

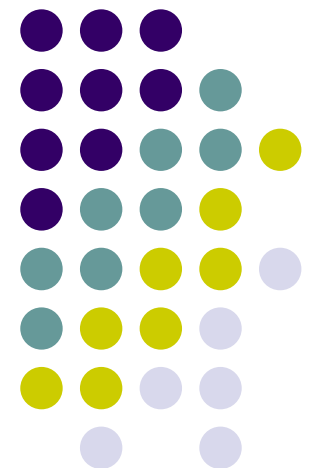
# Improving the recruitment process through ontology-based querying



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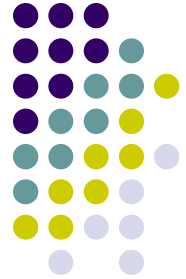
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# Outline



- Motivation
- Project Context
- e-Recruitment Nowadays
- e-Recruitment Use Case
  - Requirements Analysis
  - Semantic Web-based Prototype
  - Extension of the Semantic Web-based Prototype
- Conclusion & Future Work



# Motivation

- Online Recruitment the main recruitment channel
  - 47% of German internet users (28% of European users) read the online job postings\*
  - Over 50% of future employment procurement in Germany is expected to occur online



- Online personnel marketing = cost cutting and efficiency
- Maintenance of an overview of so many portals is a formidable task → visiting every job exchange site next to impossible
  - many websites and online portals financed by publishing fees
  - various business websites
  - portal set up by the state job centre

\* "Daten für die Online-Rekrutierung I/2005" wwjGmbH

06.11.2006



# Project Context



- **Knowledge Nets (Wissensnetze)**

- Analysis of typical scenarios for the deployment of Semantic Web technologies
- Prediction of the economic impact of Semantic Web technologies on e-Business
- Combination of business and technology-driven analysis

- **European Network of Excellence Knowledge Web**

- Goal is to achieve technology transfer from academia to industry
- An Industry Area collects business use cases and promotes Semantic Web based solutions
- Industry Portal

<http://knowledgeweb.semanticweb.org/o2i>





# Today's e-Recruitment

- Job postings in the form of **free text** using **uncontrolled vocabularies**
- Meta-search engines – search on a **full text basis**
- Open positions published on employer **websites** → meta-job portals collect information from different sites
- **General & specialized** search engines as main tool in job search

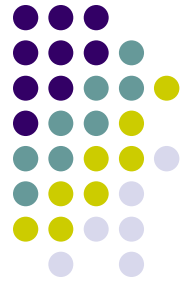
- 74% of internet users use various search engines as main tool for information retrieval\*
- 41,1% of internet users use Google\*



- Problem: Search engines index job postings imprecisely:
  - Problem to recognize a job posting on the Web
  - Problem to extract relevant keywords (job title, skills, ...) using linguistic methods
  - Search results limited in their ability to provide offers that match the precise needs
- Solution: **Semantic annotation** of job postings

