

# Serendipitous Recommendation for Scholarly Papers Considering Relations Among Researchers

**Kazunari Sugiyama,**



**Min-Yen Kan**

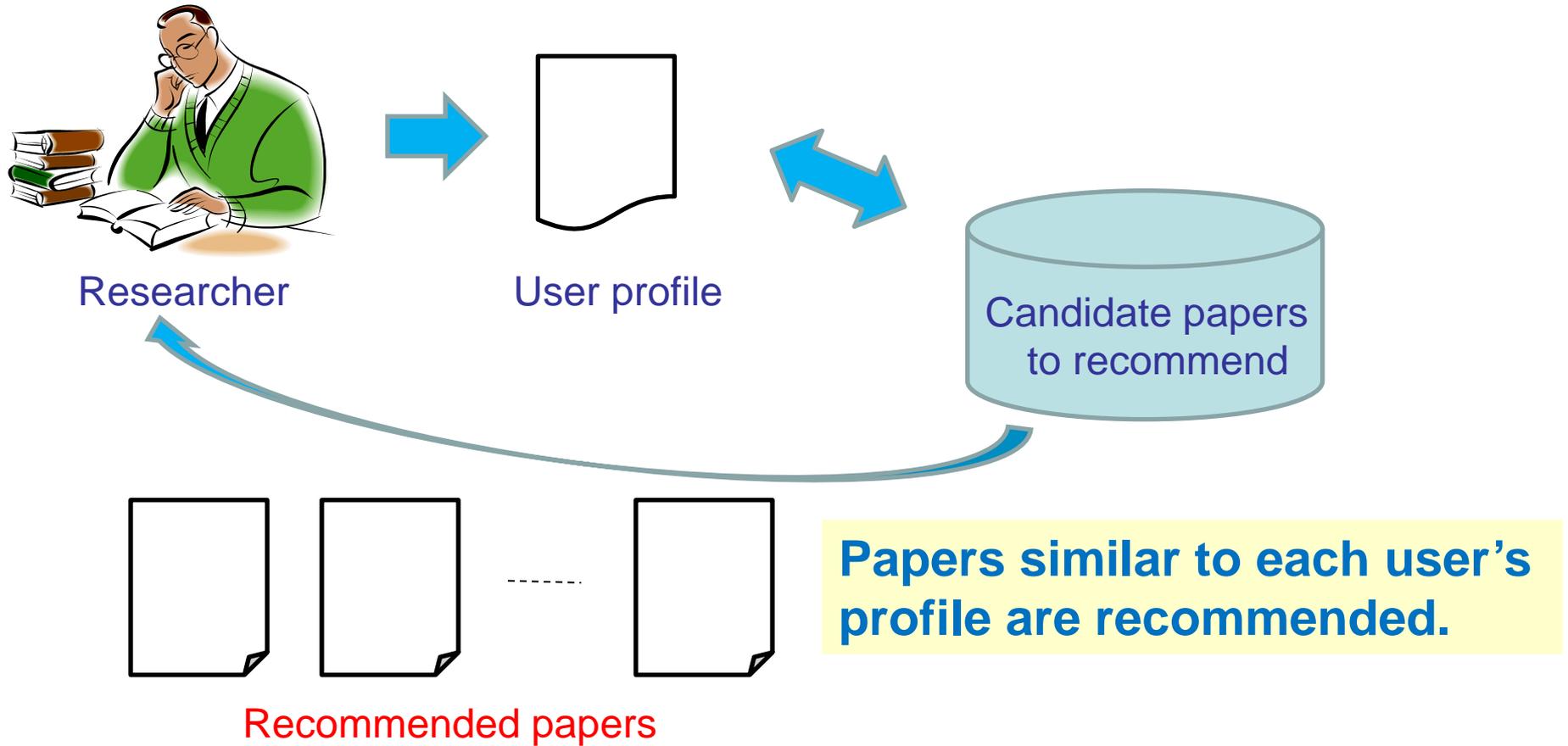


**National University of Singapore**



# Introduction

## Content-based Recommendation



# Introduction

[Sugiyama and Kan, JCDL'10]



Publication list

[No published papers  
in the past]

('11)



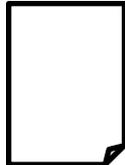
**Broaden their range of  
research interests.**

Junior researcher (having only one recently published paper)

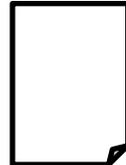


Publication list

('01)



('02)



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('11)



**Seek to apply their  
knowledge towards  
other areas.**

Senior researcher (having several past published papers)

**Serendipitous recommendation is important.**

# Introduction

When we find something serendipitous?

