

# Web User Profiling using Data Redundancy

http://aminer.org/profiling

Xiaotao Gu, Hong Yang, Jie Tang, Jing Zhang

**Tsinghua University** 





# Web User Profiling using Data Redundancy

- Introduction
- Traditional Way
- Basic Idea
- MagicFG
- Experiments
- Conclusion







Overview

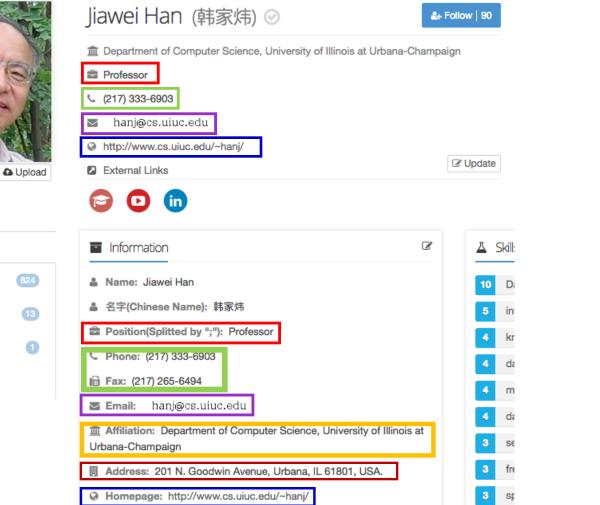
Papers

Lectures

Patents

Merge

0









# Web User Profiling using Data Redundancy

- Introduction
- Traditional Way
- Basic Idea
- MagicFG
- Experiments
- Conclusion





- Source Finding
- Extraction

Googe jiawei han

All Images Videos Books News More - Search tools

About 281,000 results (0.54 seconds)

#### Jiawei Han

hanj.cs.illinois.edu/ -Jiawei Han. Abel Bliss Professor, Department of Computer Science · Univ. of Illinois at Urbana-Champaign · Rm 2132, Siebel Center for Computer Science

#### Jiawei Han - Google Scholar Citations

https://scholar.google.com/citations?user=Kv9AbjMAAAAJ ▼ Abel Bliss Professor of Computer Science, University of Illinois - cs.uiuc.edu Mining frequent patterns without candidate generation: A frequent-pattern tree approach. J Han, J Pei, Y Yin, R Mac. Data mining and knowledge discovery 8 (1) ...



### Jiawei Han

Abel Bliss Professor, <u>Department of Computer Science</u> <u>Univ. of Illinois at Urbana-Champaign</u> <u>Rm 2132, Siebel Center for Computer Science</u> 201 N. Goodwin Avenue Urbana, IL 61801, USA E-mail: hanj[at]cs.uiuc.edu

Ph.D. (1985), Computer Science, Univ. Wisconsin-Madison

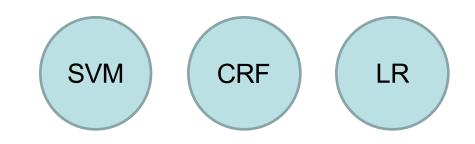
#### **Knowledge Discovery and Data Mining**

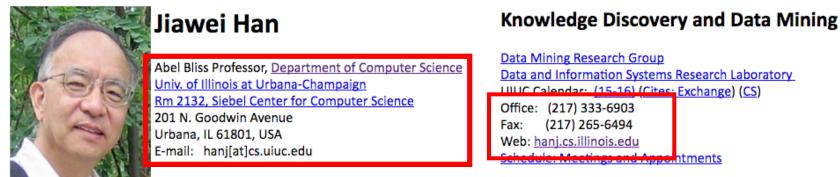
Data Mining Research Group Data and Information Systems Research Laboratory UIUC Calendar: (15-16) (Cites: Exchange) (CS) Office: (217) 333-6903 Fax: (217) 265-6494 Web: hanj.cs.illinois.edu Schedule: Meetings and Appointments

> () Tinghua University



- Source Finding
- Extraction





Ph.D. (1985), Computer Science, Univ. Wisconsin-Madison

Current Research (Selected Publications)