\*"Online-Rekrutierung I/2005" wwjGmbH

# Use Case-based Requirement Analysis

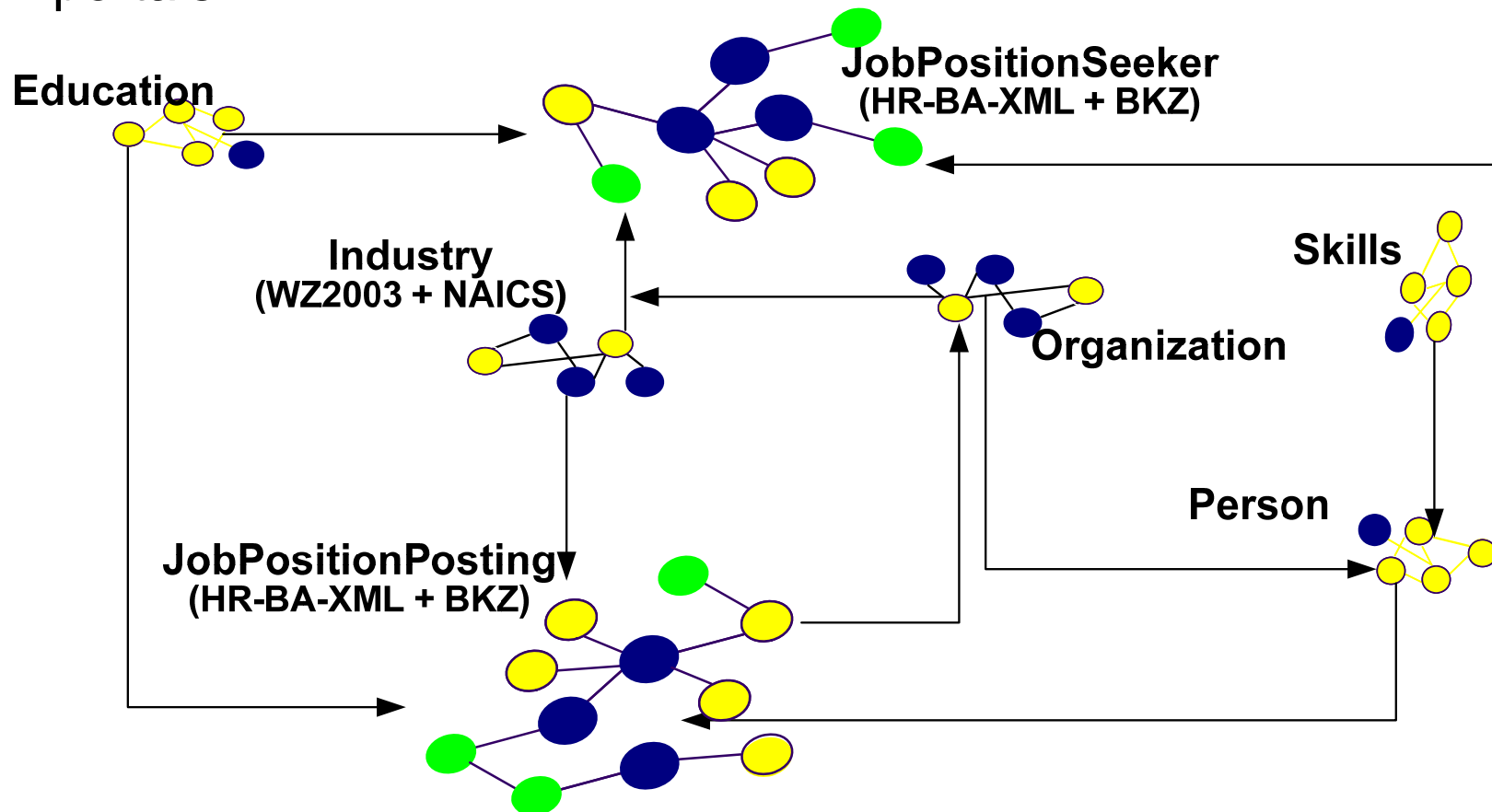


- We are looking for a person which:
  - has a degree in computer science
  - wants to work in software consulting and development,
  - is an expert in C, Java, PHP, UML, .Net and WindowsNT,
  - has worked for at least 5 years in an industrial and 5 year in a research project,
  - should have experience as project or team manager,
  - should not be older then 25



