Using a Concept Map to Evaluate **Exploratory Search**

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Background

- Previous studies on user-centered evaluations and exploratory search systems:
 - Can users effectively seek information?
 - Can they conduct Exploratory Search by interaction with the systems?
- Previous studies: What can users acquire from information sources found?



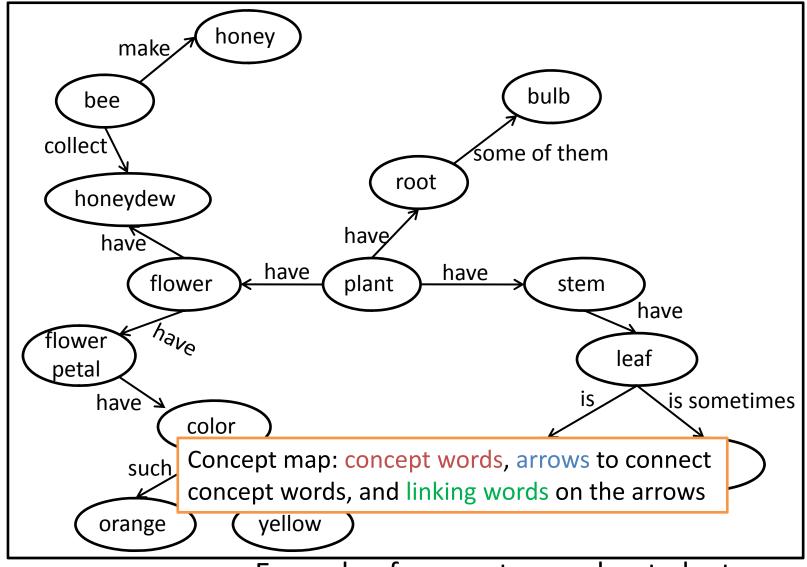
Our focus: users' cognitive changes during exploratory search

Objective

- User's cognitive changes by search:
- How can we measure changes in the user's knowledge structure, before/after Exploratory Search?

- Concept map
 - used in learning & education to describe learners' knowledge representations

Concept Map (Cmap)



Example of concept map about plants

Related Works – Concept Map

- Concept maps: introduced in educational fields
- In IR & IS context:
 - Cole et al., 2007; Halttunen and Järverin, 2005;
 Pennane and Vakkari, 2003
 - Used Concept maps to represent user's knowledge structures and their changes
- In our context:
 - A basic tool to analyze effectiveness of Exploratory Search supporting systems
 - Grater the effectiveness, grater the change in cmaps
 - Examine affects of topics for searching and affects of search task scenarios

Research Questions

- RQ1: What differences can be observed between pre- and post-search concept maps?
- RQ2: How do differences between topics, scenarios and browser types influence changes in user's concept maps?
- User Experiment

Experimental Design

Participants

• 35 undergraduate students

- Ages: 18 - 28

- Males: 17, Females: 18

– Majors:

literature, nursing science, pedagogics, engineering, political economics, jurisprudence, commercial science, science & engineering, etc.

No experience drawing concept maps

Search Task

- Information-gathering task
- Participants gather information on Web as preparation for writing a term paper on a topic
- Participants conducted two search tasks for different topics
 - Topic is an experimental factor

Factors in Experiment

- 1. Topics (within-subject factor)
 - Media topic
 - Politics topic
- 2. Scenarios (between-subjects factor)
 - Selective
 - As-Many-As
- 3. Browser types (within-subject factor)
 - Tab Browser
 - Non-tab Browser

1. Topics (within-subjects factor)

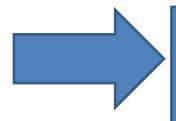
- Participants gather info on the Web for writing a term paper on Media or Politics topic
- Media:

"The media's impact on the young adult population"

Politics:

"The influence of a change in government administrations"

- Not fact-finding topics
- Diverse discussions and opinions on the Web



Participants must investigate discussions not only by looking for multiple opinions but also by comparing viewpoints.

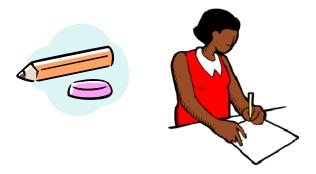
2. Scenarios (between-subjects factor)

- Selective scenario
 - Carefully select 10 or fewer Web pages
- As-Many-as scenario
 - Gather as many Web page as possible

3. Browser type (within-subjects factor)

- Web browser allowed:
 - Use of tabs (Tab Browser)
 - or -
 - Non-use of tabs (non-Tab Browser)

- Purpose : effect of interface
 - Why: experienced users used tabs lots





*Cmap: Concept Map

Quizzes about Web, IR, and Writing 10 min. Preparation Search Experience Questionnaire 10 min. 5 min. Instruction of Cmap Practice of Cmap 5 min. 5 min. Instruction of Task Pre-Search Cmap for Topic 10 min. 15 min. Search 1st Search Task Post-Search Cmap for Topic 10 min. Questionnaire for Task 10 min. Instruction of Task 5 min. Pre-Search Cmap for Topic 10 min. Search 15 min. Search Task Post-Search Cmap for Topic 10 min. Questionnaire for Task 10 min. Closing Questionnaire 10 min. Closing



「自動車におけるエコロジー」に関する文献の検索をする場合、「自動車」と「エコロジー」の両者を 合む文献、つお、「自動車」を含む文献の集合と「エエロジー」を含む文献の集合の(A)を取れば よい、検索大としては、「自動車(B) エコロジー」で表現される。 「バイブリテカーまどは雑気自動車」に関する文献の検索をする場合は、「バイブリテカー」と「電

「ハイブリッドカーまたは常名自動車」に関する実施の報源をする場合は、「ハイブリッドカー」と「電 気自動車」の(C)、検索式としては「ハイブリッドカー(D)電気自動車」となる。 「ハイブリッドカーを扱いを自動車につおけるエコロジー」に関するご敵の検索をする場合の検索式

「ハイブリッドカーを除いする動車でおけるエコロジー」に関するで献の破壊をする場合の破壊さ は、「自動車(B) エコロジー)(E) ハイブリッドカー」となる。この場合、ハイブリッドカーと他の エコロジー技術の両方を扱った文献は検索されないことになるので、十分な注意を要する。

| 解答群 | | | | | |
|------------|---------|-----|---------|--------|--|
| 1. 論理差 | 2. AND | | 3. 論理和 | 4. OR | |
| 5. NOT | 6. NEAR | | 7. SAME | 8. 論理積 | |
| 緊答補 | | | | | |
| (A) | (B) | (C) | (D) | (E) | |