Advice from colleagues



**Serendipitous discovery:**  
Interactions with others  
play an important role.

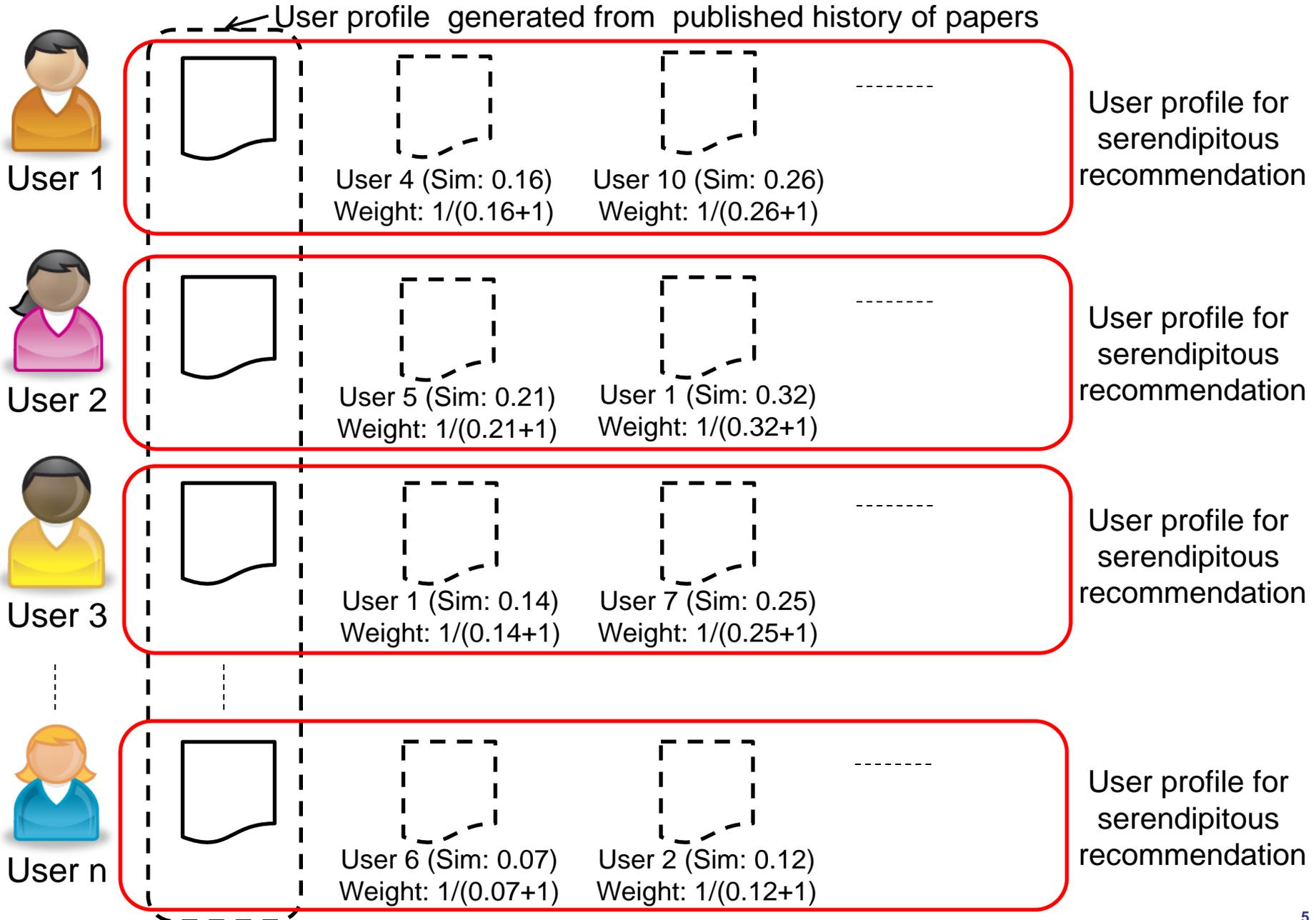