# Semantic Web-based solution (I)

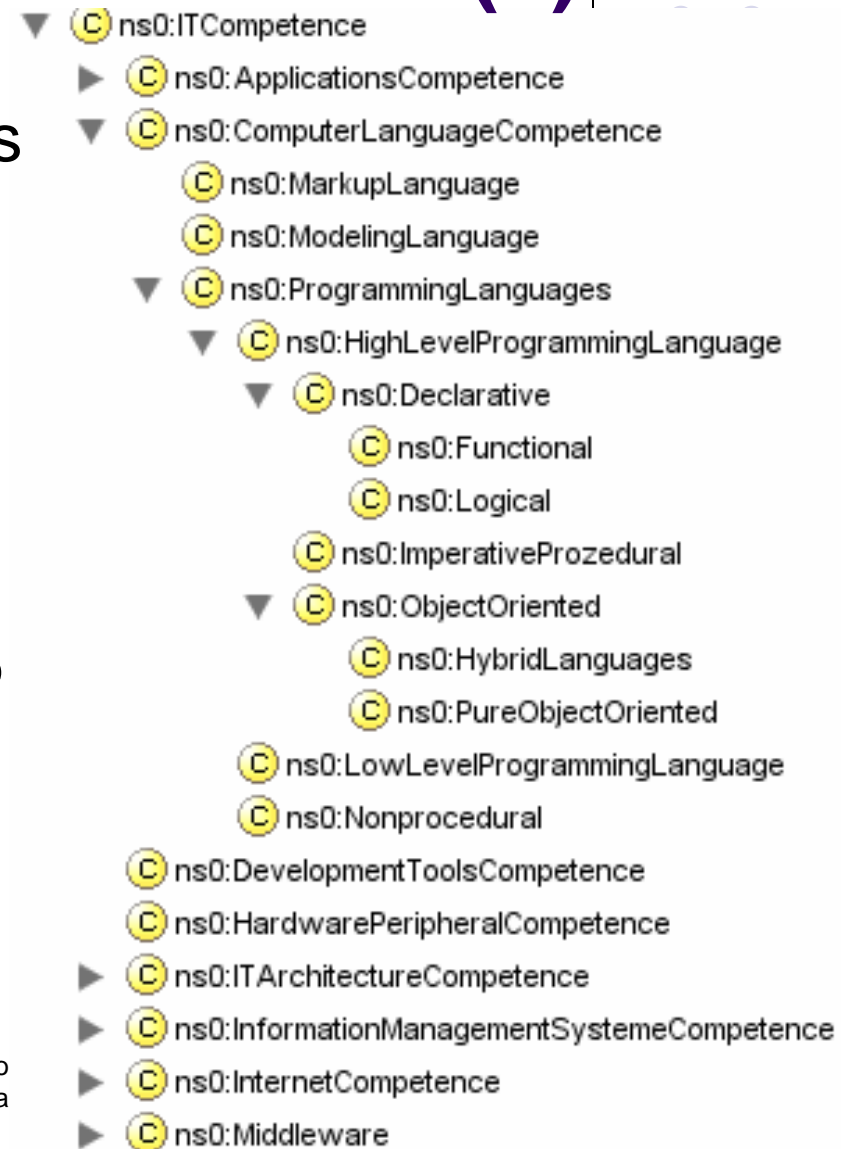
- *Human Resource Ontology* incorporates set of controlled shared vocabularies for employers, job applicants and job portals





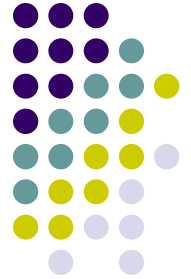
# Semantic Web-based solution (II)

- Semantic matching - combines annotations using controlled vocabularies with background knowledge about the HR domain
- Semantic search engines
  - use the annotation to identify job postings
  - could reliably crawl and index job postings
  - offer semantic matching services to increase the precision of matching of open positions and applications





# Advantages of Semantic Web-based solution



- Employers could use semantic matching algorithms to automate the pre-selection of candidates
- Job seekers could profit by increased transparency in the market



# Semantic Web-based solution (III)

Details zu den Tätigkeiten (88.0% Ähnlichkeit, gewichtet mit 0.2)

