

# HOW DO COMPUTED ONTOLOGY MAPPINGS EVOLVE?

## A CASE STUDY FOR LIFE SCIENCE ONTOLOGIES

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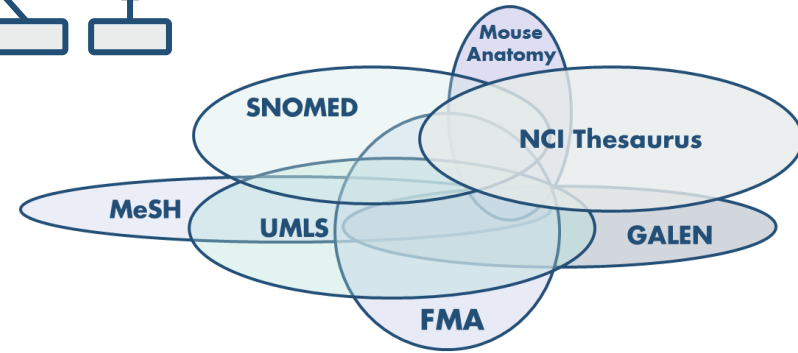
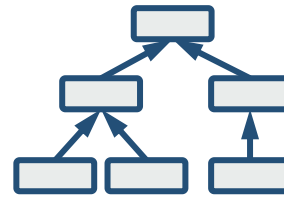
UNIVERSITÄT LEIPZIG

12<sup>TH</sup> NOVEMBER 2012, EvODYN WORKSHOP, BOSTON

# ONTOLOGIES AND ONTOLOGY MAPPINGS

## Ontologies

- Knowledge representation
- Multiple interrelated ontologies in a domain



## Ontology mapping

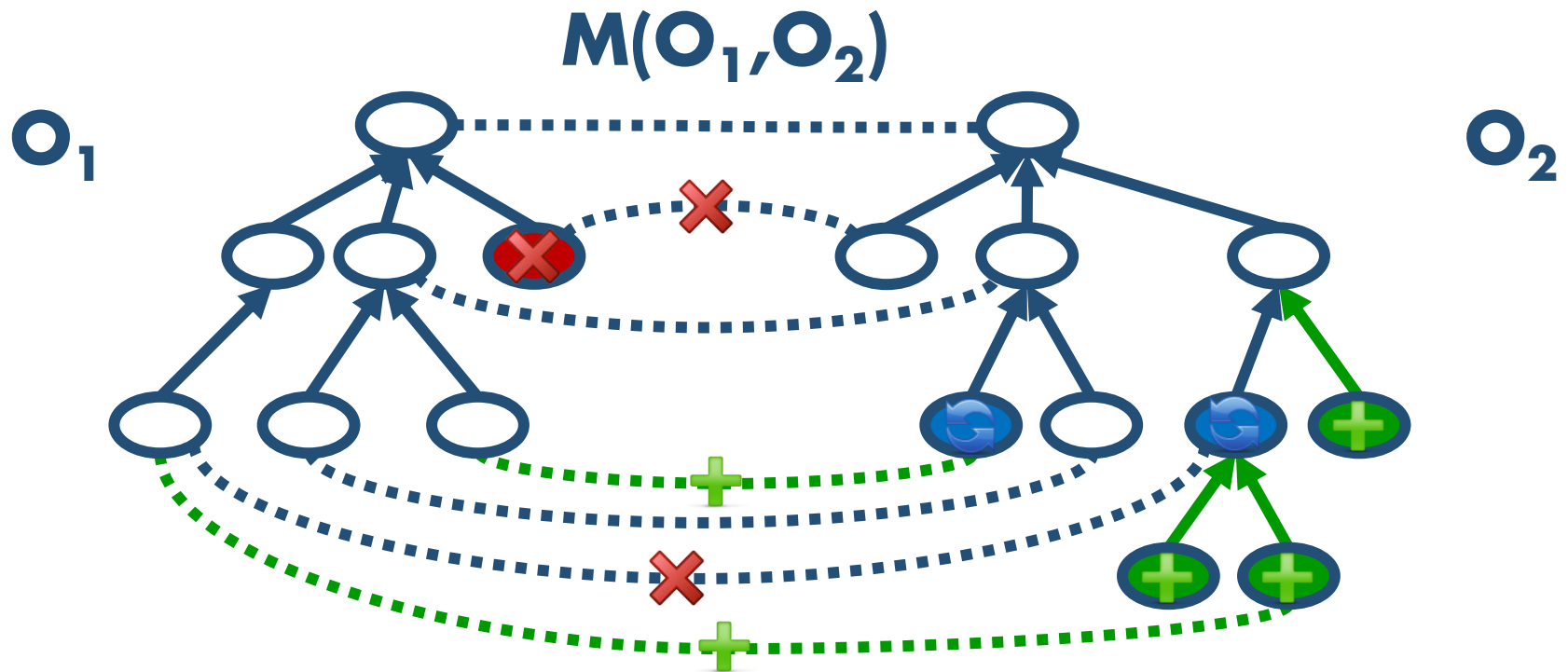
- Set of semantic correspondences between concepts of different ontologies
- Manual identification or (semi-) automatic matching approaches