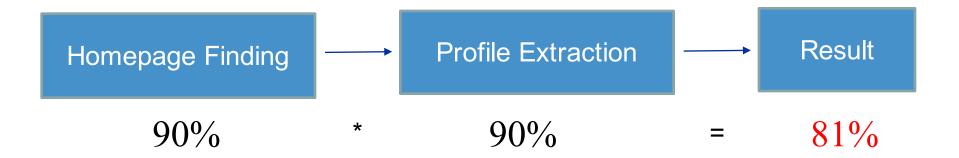


- Low Recall single data source
- Low Precision error propagation





- Low Recall single data source
- Low Precision error propagation







# Web User Profiling using Data Redundancy

- Introduction
- Traditional Way
- Basic Idea
- MagicFG
- Experiments
- Conclusion





- A Uniform Framework
  - $\checkmark\,$  All in one step, avoiding error propagation
  - ✓ Incorporate information from different data sources:

Homepage, Google Scholar, Twitter, Linkedin, Facebook, etc.

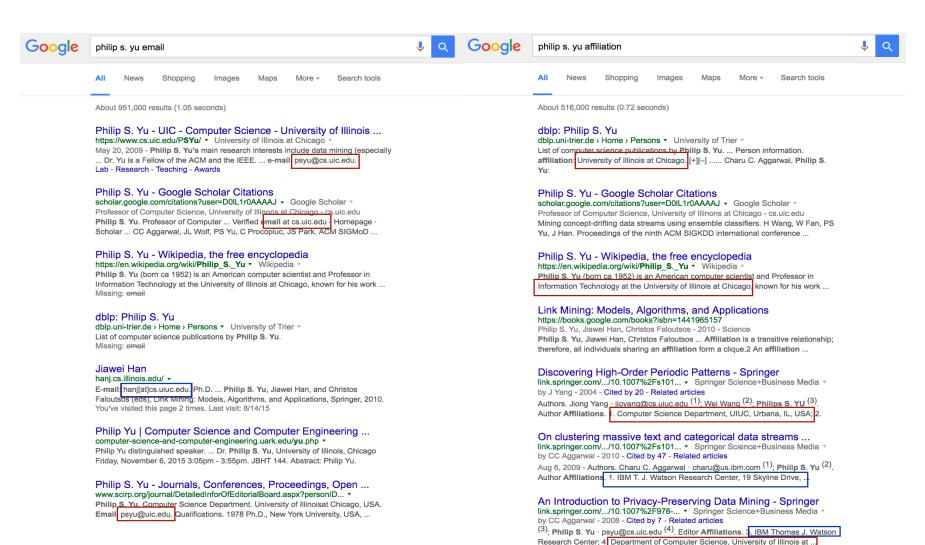




- A Uniform Framework
- Search Engine as the data source







\_\_\_\_\_.



### Basic Idea - Search Engine as Data Source

### Why snippets?

#### Efficient

 Different from traditional methods that crawled each of the relevant pages, It is much faster and more stable, as different servers that host the relevant pages may have very different network speed.

#### Effective

• we found with the constructed "smart" queries, more than 90% of the profile attributes are already contained in the snippets returned by the search engine.

### Economical

• One additional advantage is that we do not need to maintain a large database to record all the relevant pages for all the query persons. This is very important, as, for example, in AMiner, we have more than 130,000,000 researchers— maintaining such a big database for all researchers itself is a challenging task.





- A Uniform Framework
- Search Engine as the Data Source
- Smart Query Construction

Profile Attributes

Categorical : Gender, Position, Country...

Non-Categorical : Email, Affiliation, Address...



# Query Construction

### Non-Categorical

Person\_Name + Attribute\_Name

Query = "Phillip S. Yu email"

All News Shopping Images Maps More - Search tools

About 951,000 results (1.05 seconds)

#### Philip S. Yu - UIC - Computer Science - University of Illinois ...

https://www.cs.uic.edu/PSYu/ Vilversity of Illinois at Chicago May 20, 2009 - Philip S. Yu's main research interests include data mining (especially ... Dr. Yu is a Fellow of the ACM and the IEEE. ... e-mail psyu@cs.uic.edu. Lab - Research - Teaching - Awards

#### Philip S. Yu - Google Scholar Citations

scholar.google.com/citations?user=D0IL1r0AAAAJ ▼ Google Scholar ▼ Professor of Computer Science, University of Illinons at Chicago - cs.uic.edu Philip S. Yu. Professor of Computer ... Verified email at cs.uic.edu Homepage Scholar ... CC Aggarwal, JL Wolf, PS Yu, C Procopiuc, JS Park. ACM SIGMoD ...