間2 次の文章の(A)~(E)に入る最も適切な語句を解答群の中から選び、その番号を解答欄

情報検索の出発点となるのは、「あるテーマ(たとえば、卒業研究のテーマ)についての情報が記載されている玄線を入下したいといった情報要求も同かmation needs)の発生である。情報要求を書葉で表現したものが検索質問であり、情報要求、すなわら検索質問に沿って検索システムに応じた(A)を作成し、実際の検索を実行する。

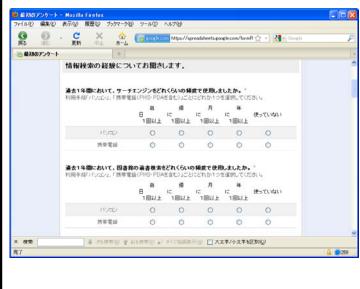
検索をいったん実行したら、検案の結果得られた文献をチェックして、調査目的に合致する結果 が得られたかどうかを(B)することが重要である。

検索核薬に含まれる文献、「小・佐藤夏来や検索質問に合金している場合は、その文献は 「C いても)といわれる。一方・検索なりなかった(こ) 文献は「検索化り」を呼ばれ、検点は に対しては「D) ションの間がある。検索とれるかないより(D) ショボル、来た、検索とれてしまっ た不過さる数は「検索/イス」といわれ、検索/イスに関しては「(E))という問題がある。不適合文 能が少ないませた(E) お高い。

| 1. 検索結果 | 2. 検索式 | | 3. コマンド | 4. 再現率 | |
|------------|--------|-----|---------|--------|--|
| 5. 精度 | 6. 占有率 | | 7. 適合 | 8. 評価 | |
| 好答欄 | | | | | |
| (A) | (B) | (C) | (D) | (F) | |

| Quizzes about Web, IR, and Writing | 10 min. | |
|------------------------------------|---------|-------------|
| Search Experience Questionnaire | 10 min. | |
| Instruction of Cmap | 5 min. | |
| Practice of Cmap | 5 min. | |
| Instruction of Task | 5 min. | |
| Pre-Search Cmap for Topic | 10 min. | |
| Search | 15 min. | 1st task |
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| Closing Questionnaire | 10 min. | |



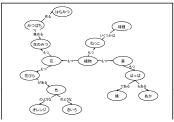


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概念マップの説明と練習

【概念マップとは何か?】 概念マップとは、物や出来事に対して人が持っている知順を視覚的に表し は、「植物」に対する概念マップの例です。



て矢印を引き、「もつ」というラベルをつけます。

【概念マップの構成要素】 概念マップは、極急請と、概念請問士をつなぐ矢田、矢田に付けられた。

- 概念語:モノやコトを表す名詞(自動車・洗濯・犬・学び・椅子・脳) とで、マップ上では名詞を丸で囲んで表現します。
- 結合語:概念語と概念語がどういうつながりなのかを示す動詞や形容のような・がある・例えば…)のことで、マップ上では矢印のラベル
- 矢印:概念語同士につながりがあることを示します。結ばれた2つの つなぐと、「植物は花をもつ」といった文になります。この場合、植物

| | Pre-Search Cmap for Topic | 10 min. | |
|--|----------------------------|---------|-------------|
| | Search | 15 min. | 1st task |
| 机: | Post-Search Cmap for Topic | 10 min. | |
| 表したものです。同 1 | Questionnaire for Task | 10 min. | |
| &OC-60-C9, al 1 | Instruction of Task | 5 min. | |
| | Pre-Search Cmap for Topic | 10 min. | |
| \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ \$ | Search | 15 min. | 2nd task |
| n.C.終点禁で構成され - 選生/(-ティ) のこ 989頃、接機関(もつ・ | Post-Search Cmap for Topic | 10 min. | |
| ベルで使用という。 200種の銀子は一般のから花に成かっ | Questionnaire for Task | 10 min. | |
| | Closing Questionnaire | 10 min. | |
| | | | |

Quizzes about Web, IR, and Writing

Search Experience Questionnaire

Instruction of Cmap

Practice of Cmap

<u>Instruction of Task</u>

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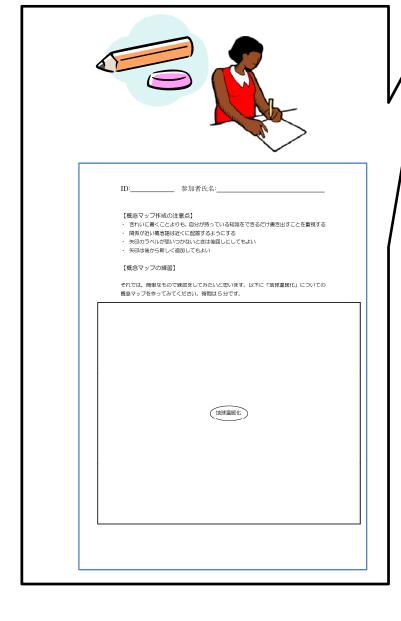
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10 min.

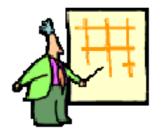
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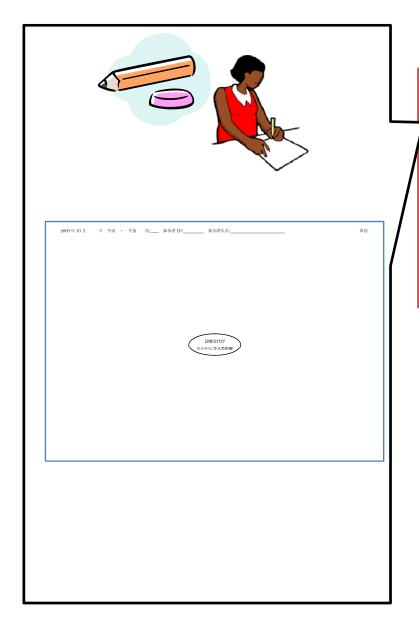
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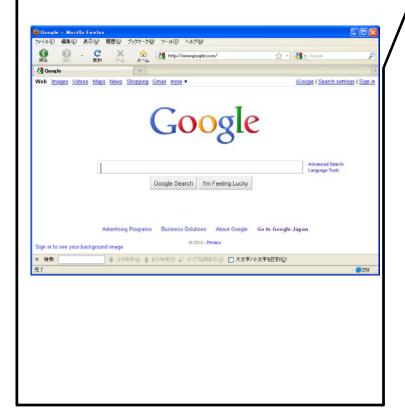