## Use of mappings




- Ontology merging - creation of the integrated cross-species anatomy ontology "Uber ontology"
- Knowledge transfer - experiments for different species
- Ontology curation - find missing ontology annotations
- ...

# ONTOLOGY EVOLUTION

- Ongoing research, new findings → continuous modifications
- Periodical release of new ontology versions
- Ontology changes   
- **Invalidate previously determined ontology mappings?**



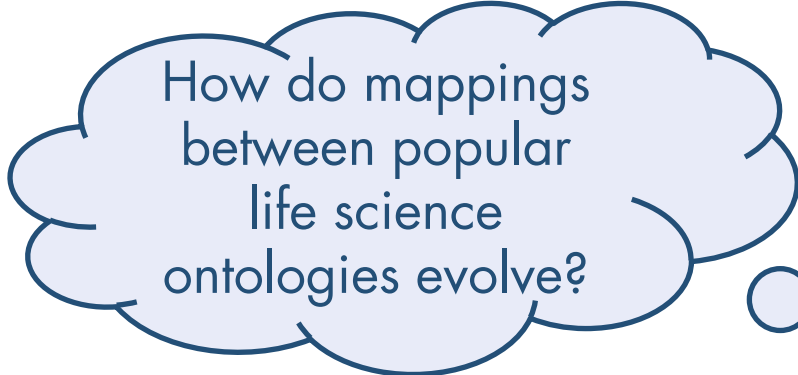
# ONTOLOGY EVOLUTION

- Ongoing research, new findings → continuous modifications
- Periodical release of new ontology versions
- Ontology changes   
- **Invalidate previously determined ontology mappings?**
- Example: Anatomy reference mapping at *OAEI* \*
  - Based on 5 year old versions
  - Quality w.r.t. current ontology versions?
- Re-determination of mappings is an expensive process
  - Manual verification of correspondences
  - Parametrization effort
- Future aim: (semi-)automatic mapping adaptation

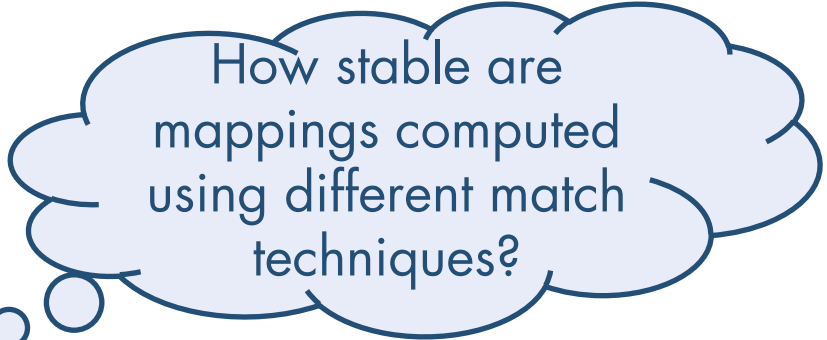
\* OAEI = Ontology Alignment Evaluation Initiative