#### Philip S. Yu - Wikipedia, the free encyclopedia https://en.wikipedia.org/wiki/Philip S. Yu • Wikipedia •

Philip S. Yu (born ca 1952) is an American computer scientist and Professor in Information Technology at the University of Illinois at Chicago, known for his work ... Missing: email

#### dblp: Philip S. Yu

dblp.uni-trier.de > Home > Persons ▼ University of Trier ▼ List of computer science publications by Philip S. Yu. Missina: email

#### Jiawei Han

hanj.cs.illinois.edu/ -

E-mail: hanj[at]cs.uiuc.edu. Ph.D. ... Philip S. Yu, Jiawei Han, and Christos Faloutsos (eds), Link Mining: Models, Algorithms, and Applications, Springer, 2010. You've visited this page 2 times. Last visit: 8/14/15

### Philip Yu | Computer Science and Computer Engineering ... computer-science-and-computer-engineering.uark.edu/yu.php \*

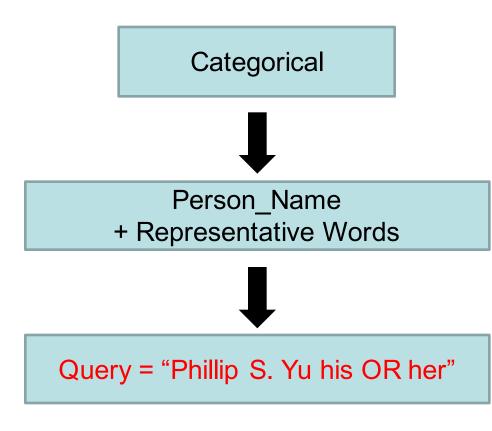
Philip Yu distinguished speaker. ... Dr. Philip S. Yu, University of Illinois, Chicago Friday, November 6, 2015 3:05pm - 3:55pm. JBHT 144. Abstract: Philip Yu.

#### Philip S. Yu - Journals, Conferences, Proceedings, Open ... www.scirp.org/journal/DetailedInforOfEditorialBoard.aspx?personID... \*

Philip S. Yu. Computer Science Department. University of Illinoisat Chicago, USA. Email psyu@uic.edu. Qualifications. 1978 Ph.D., New York University, USA, ...



## Query Construction



Google

#### All Images News Maps Videos More - Search tools

About 21,400,000 results (0.41 seconds)

#### Philip S. Yu - Wikipedia, the free encyclopedia https://en.wikipedia.org/wiki/Philip\_S.\_Yu -

Philip S. Yu (born ca 1952) is an American computer scientist and Professor in Information Technology at the University of Illinois at Chicago, known or his work ...

#### <sup>[PDF]</sup> About Me Philip S. Yu is a Professor in Computer Science ... scimaps.org/exhibit/images/130325/PR2-Semantics-Yu.pdf \*

Philip S. Yu is a Professor in Computer Science at the University of Illinois at Chicago and also ... Dr. Yu spent most of his career at IBM, where he was manager.

#### Philip S. Yu - UIC - Computer Science - University of Illinois at... https://www.cs.uic.edu/PSYu/ +

May 20, 2009 - Philip Syu's main research interests include data mining (especially ... He spent most of his care at IBM Thomas J. Watson Research Center, ... You've visited this page 3 times. Last visit: 5/8/16

#### Philip S. Yu • IEEE Computer Society

#### https://www.computer.org/web/awards/technical-philip-yu

Philip S. Yu has been awarded Recipient of "Year" Technical Achievement Award for ... Dr. Yu spent most of his career at IBM, where he was manager of the ...