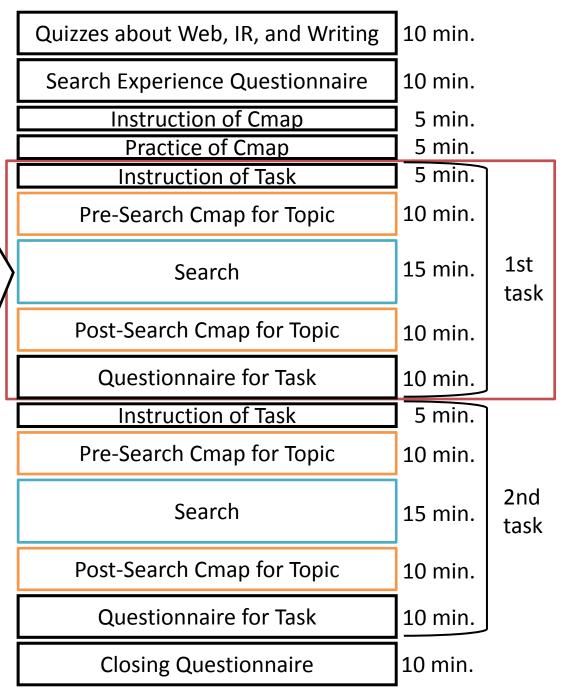
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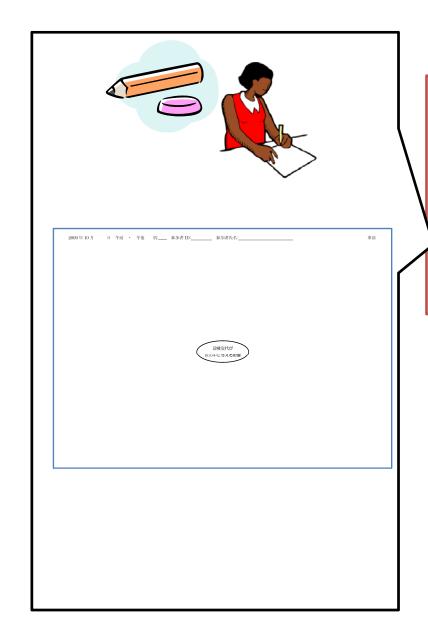


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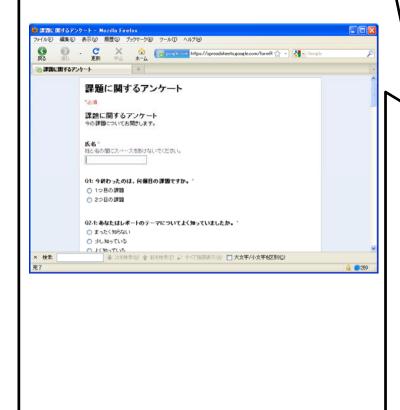






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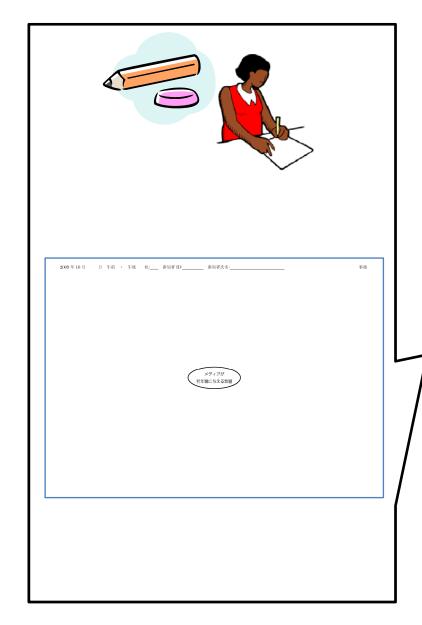


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The second task followed the same sequence as the first task.

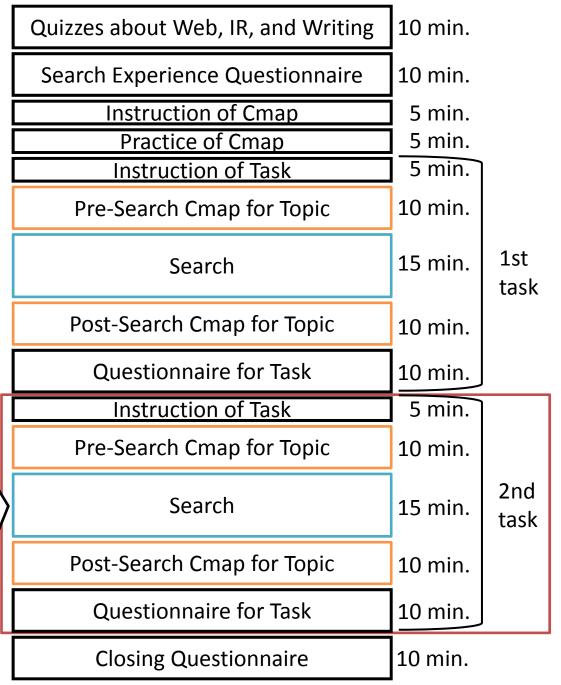


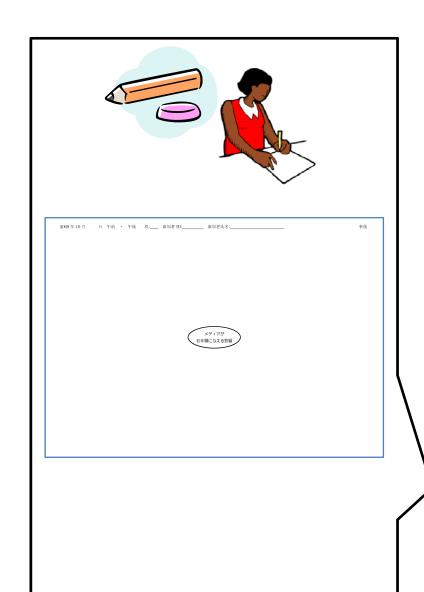
| | | _ | |
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| 1 | Instruction of Task | 5 min. | |
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| | Questionnaire for Task | 10 min. | |
| | Closing Questionnaire | 10 min. | |