Attend seminars



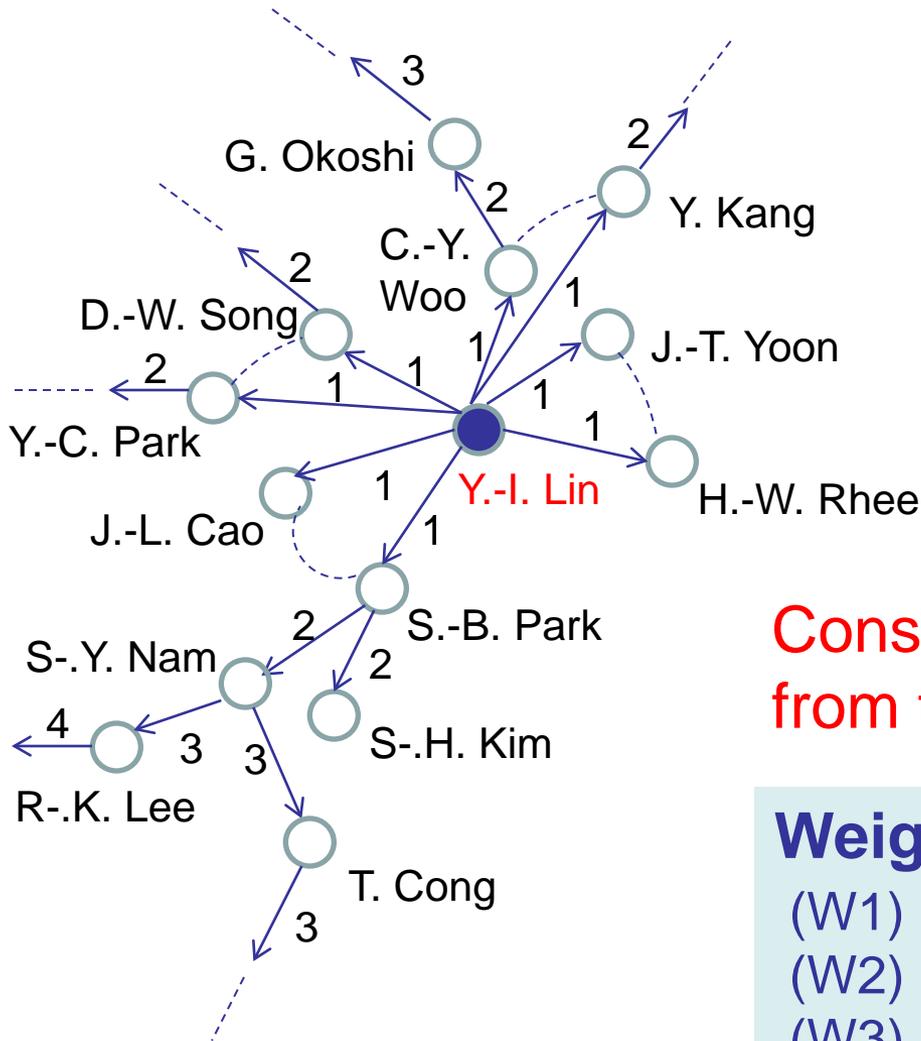
**User profile construction**  
for serendipitous  
recommendation with others