#### Philip S. Yu - Google Scholar Citations scholar.google.com/citations?user=D0IL1r0AAAAJ •

Professor of Computer Science, University of Illinons at Chicago - cs.uic.edu Mining concept-drifting data streams using ensemble classifiers. H Wang, W Fan, PS Yu, J Han. Proceedings of the ninth ACM SIGKDD international conference ...

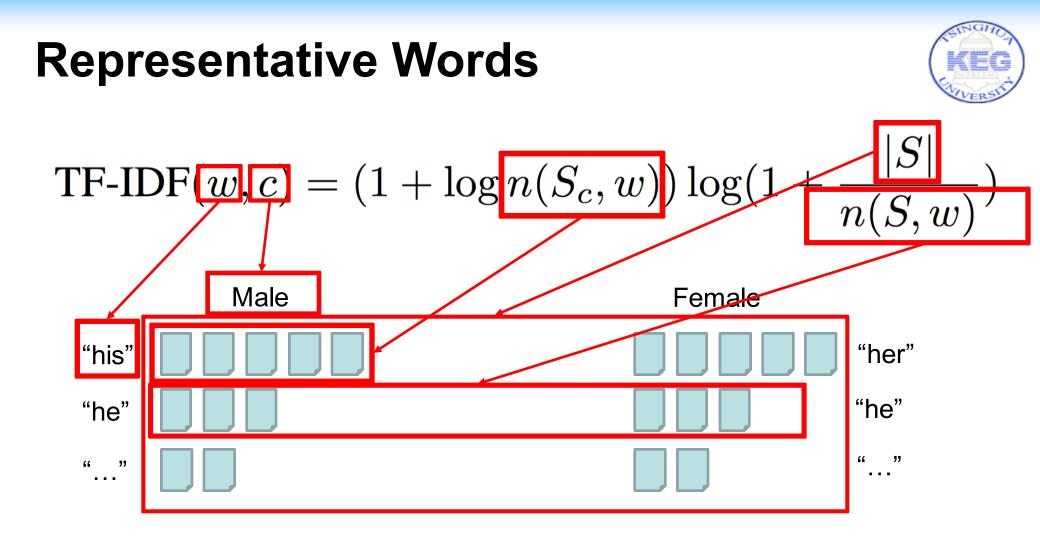
#### On Mining Big Data - Philip S. Yu - Computer Science www.cs.iit.edu/~mbilgic/seminar/philip\_yu.html -

Philip S. Yu is currently a Professor in the Department of Computer Science at the ... His psearch interests include big data, data mining, privacy preserving data ...

#### Philip Yu | Computer Science and Computer Engineering | Uni... computer-science-and-computer-engineering.uark.edu/yu.php \*

Nov 6, 2015 - Philip Yu distinguished epocker. ... Dr. Philip S. Yu, University of Illinois, Chicago Friday ... Dr. Yu received his Philip from Stanford University.





Query = "Phillip S. Yu his OR her"





- A Uniform Framework
- Search Engine as the Data Source
- Smart Query Construction
- Basic Classification





### **Feature Definition**

### Email

- First name in prefix
- Last name in prefix
- Initials in prefix

### Gender

- How many "his"
- How many "her"
- ...





### **Basic Classification**

### Email

### Gender

Method	Precision	Recall	F1-score	- · ·	Method	Precision	Recall	F1-score
CTRF	90.20	83.83	86.90	_	FGNL	94.66	80.88	87.23
Rule	87.81	89.64	88.72		Rule	92.12	88.32	90.18
SVM	88.26	89.25	88.75	-	SVM	91.98	90.60	91.29
RF	90.76	90.58	90.56	-	RF	90.17	89.99	90.08
LR	89.07	91.14	90.11	-	LR	91.48	91.54	91.51