# CONTRIBUTIONS

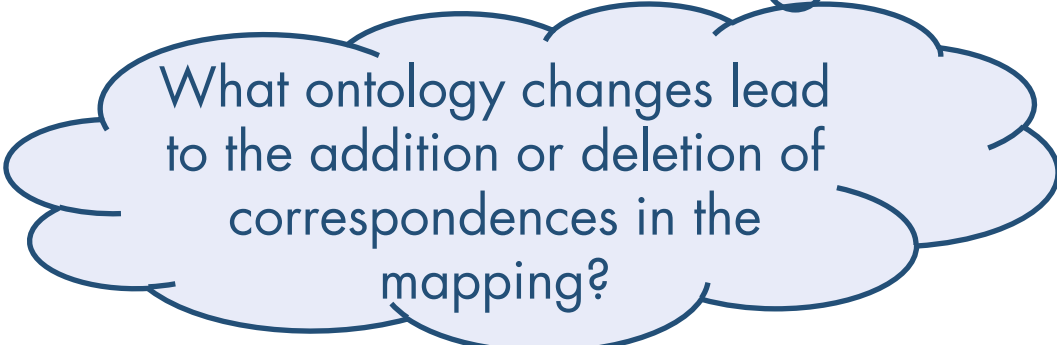
- Investigate evolution of life science ontology mappings
- Generic model for ontology and mapping evolution and their inter-dependencies
- Evaluation for three life science scenarios



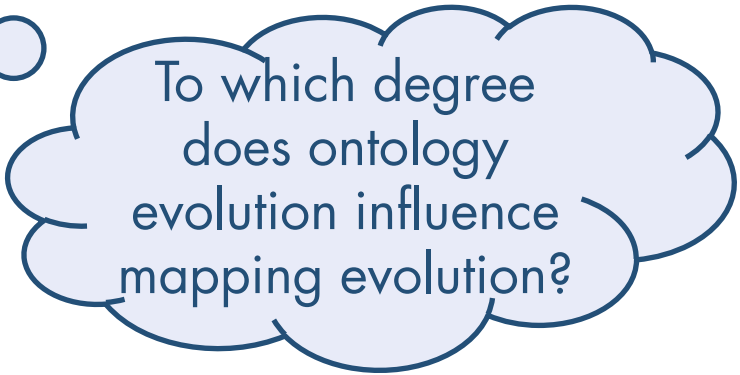
How do mappings between popular life science ontologies evolve?



How stable are mappings computed using different match techniques?