- I. Dissimilar users
- II. Co-author network

# User Profile Construction via Dissimilar Users (DU)



# User Profile Construction via Co-author Network (CAN)

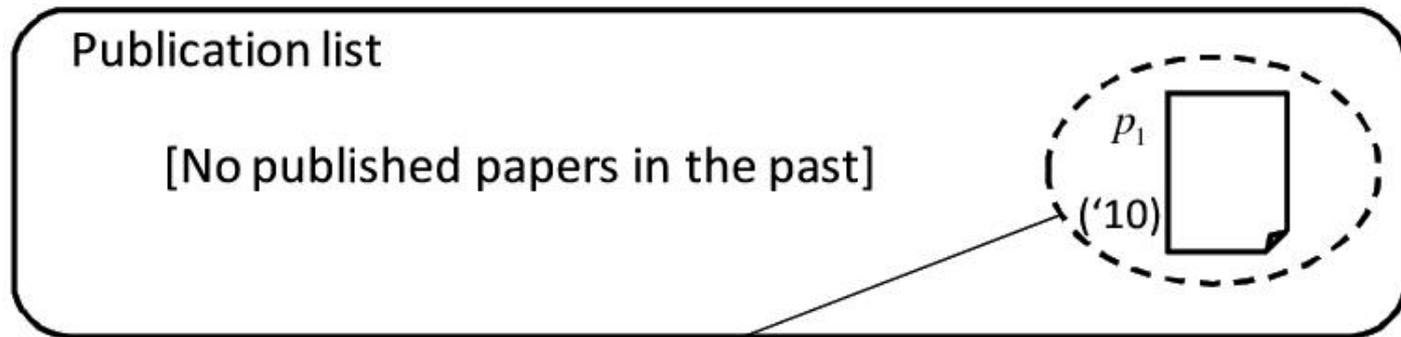


Consider only radial network from the target researcher, “Y.I. Lin”

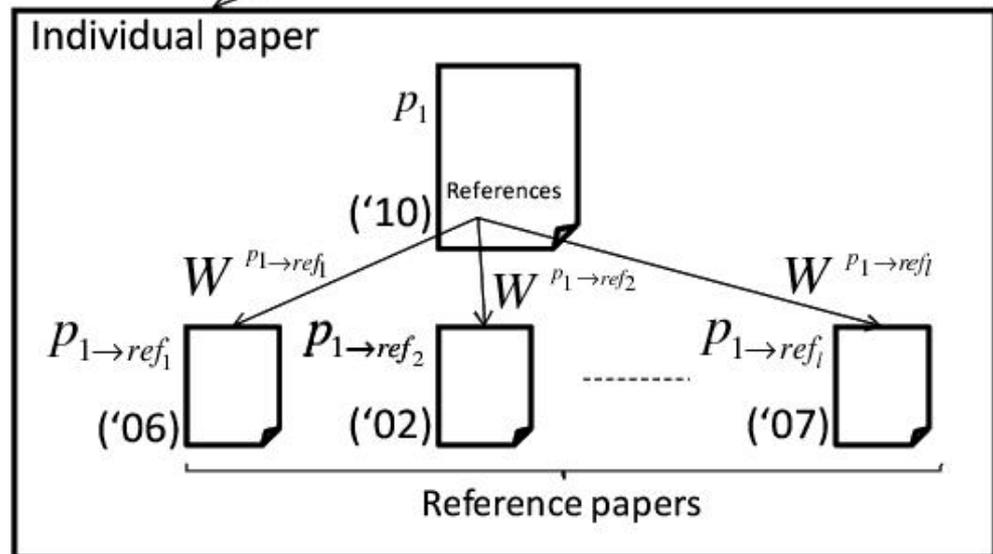
## Weighting scheme

- (W1) Linear Combination (LC)
- (W2) Reciprocal of Path Length (RCP-PL)
- (W3) Reciprocal of Similarity (RCP-SIM)
- (W4) Product of W2 and W3 (RCP-PLSIM)

# Basic User Profile Construction (Junior Researchers)



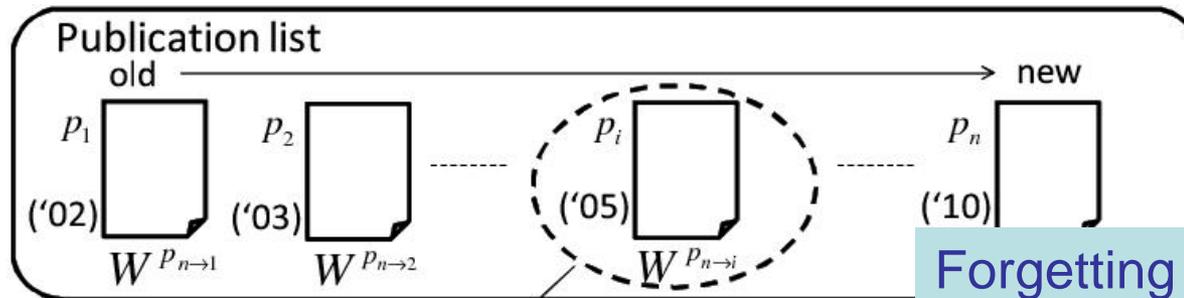
Relation between  
reference papers  
and  $P_1$