### Uniformly outperform the baselines (CTRF, FGNL)





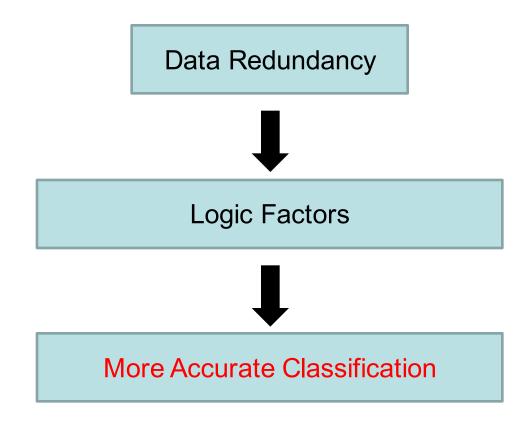
# Web User Profiling using Data Redundancy

- Introduction
- Traditional Way
- Basic Idea
- MagicFG
- Experiments
- Conclusion





## MagicFG - Markov Logic Factor Graph



Philip S. Yu - UIC - Computer Science - University of Illinois ...

https://www.cs.uic.edu/PSYu/ 
University of Illinois at Chicago 
May 20, 2009 - Philip S. Yu's main research interests include data mining (especially ... Dr. Yu is a Fellow of the ACM and the IEEE. ... e-mail psyu@cs.uic.edu. Lab - Research - Teaching - Awards

#### Philip S. Yu - Google Scholar Citations

scholar.google.com/citations?user=DOIL1r0AAAAJ 

Google Scholar 

Professor of Computer Science, University of Illinons at Chicago - resulc.edu
Philip S. Yu. Professor of Computer ... Verified email at cs.uic.edu
Scholar ... CC Aggarwal, JL Wolf, PS Yu, C Procopiuc, JS Park. ACM SIGMoD ...

#### Philip S. Yu - Wikipedia, the free encyclopedia

https://en.wikipedia.org/wiki/Philip\_S.\_Yu 
Vikipedia 
Philip S. Yu (born ca 1952) is an American computer scientist and Professor in
Information Technology at the University of Illinois at Chicago, known for his work ...
Missing: email

#### dblp: Philip S. Yu

dblp.uni-trier.de > Home > Persons ▼ University of Trier ▼ List of computer science publications by Philip S. Yu. Missing: email

#### Jiawei Han

hanj.cs.illinois.edu/ -

E-mail hanj[at]cs.uiuc.edu. Ph.D. ... Philip S. Yu, Jiawei Han, and Christos Faloutsos (eds), Link Mining: Models, Algorithms, and Applications, Springer, 2010. You've visited this page 2 times. Last visit: 8/14/15

#### Philip Yu | Computer Science and Computer Engineering ... computer-science-and-computer-engineering.uark.edu/yu.php \*

Philip Yu distinguished speaker. ... Dr. Philip S. Yu, University of Illinois, Chicago Friday, November 6, 2015 3:05pm - 3:55pm. JBHT 144. Abstract: Philip Yu.

#### Philip S. Yu - Journals, Conferences, Proceedings, Open ...

www.scirp.org/journal/DetailedInforOfEditorialBoard.aspx?personID... • Philip S. Yu. Computer Science Department. University of Illinoisat Chicago, USA. Email psyu@uic.edu. Qualifications. 1978 Ph.D., New York University, USA, ...

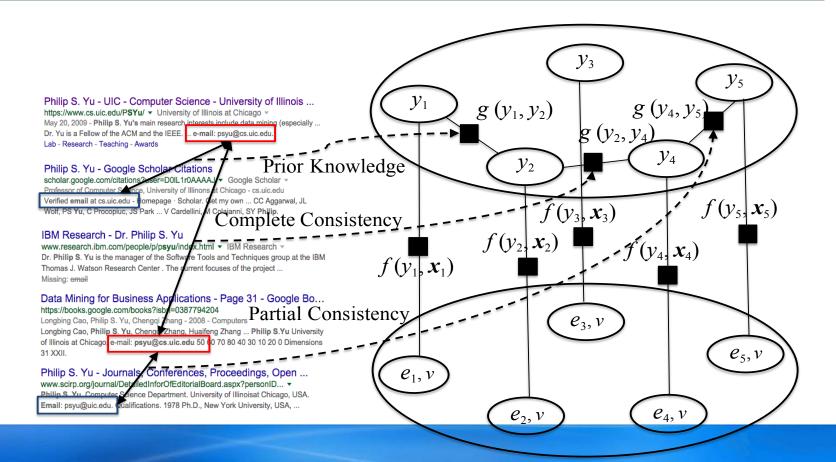




## Why logic factors?

✓ Depict and utilize correlations between possible candidates from redundant data.