**software consulting and development**

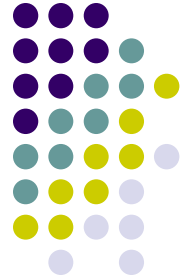
Stellenausschreibung	Bewerber	Ähnlichkeit
<b>Wirtschaftszweig:</b> Softwareberatung und -entwicklung	Sonstige Softwareentwicklung	100.0%
<b>Berufskennziffer:</b> Dipl.-Informatiker/in (Uni)	Dipl.-Informatiker/in (FH) - Softwaretechnik	76.0%

**degree in computer science**

Erforderliche Kompetenzen (90.7% Ähnlichkeit, gewichtet mit 0.6)

Erforderliche Kompetenzen	Vorhandene Kompetenzen	Ähnlichkeit
C# (Experte)	Java(Mittlere Kenntnisse)	89.7%
Java(Experte)	Java(Mittlere Kenntnisse)	92.0%
C++ (Experte)	Java(Mittlere Kenntnisse)	86.1%
Unix(Experte)	Linux(Experte)	92.1%
Servlet(Experte)	JSP(Experte)	92.1%
UML(Experte)	UML(Mittlere Kenntnisse)	92.0%
DotNET(Experte)	DCOM(Anfaenger)	80.1%
JSP(Experte)	JSP(Experte)	100.0%
WindowsNT(Experte)	Linux(Experte)	92.1%

**skills with competence level**



# Some (still) open issues

- We are looking for a person which:

- has a degree in computer science
- wants to work in software development,
- is an expert in Java, C++, UML, .Net, Unix and Windows
- has worked for a company or industrial and 5 year in a research project
- should have experience as project or team manager,
- should not be older than 25

**Answers: 0**



# How to relax the query

- We are looking for a person which:

- has a degree in computer science

Drop the degree requirement

3

Another OO-language would also be okay

- want to work in software consulting and development, expert in C#, Java, C++ , Servlet, JSP, UML, .Net , and WindowsNT,

1

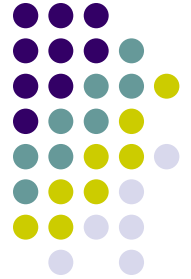
- has worked for at least 5 years in an industrial and 5 year in a research project,
- should have experience as project or team manager,
- should not be older then 25