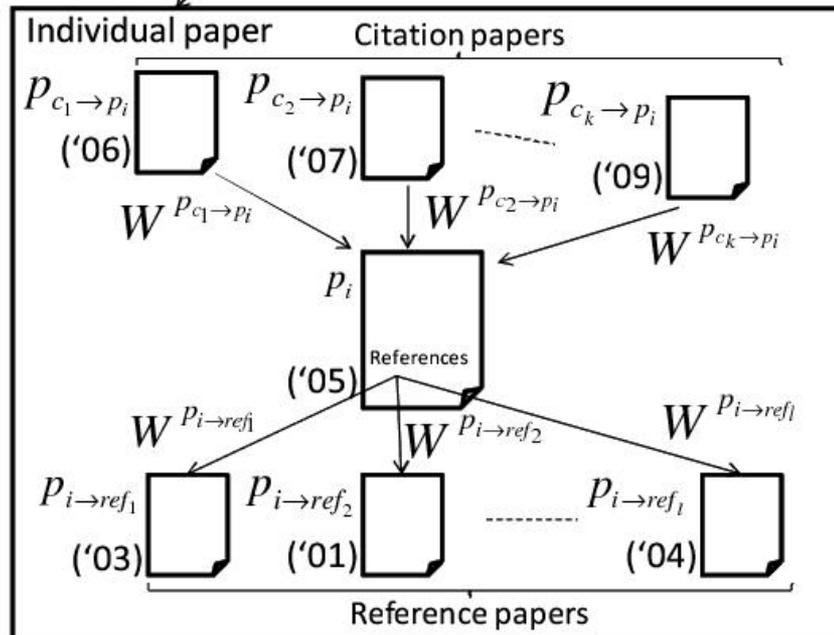
## Weighting scheme

- Linear combination
- Cosine similarity
- Reciprocal of published year

# Basic User Profile Construction (Senior Researchers)



Relation between citation or reference papers and  $P_i$



## Weighting scheme

- Linear combination
- Cosine similarity
- Reciprocal of published year

# Experiments

## Experimental Data

- **Researchers**

- 15 junior researchers
- 13 senior researchers

**NLP and IR researchers who have publication lists in DBLP**

- **Candidate Papers to Recommend**

ACL Anthology Reference Corpus [Bird et al., LREC'08]

**Includes information about citation and reference papers**

## Evaluation Measure

- Normalized Item Novelty (nITN@10)

# Normalized Item Novelty

Item novelty (*ITN*) [Zhang and Hurley, RecSys'08]

$$ITN = \frac{1}{N} \sum_{j=1}^N d(\mathbf{P}_u^{srdp}, \mathbf{F}^{P_{rec j}})$$