✓ Incorporate human knowledge to guide and amend the classification model.





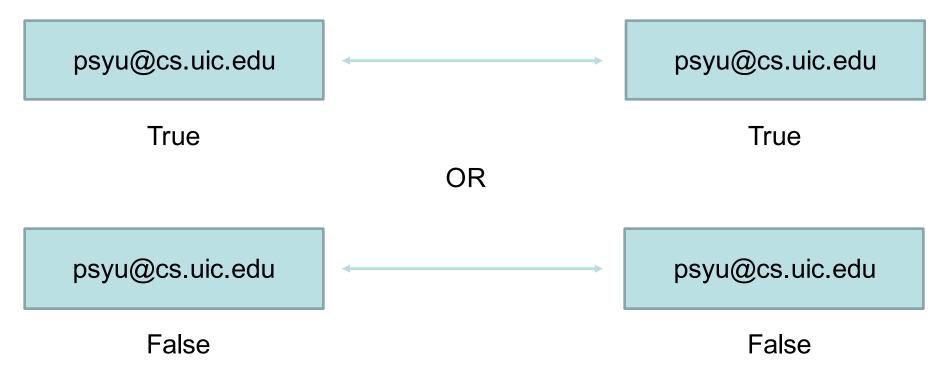


## **Logic Factors**

Complete Consistency

$$\mathsf{Equals}(e_i, e_j) \Rightarrow \mathsf{Equals}(y_i, y_j)$$

Two same vertices must share the same label.







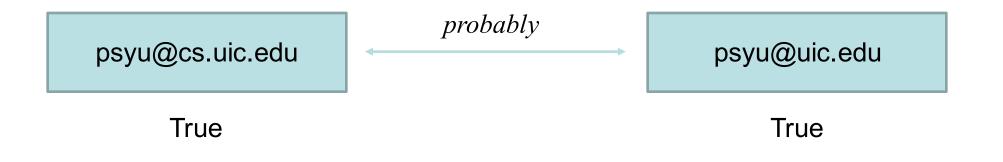
# **Logic Factors**

SamePrefix $(e_i, e_j) \Rightarrow \operatorname{True}(y_i) \land \operatorname{True}(y_j)$ 

• Partial Consistency

Two similar vertices probably share the same (preferred) label.

e.g. Two Emails sharing the same prefix are probably both credible for the target user.







# **Logic Factors**

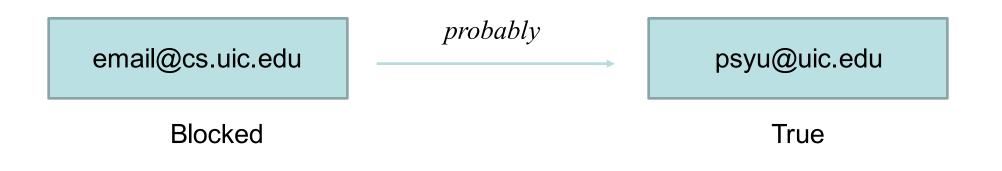
 $IsBlocked(e_j) \land SameDomain(e_i, e_j)$ 

• Prior Knowledge

 $\Rightarrow$  True $(y_i) \land$  False $(y_j)$ .

Some prior knowledge can be converted to logic factors.

e.g. Some Email addresses are modified (blocked) for some reason, whose domains are still visible and credible. Emails with the same domain with a blocked one are probably valid.







