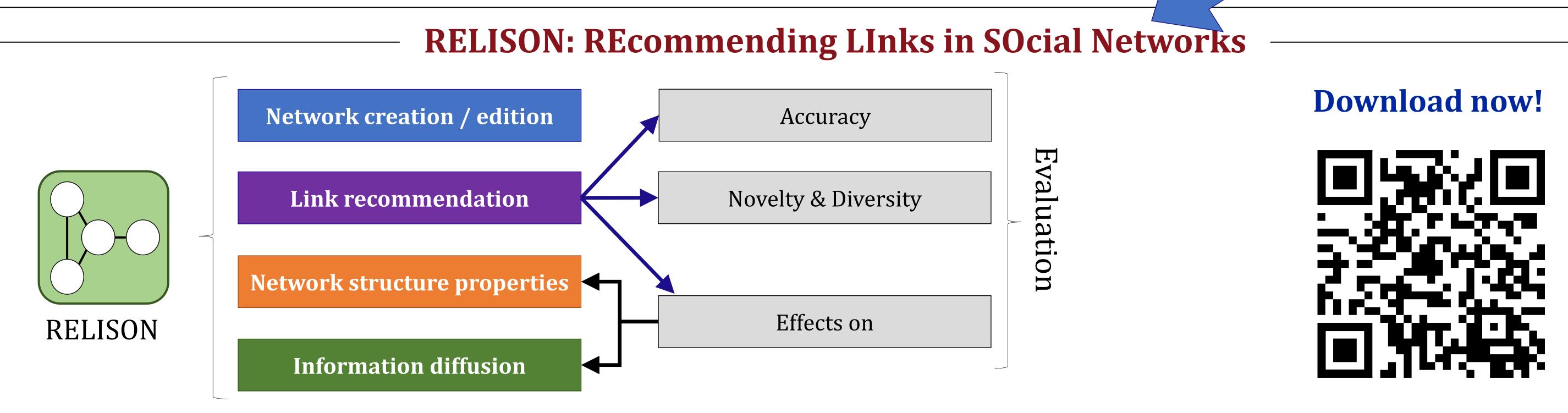
#### **Reproducibility in recommender systems**

- Challenges:
  - Different domains / data sources
  - Different evaluation metrics / tasks
- **Open-source** frameworks
  - Elliot, Lenskit, LibRec, MyMediaLite, Ranksys, Beta-Recsys, RecBole, DaisyRec...
  - General purpose recommendation

**There is NOT a framework** 

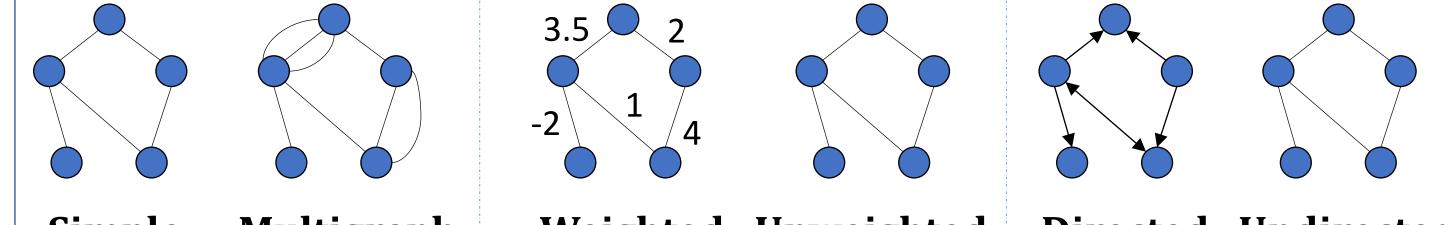
for contact recommendation!

- Items  $\subset$  Users
- Users are connected to each other (social network)
- Recommendations affect the network structure



Algorithm 1

| ſ | Top features   |  |  |  |  |  |
|---|--|--|--|--|--|--|
|   | Supported networks Link recommendation                     |  |  |  |  |  |
|   | <ul> <li>Contact recommendation functionalities</li> </ul> |  |  |  |  |  |