Monotone increasing

$\mathbf{P}_u^{srdp}$  : User profile

$\mathbf{F}^{P_{rec j}}$  : Feature vector of the candidate paper to recommend

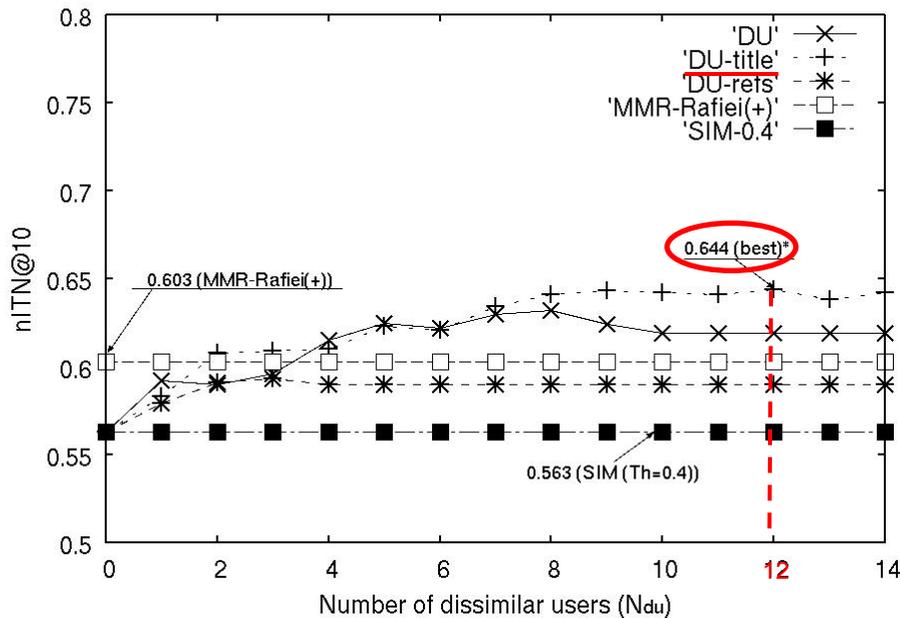
## Normalized item novelty (*nITN*)

$$nITN = \frac{1}{N} \sum_{j=1}^N \frac{d(\mathbf{P}_u^{srdp}, \mathbf{F}^{P_{rec j}})}{\max d(\mathbf{P}_u^{srdp}, \mathbf{F}^{P_{rec j}})}$$

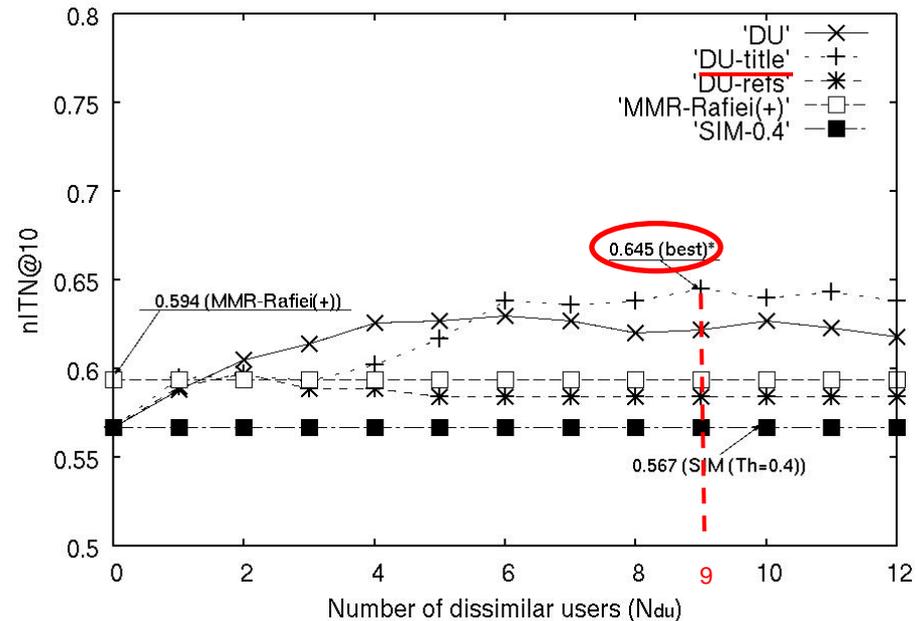
Avoid monotone increasing

# Results with Dissimilar Users (DU)

[Item novelty @ 10]



[Junior researchers]