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| | Questionnaire for Task | 10 min. | |
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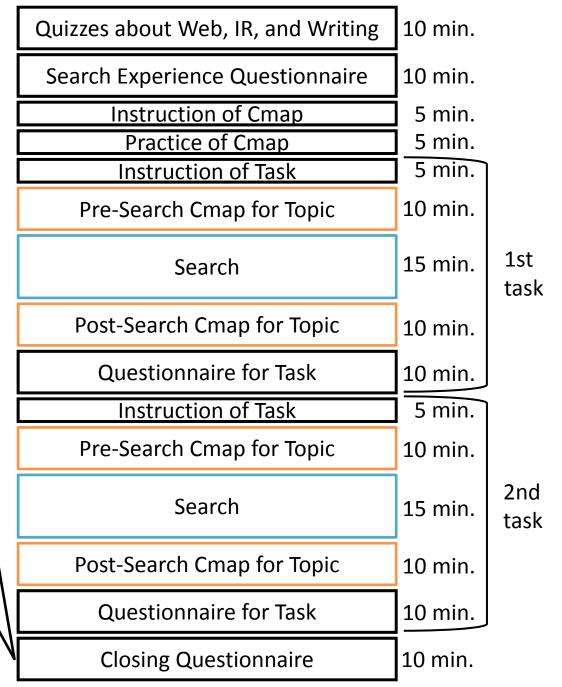
| C | Quizzes about Web, IR, and Writing | 10 min. | |
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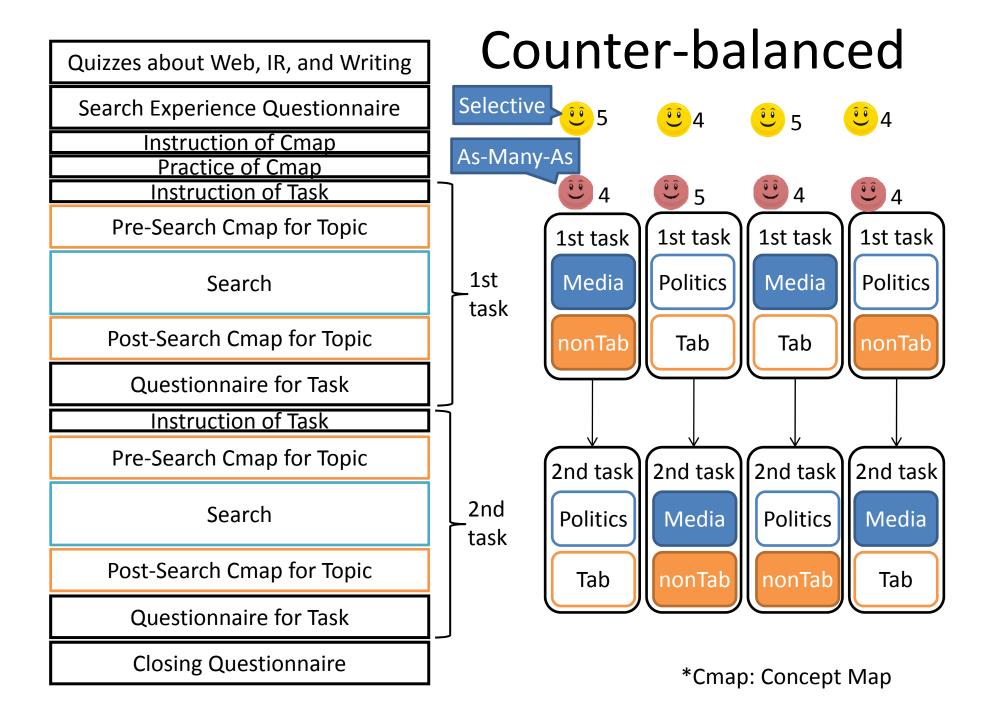




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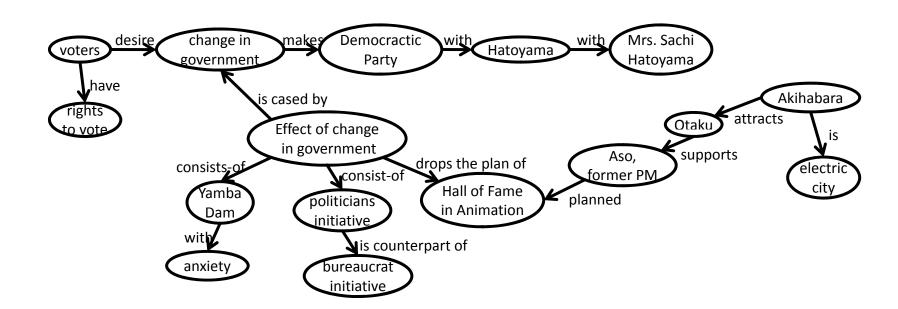