need not to have leading experiences but then he should be younger than 21

4

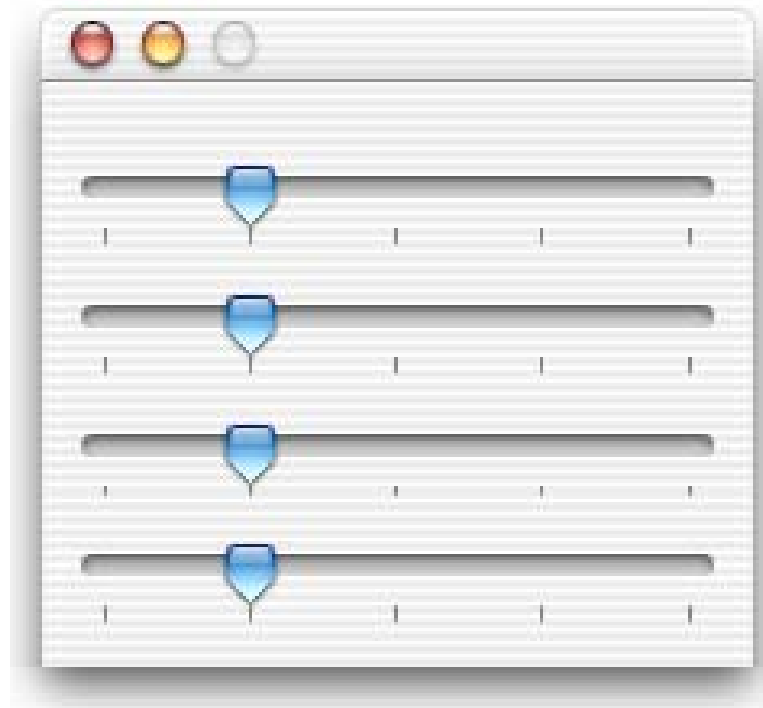
3 years may also be enough

2



# How to specify these relaxations

Skills  
Experiences  
Function  
Age





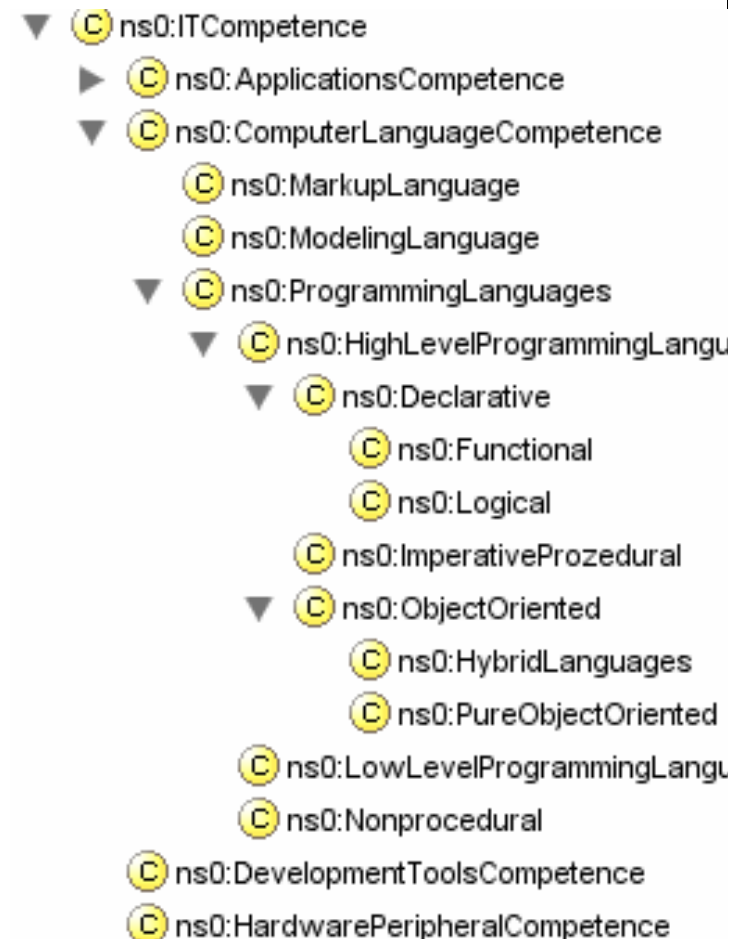
# How to specify these relaxations

**IF** experience = JAVA  
**THEN** experience = OO-Language

## Rule 1

**IF** experience = X  
**THEN** experience = Y  
**WITH** Y is father of X

## Rule 2





# Rewriting Rules (I)

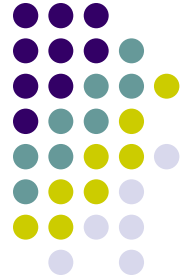
When you find all  
patterns in a  
query ....

**IF** pattern<sub>1</sub>, pattern<sub>2</sub>, ...  
**THEN** replacement<sub>1</sub>, replacement<sub>2</sub>, ...  
**WITH** condition<sub>1</sub>, condition<sub>2</sub>, ...

... then substitute the  
patterns with these  
replacements ...

... but do the replacements only  
if the conditions are satisfied.