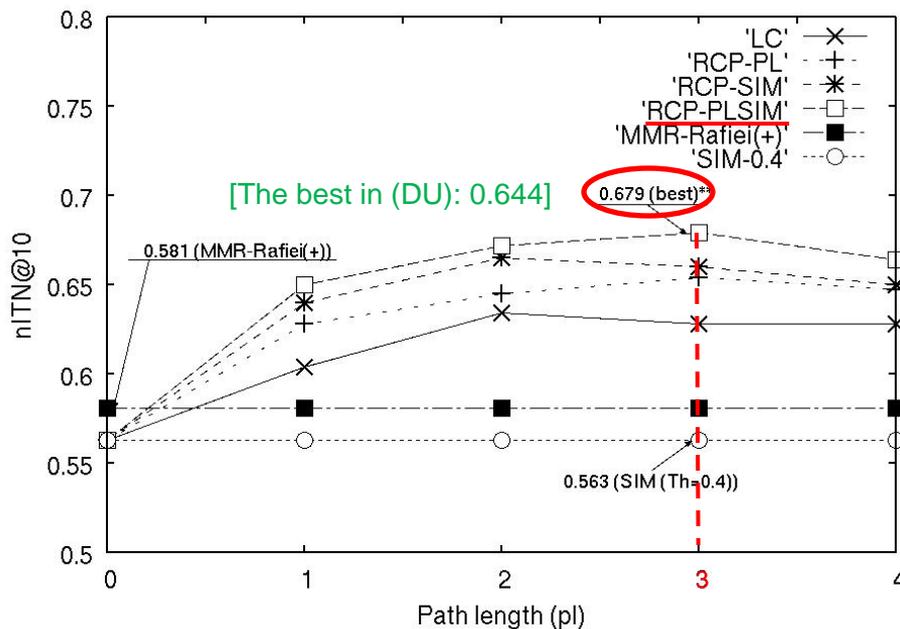


[Senior researchers]

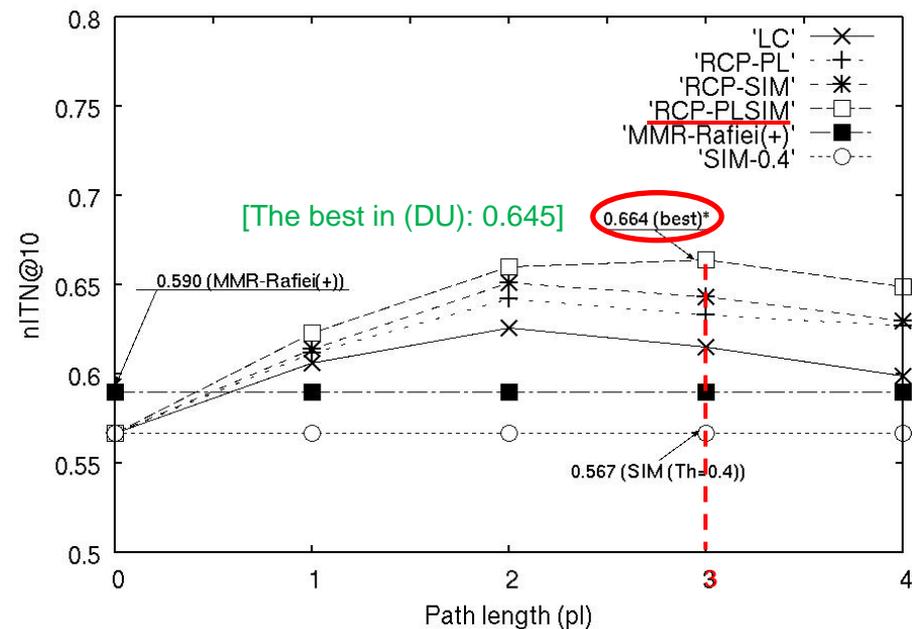
User profiles that contain a variety of topics can be constructed by using more dissimilar users.

# Results with the Co-author Network (CAN)

[Item novelty @ 10]



[Junior researchers]



[Senior researchers]

(CAN) is more effective approach to constructing user profile for serendipitous recommendation rather than (DU).

# Examples of Serendipitous Recommendation

	Recommended topics
<b>Junior researcher</b> (Major research topic: discourse analysis)	<ul style="list-style-type: none"><li>• Noun phrase chunking</li><li>• Collocation</li><li>• Term Recognition</li></ul>
<b>Senior researcher</b> (Major research topic: sentiment analysis)	<ul style="list-style-type: none"><li>• Knowledge acquisition</li><li>• Relation extraction in named entities</li><li>• Relation extraction in <u>biomedical text</u></li></ul>

**It is highly possible that he can discover something new and helpful.**

## Conclusion

- Propose constructing user profile for serendipitous recommendation that considers relations among researchers
  - Dissimilar users
  - Co-author network
- Observe serendipitous nature of the recommendation

## Future Work

- Construct user profile that provides highly accurate recommendation of serendipitous papers
- Expand the kinds of candidate papers to recommend

***Thank you very much!***