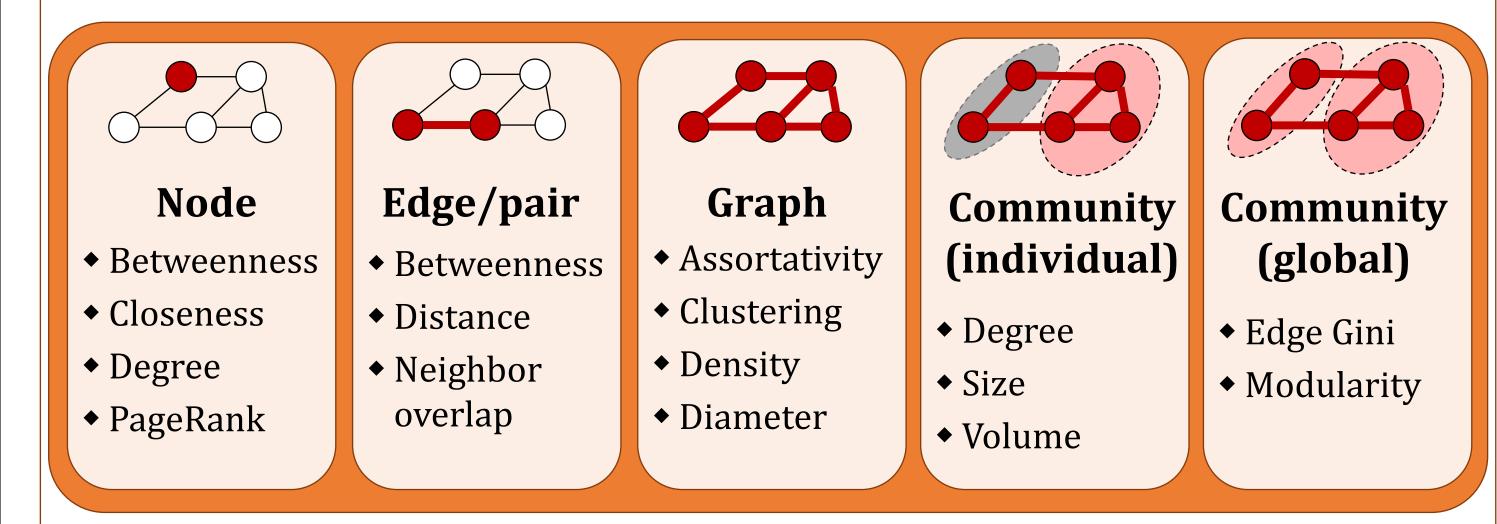
Multigraph Simple

Weighted Unweighted

**Directed Undirected** 

# **Social network analysis**

• Understanding structural properties of social networks • 50+ structural metrics, including



• Community detection and network partitions

• Built on top of RankSys

• **50+ algorithms** for people / contact / link recommendation, including

| Collaborative<br>filtering      | Common<br>neighbors             | Path-based<br>algorithms       | Random<br>walks                  | Other<br>algorithms              |
|---------------------------------|---------------------------------|--------------------------------|----------------------------------|----------------------------------|
| ◆ User kNN                      | <ul> <li>Adamic-Adar</li> </ul> | ◆ Distance                     | ◆ PageRank                       | <ul> <li>Twittomender</li> </ul> |
| ◆ Item kNN                      | <ul> <li>Cosine</li> </ul>      | ◆ Katz                         | ◆ HITS                           | <ul> <li>Supervised</li> </ul>   |
| <ul> <li>Implicit MF</li> </ul> | <ul> <li>Jaccard</li> </ul>     | <ul> <li>Local path</li> </ul> | ◆ Money                          | classifiers                      |
|                                 | <ul> <li>IR models</li> </ul>   | index                          | <ul> <li>Hitting time</li> </ul> | <ul> <li>LambdaMART</li> </ul>   |
|                                 |                                 |                                |                                  |                                  |

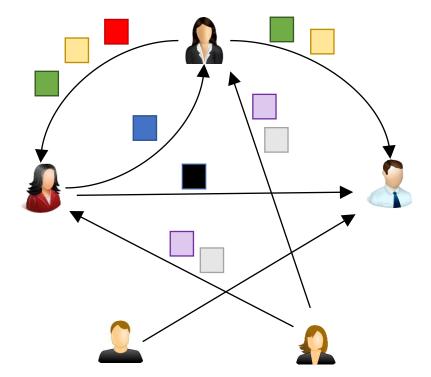
## • **Global reranking** (targeting structural properties)

- Basic implementations (metric agnostic)
- Optimized reranking (clustering coefficient, Gini-based community metrics)

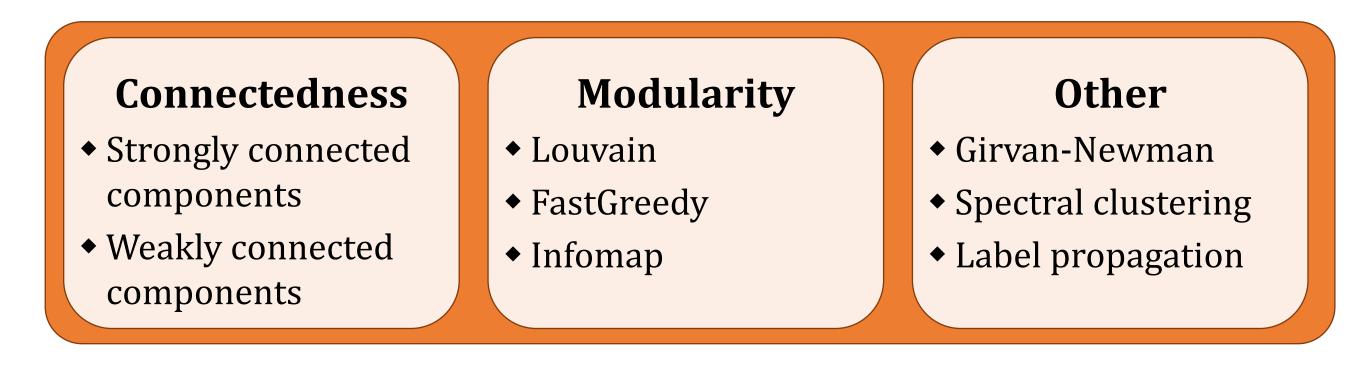
## • Also used for **link prediction**

## **Information diffusion**

- Simulation of the exchange of information in social networks
- Concurrent propagation of **multiple user-generated contents**
- Highly configurable



- - Automatic detection of clusters of tightly connected users
  - Measuring partition quality: modularity
- 8 algorithms



- Which contents do users propagate?
- Which users receive those contents?
- Which contents draw users' attention?
- Can users re-propagate information?
- How do they decide to re-propagate?
- Pre-configured simulation models provided
- Metrics for measuring diffusion
  - Speed
  - Information novelty and diversity