**Very simple but expressive  
relaxation technique!**



# Replacing OWL queries

```
<owl:Class rdf:ID="Query">
  <rdfs:subClassOf>
    <owl:Class rdf:ID="Person">
  </rdfs:subClassOf>
  <rdfs:subClassOf>
    <owl:Restriction>
      <owl:someValuesFrom>
        <owl:Class>
          <owl:intersectionOf>
            <owl:Class rdf:a
            <owl:Class rdf:a
            <owl:Class rdf:a
            <owl:Class rdf:a
          </owl:intersectionOf>
        </owl:Class>
      </owl:someValuesFrom>
    <owl:onProperty>
      <owl:ObjectProperty>
    </owl:onProperty>
  </owl:Restriction>
</rdfs:subClassOf>
...
</owl:Class>
```

**IF  
THEN  
WITH**

```
<owl:Class rdf:about="Java"/>
<owl:Class rdf:about="PureObjectOrientedLanguages"/>
true
```

**IF**

```
<owl:Restriction>
  <owl:onProperty rdf:resource="#hasDuration"/>
  <owl:someValuesFrom>
    <owl:Class rdf:ID="FiveYearsOrMore"/>
  </owl:someValuesFrom>
</owl:Restriction>
```

**THEN**

```
<owl:Restriction>
  <owl:onProperty rdf:resource="#hasDuration"/>
  <owl:someValuesFrom>
    <owl:Class rdf:ID="TwoYearsOrMore"/>
  </owl:someValuesFrom>
</owl:Restriction>
```

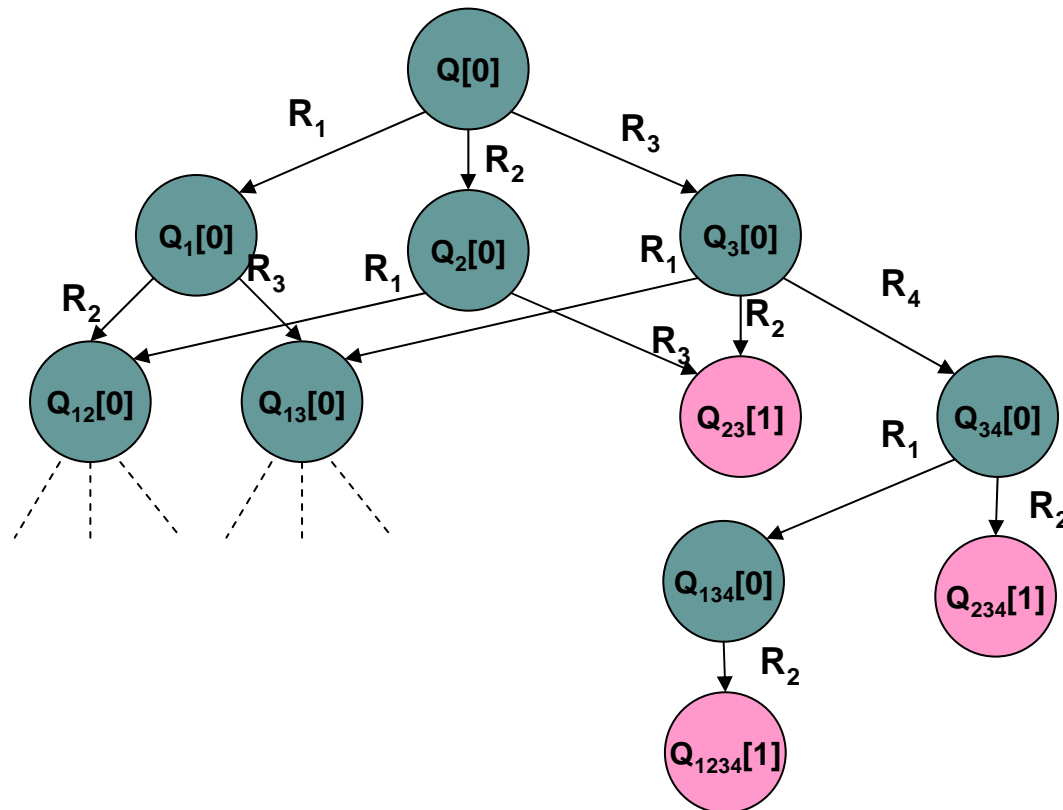
**WITH**

true






# Search tree




# Advantages and Disadvantages





## Sliders

 “Estimates” the distance between my query and one result  
(provides a ranking)