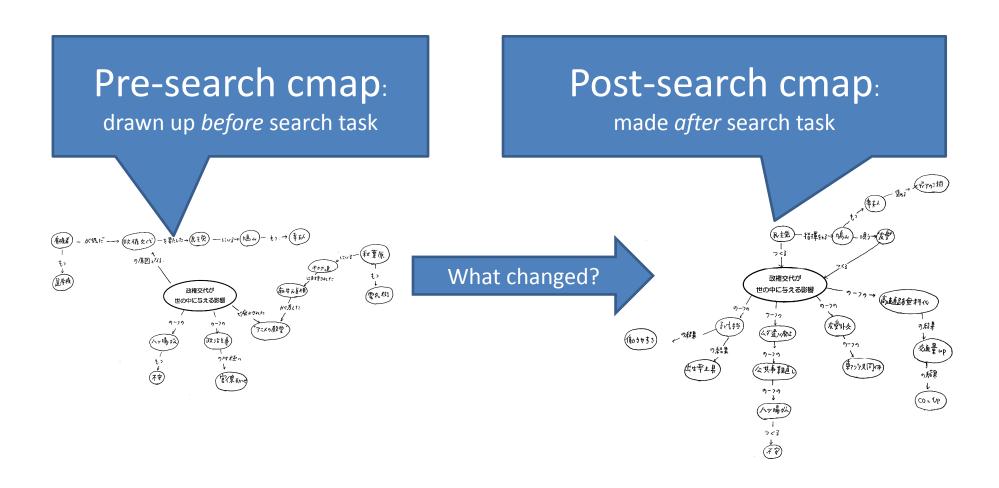
Results

Analysis Method: Overview (1) concept map → directed graph

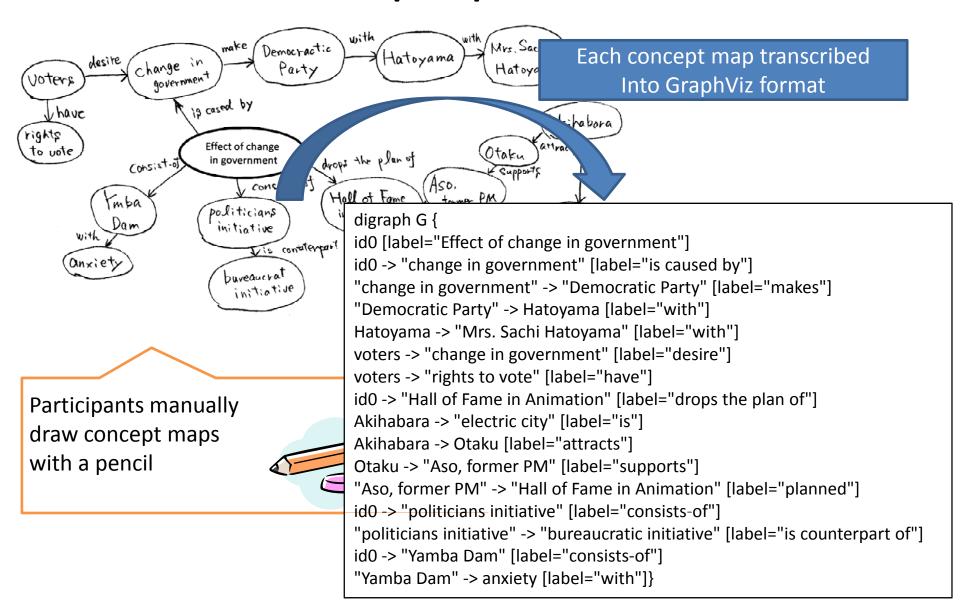
- Using graph components:
 - Node
 - Link
 - Link label



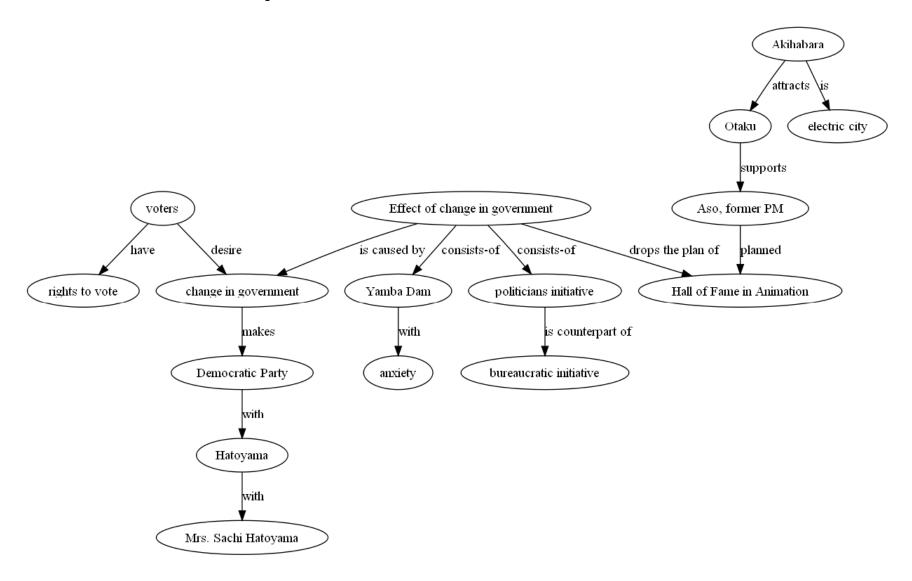
Analysis Method: Overview (2) Comparing pre- and post-search cmaps



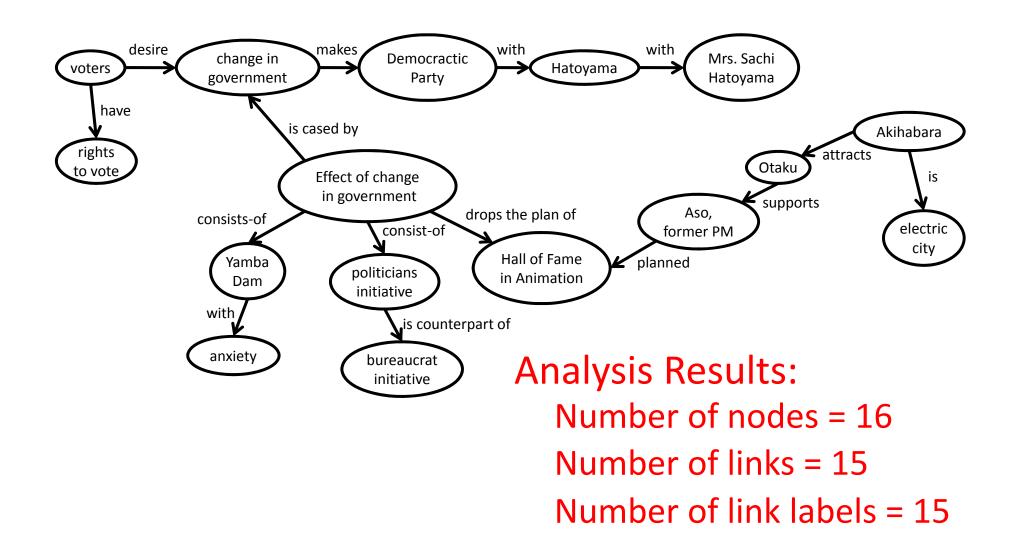
Data preparation



Example of concept map generated using GraphViz dot command



Numbers of nodes, links, and link labels



Summary: number of graph components in concept maps (n=70)

| | Min. | Max. | Mean. | Median | SD | |
|---------------------|------|------|-------|--------|-------|------------|
| No. of nodes: | | | | | | X |
| Pre_Node | 6 | 61 | 22.89 | 21 | 9.97 | |
| Post_Node | 8 | 57 | 23.93 | 21 | 10.72 | Similar |
| No. of links: | | | | | | tendencies |
| Pre_Link | 5 | 60 | 23.06 | 21 | 10.20 | 7 |
| Post_Link | 7 | 57 | 24.76 | 22 | 11.25 | |
| No. of link labels: | | | | | | |
| Pre_LLabel | 0 | 36 | 12.51 | 11 | 9.57 | |
| Post_LLabel | 0 | 35 | 12.86 | 12 | 10.10 | |