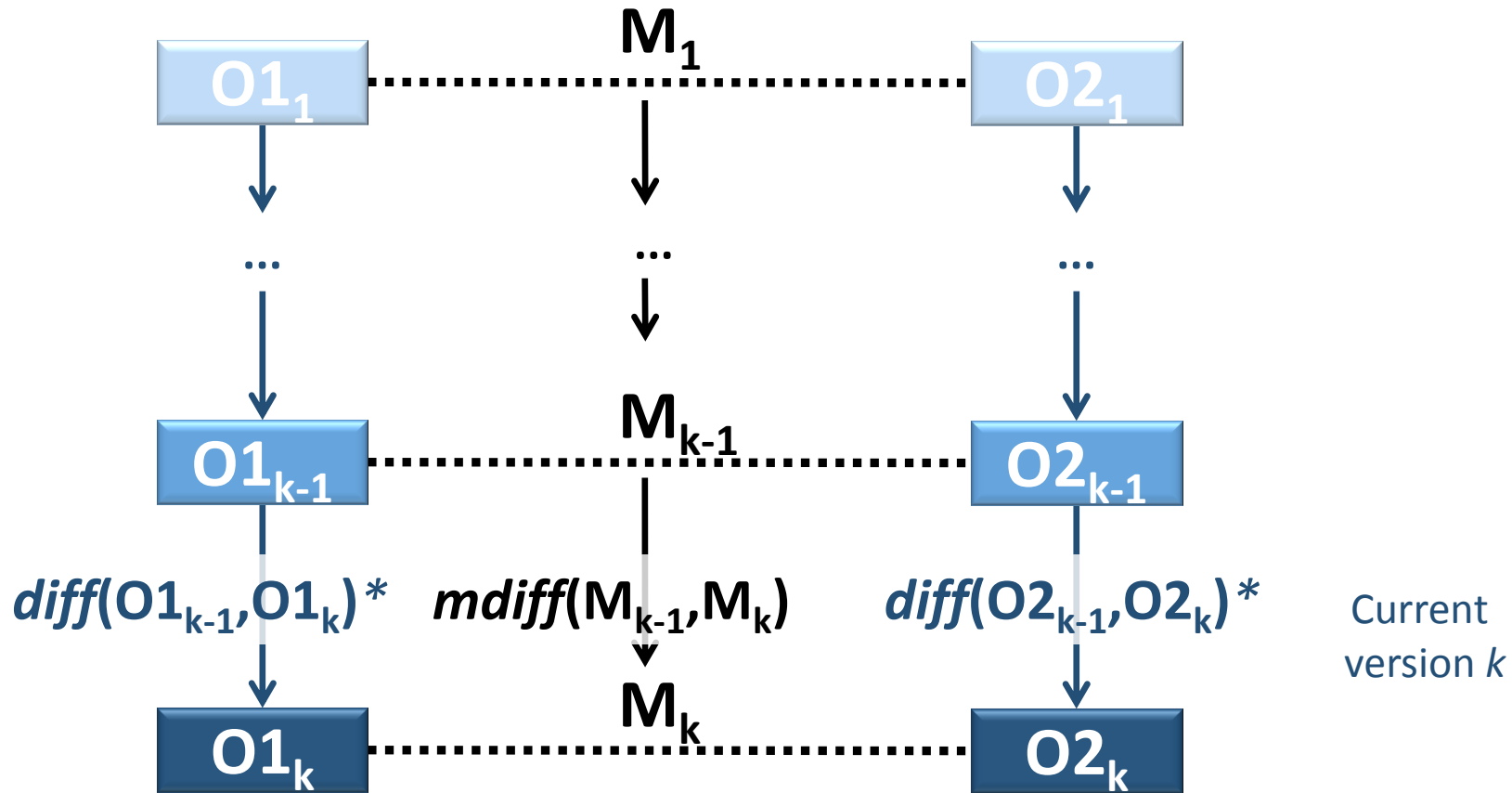


What ontology changes lead to the addition or deletion of correspondences in the mapping?



To which degree does ontology evolution influence mapping evolution?

# GENERAL EVOLUTION SCHEME



\* Hartung, M.; Groß, A.; Rahm, E.:

- **COnto-Diff:** *Generation of Complex Evolution Mappings for Life Science Ontologies*, *Journal of Biomedical Informatics*, 2012.
- **CODEX:** *Exploration of semantic changes between ontology versions*, *Bioinformatics* 28 (6): 895-896, 2012.

# CHANGE OPERATIONS

## Ontology changes:



### Extension set:

$$Ext(O_{v \rightarrow v+1})$$

Insert new concept,  
subgraph, relationship,  
attribute,

...



### Reduction set:

$$Red(O_{v \rightarrow v+1})$$

Delete existing concept,  
subgraph, relationship,  
set concept to obsolete,

...



### Revision set:

$$Rev(O_{v \rightarrow v+1})$$

Split, merge, substitute,  
move concept,  
change attribute value,

...