### **Markov Logic Factor Graph**

Attribute factor function

$$f(v, e_i, y_i) = \frac{1}{Z_a} \exp\{\sum_k \alpha_k \phi_k(y_i, \boldsymbol{x_i})\},\$$

Logic factor function

$$g(y_i, y_j) = \frac{1}{Z_b} \exp\{\sum_m \beta_m \psi_m(y_i, y_j)\},\$$

• Log-likelihood function

$$\log P(Y|X, \theta) = \sum_{y_i \in Y} \sum_k \alpha_k \phi_k(y_i, \boldsymbol{x_i}) + \sum_{e_i \sim e_j} \sum_m \beta_m \psi_m(y_i, y_j) - \log Z,$$

• Target parameter

$$\theta^* = \arg \max_{\theta} \log P(Y|X, \theta).$$





## **Markov Logic Factor Graph**

• Training: Gradient Ascent

• Gradient: 
$$\frac{\partial L(\theta)}{\partial \alpha_k} = \mathbb{E}[\phi(y_i, \boldsymbol{x_i})] - \mathbb{E}_P(y_i, \boldsymbol{x_i})[\phi(y_i, \boldsymbol{x_i})].$$

• Learning: 
$$\theta_{new} = \theta_{old} + \eta \cdot \frac{\mathcal{O}(\theta)}{\theta},$$

• Classification:

$$Y_v = \arg \max_{Y_v} P(Y_v | X_v, \theta)$$





# Web User Profiling using Data Redundancy

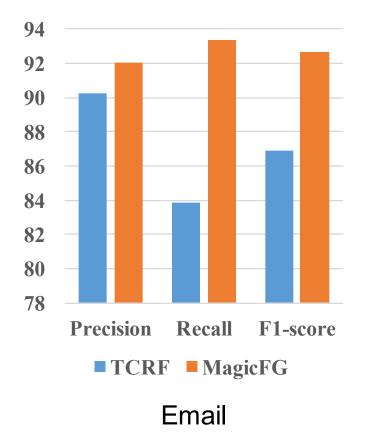
- Introduction
- Traditional Way
- Basic Idea
- MagicFG
- Experiments
- Conclusion

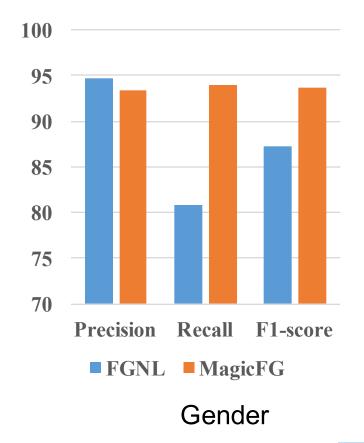


# Accuracy Performance

KEG

 Comparison between MagicFG and state-of-the-art methods for Email and Gender extraction



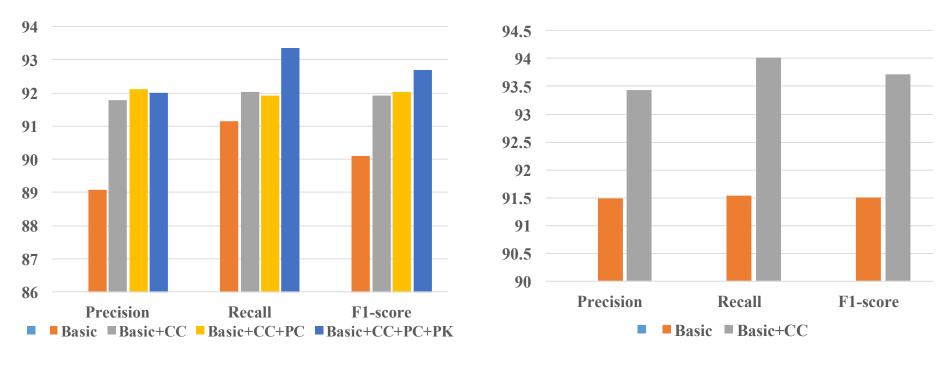






### **Accuracy Performance**

### Logic factors do help!



Gender



Email



# Web User Profiling using Data Redundancy

- Introduction
- Traditional Way
- Basic Idea
- MagicFG
- Experiments
- Conclusion



# Conclusion



- Motivation
  - To solve the problem of low recall and error propagation in traditional two-step methods.
- Basic Idea
  - Search engine as the data source.
- MagicFG
  - Utilize correlations in redundant data.
  - Incorporate human knowledge





# Thank you!

### Code & Data http://aminer.org/profiling