- Average number of nodes(22-23) and links(23 24)
- Numbers of nodes and links show similar tendencies
- Reason: nodes usually only have a single link

Summary: number of graph components in concept maps (n=70)

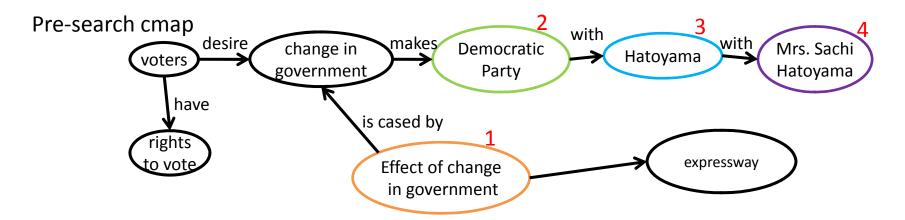
| | Min. | Max. | Mean. | Median | SD | - |
|---------------------|------|------|-------|--------|-------|---------------|
| No. of nodes: | | | | | | |
| Pre_Node | 6 | 61 | 22.89 | 21 | 9.97 | Similar |
| Post_Node | 8 | 57 | 23.93 | 21 | 10.72 | tendencies |
| No. of links: | | | | | | |
| Pre_Link | 5 | 60 | 23.06 | 21 | 10.20 | Similar |
| Post_Link | 7 | 57 | 24.76 | 22 | 11.25 | tendencies |
| No. of link labels: | | | | | | \rightarrow |
| Pre_LLabel | 0 | 36 | 12.51 | 11 | 9.57 | Similar |
| Post_LLabel | 0 | 35 | 12.86 | 12 | 10.10 | tendencies |
| | | | | | \ | |

Numbers of pre- and post-search graph components show similar tendencies

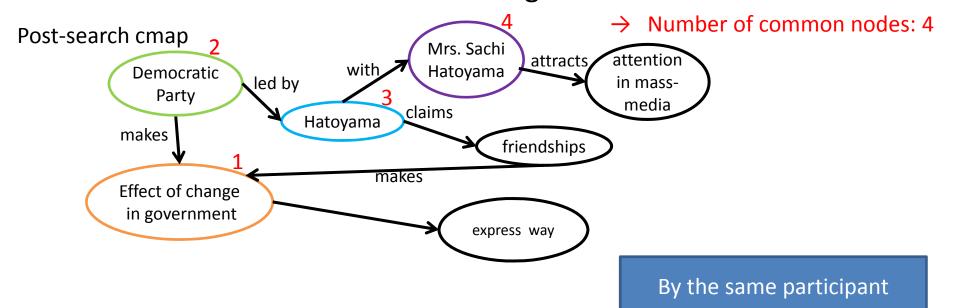
Metrics of Difference between Pre- and Post-search Concept Maps

- Metrics of difference between pre- and post-search concept maps:
 - Common, New, and Lost graph components
- Analysis:
 - Numbers of common, new, and lost graph components

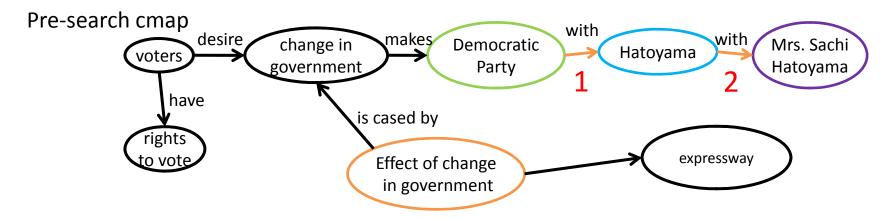
Common nodes



Common nodes: those having the same label

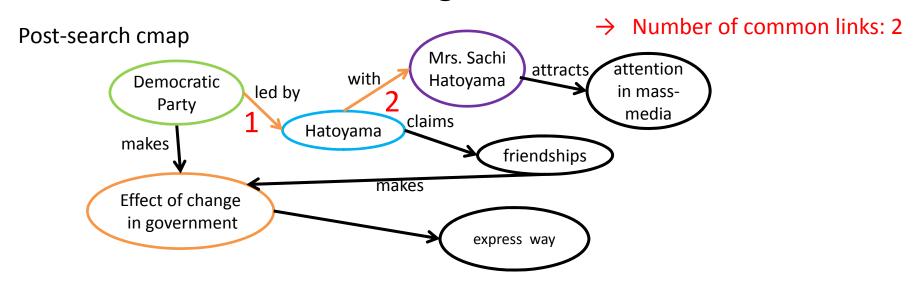


Common links

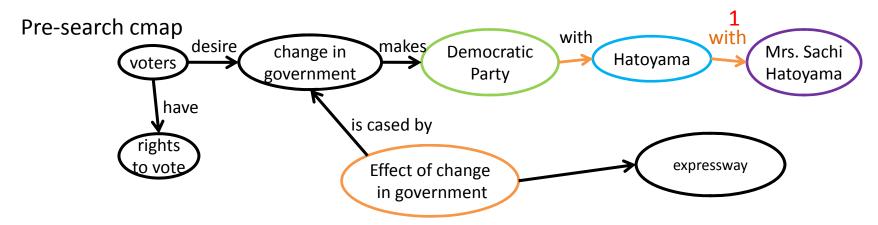


Common links:

Source node and target node are common

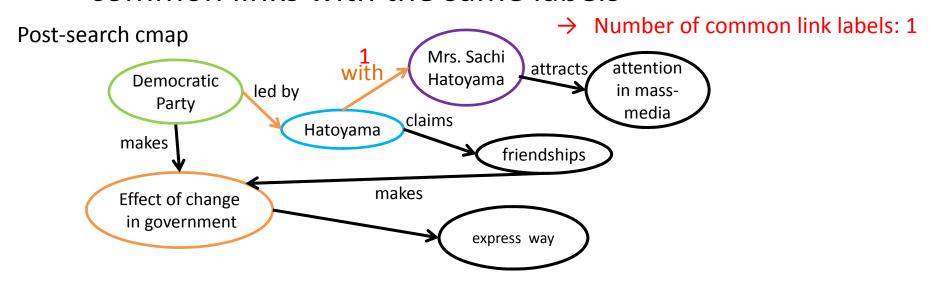


Common link labels

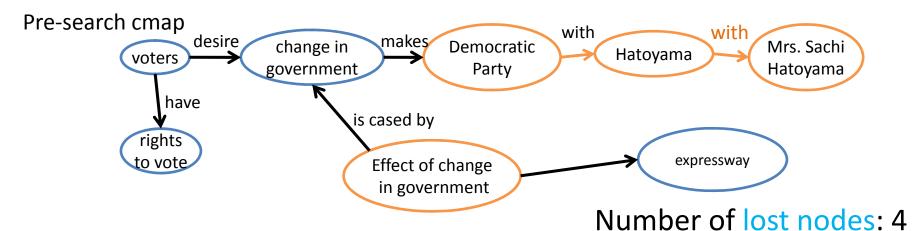


Common link labels:

common links with the same labels

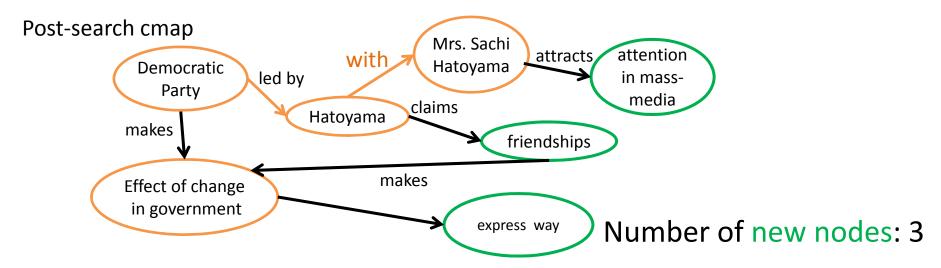


Lost nodes and new nodes

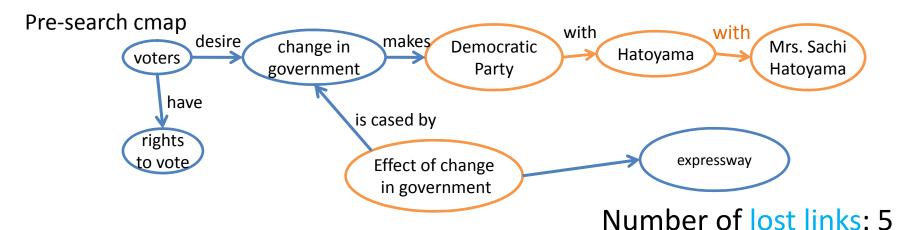


Lost nodes: only in pre-search cmaps

New nodes: only in post-search cmaps

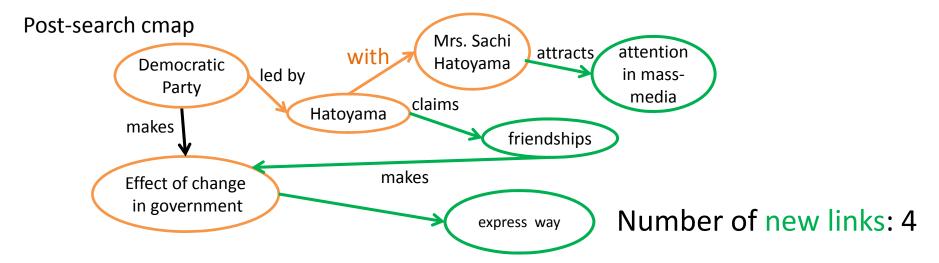


Lost links and New links

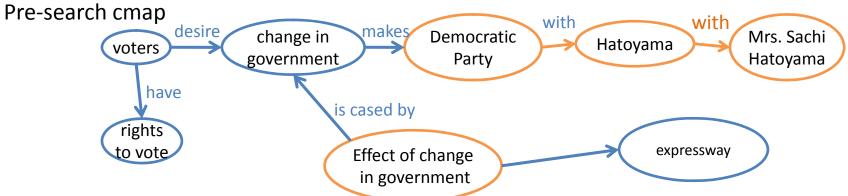


Lost links: only in pre-search cmaps

New links: only in post-search cmaps



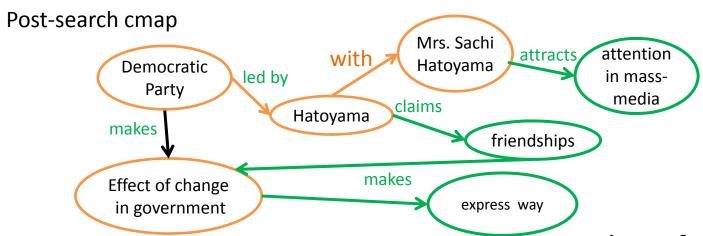
Lost link labels and New link labels



Number of lost link labels: 5

Lost link labels: only in pre-search cmaps

New link labels: only in post-search cmaps

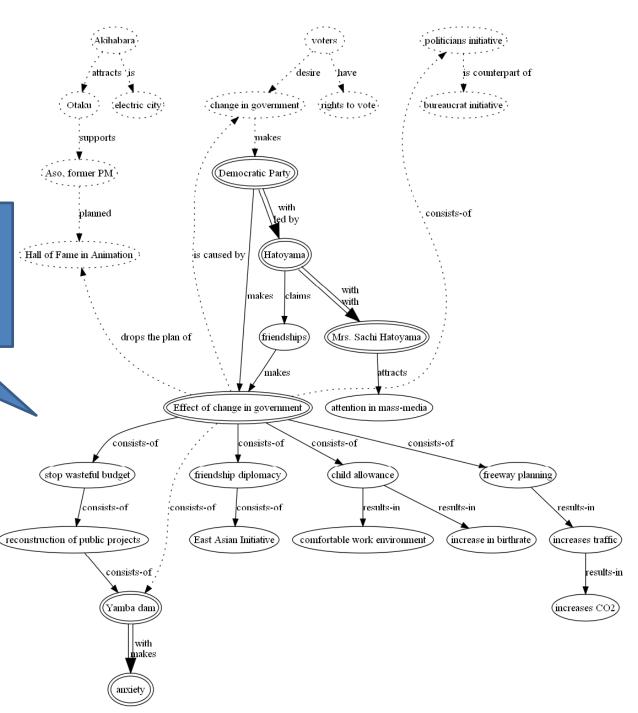


Number of new link labels: 5

VizCMaps

Combined concept map of pre- and post- search concept map with common, new, lost graph components.