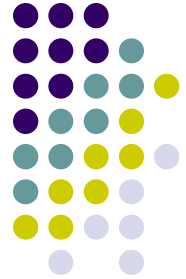
 Sliders are difficult to use; relaxation steps have to be translated in an unnatural way

## Rewriting Rules

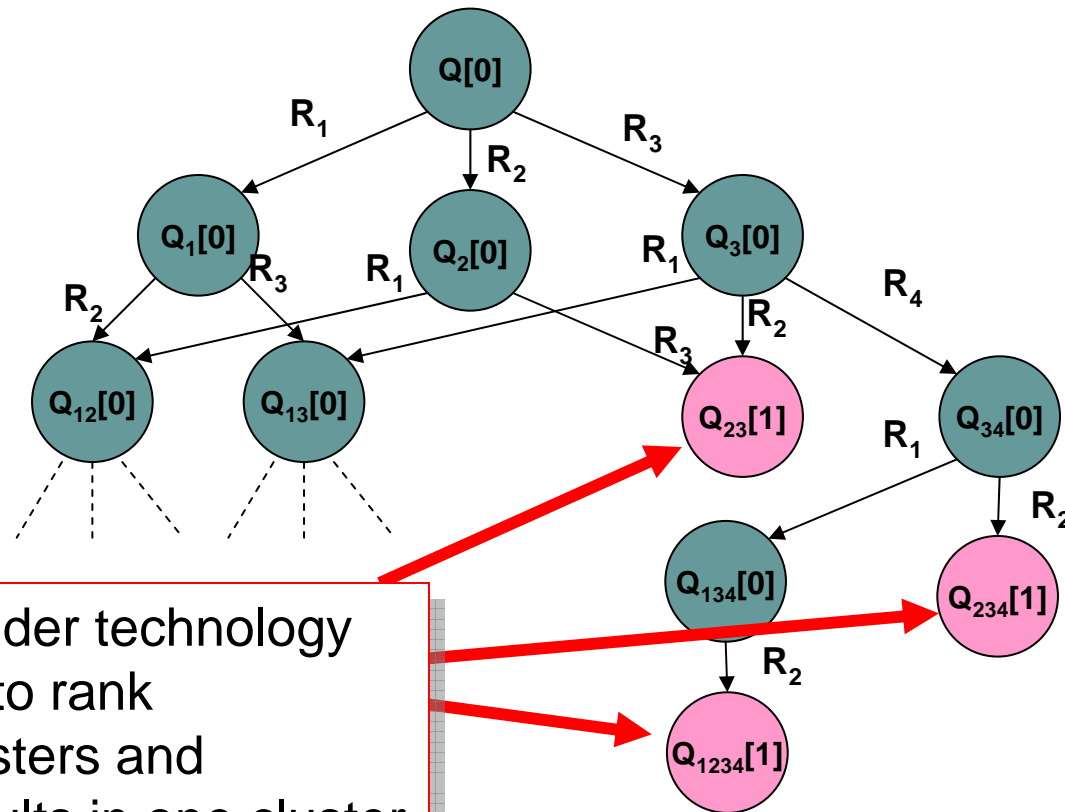
 Easy to formulate the options how to relax a query.

 Returns a set of unordered results, i.e. the results can't be ranked

**Combine both**



# Proposal for Combination



Apply Slider technology  
in order to rank

- the clusters and
- the results in one cluster



# Conclusion

- e-Recruitment is a natural application area for Semantic Web techniques
  - Job postings and offerings are annotated with metadata
  - Ability to search with complex and precise queries
- Over specified queries (normal case!) have to be relaxed
  - Sliders are inappropriate for representing relaxation steps but rank all results
  - Rewriting rules more human-oriented but can not rank the results
  - Combination of both most promising