: Common

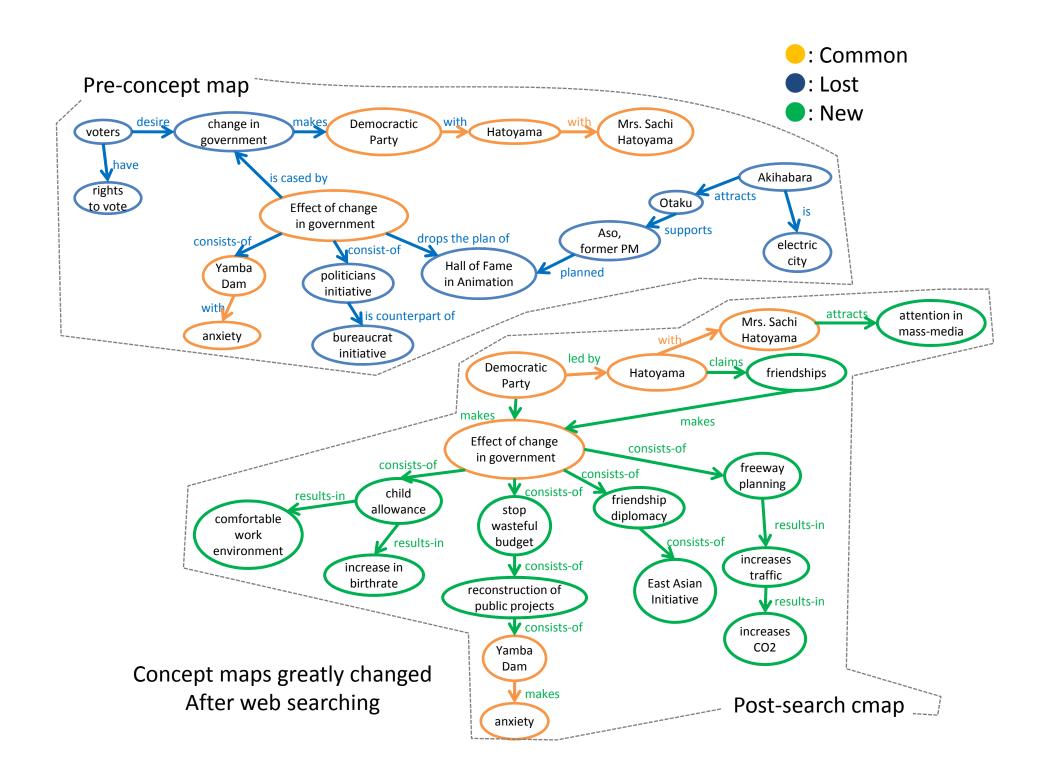


Summary: common, new, and lost graph components(n=70)

| · | Min. | Max. | Mean. | Median | $\overline{\mathrm{SD}}$ |
|---------------------|------|------|-------|--------|--------------------------|
| No. of nodes: | | | | | |
| Common_Node | 1 | 30 | 6.1 | 5 | 10 |
| New_Node | 6 | 53 | 17.8 | 15.5 | Common < new, lost |
| $Lost_Node$ | 3 | 51 | 16.7 | 15· | 8.7 |
| No. of links: | | | | | |
| Common_Link | 0 | 15 | 2.7 | 2 | 3.9 |
| New_Link | 7 | 57 | 22.0 | 20 | Common < new, lost |
| $Lost_Link$ | 4 | 56 | 20.3 | 19.5 | 9.8 |
| No. of link labels: | | | | | |
| Common_LLabel | 0 | 8 | 1.4 | 0 | 20 |
| New_LLabel | 0 | 31 | 11.5 | 11 | Common < new, lost |
| $Lost_LLabel$ | 0 | 34 | 11.1 | 10 | ₹ 8.8 |

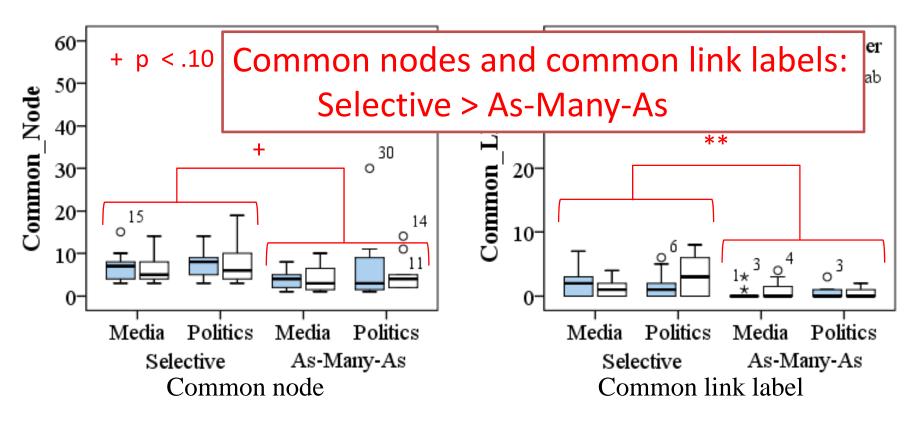
[•] Numbers of common components smaller than numbers of new & lost components

> Post-search cmaps are greatly modified from pre-search cmaps



Influences of experimental factors: Topics, scenarios, and browser types

- ANOVA analysis: number of common, new, lost graph components and three experimental factors
 - Significant differences in only common nodes and common link labels between scenario factors



Summary of Results (1)

- RQ1: What differences observed between pre- and post-search cmaps?
 - Analysis: Major changes between concept maps before and after exploratory search tasks
 - Many graph components in pre-search concept maps were lost
 - Many new components appeared in post-search concept maps

Summary of Results (2)

- RQ2: How do differences between topics, scenarios and browser types influence changes in user's concept map?
 - No differences: Topic and Browser type
 - Scenario factor: Numbers of both common nodes and link labels in As-Many-As scenario smaller than in Selective scenario

Conclusions

- Concept maps: evaluated how users change knowledge structure after exploratory search
- User experiment:
 - Task: Information-gathering
 - Factors: topic, scenario, browser type
- Analysis: concept maps as directed graphs
 - Metrics: Common, new, and lost graph components
- Results:
 - Concept maps greatly changed after web search
 - Fewer common nodes and link labels in As-Many-As scenario than in Selective scenario

Thank you!



For more details, please visit our Web site: http://cres.jpn.org