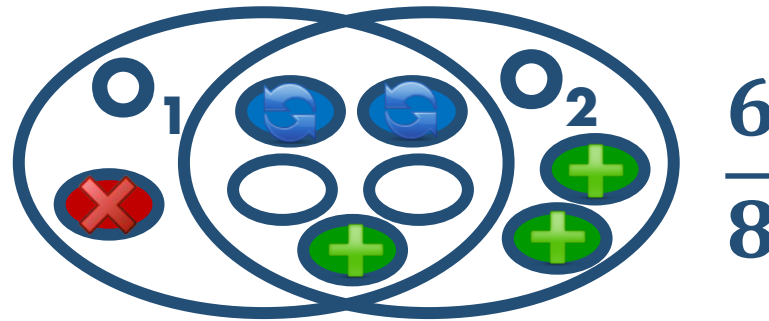
## Mapping changes:

- **Addition set:**  $Add(M_{v \rightarrow v+1}) = M_{v+1} \setminus M_v$
- **Deletion set:**  $Del(M_{v \rightarrow v+1}) = M_v \setminus M_{v+1}$

# MEASURES

## Ontology Change Ratio $OCR(O_{v \rightarrow v+1})$

- Degree of ontology changes during evolution from  $O_v$  to  $O_{v+1}$
- Fraction of concepts in *Ext*  $\cup$  *Red*  $\cup$  *Rev* versus all concepts ( $O_v \cup O_{v+1}$ )



## Mapping Change Ratio $MCR(M_{v \rightarrow v+1})$

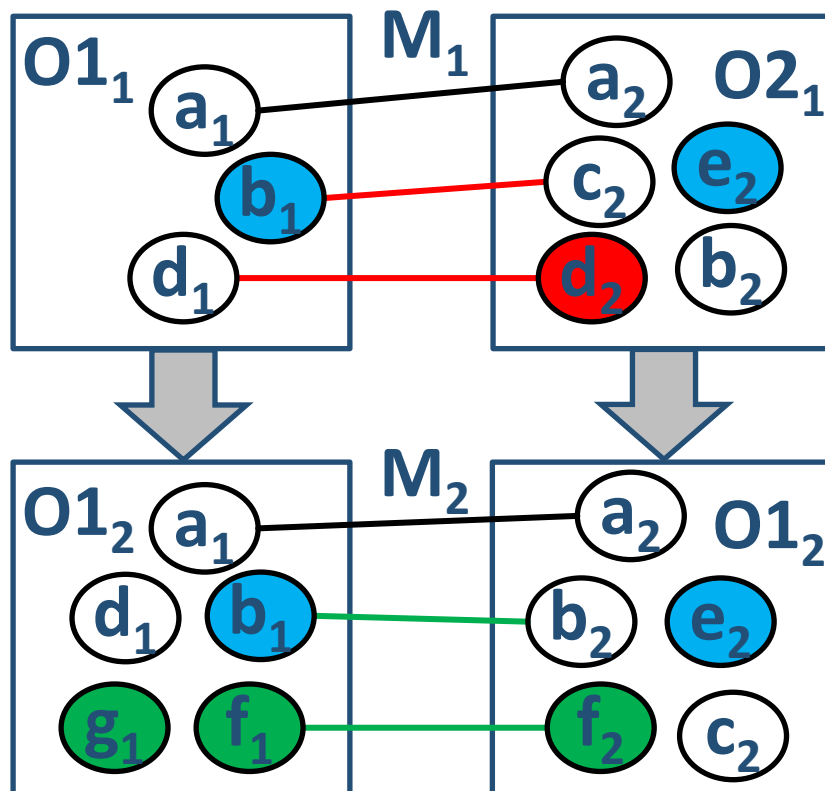
- Degree of mapping changes during evolution from  $M_v$  to  $M_{v+1}$
- Fraction of correspondence in *Add*  $\cup$  *Del* versus all correspondences ( $M_v \cup M_{v+1}$ )



# MEASURES

## Impact Ratio $IR(O_{Ch}, M_{Ch})$

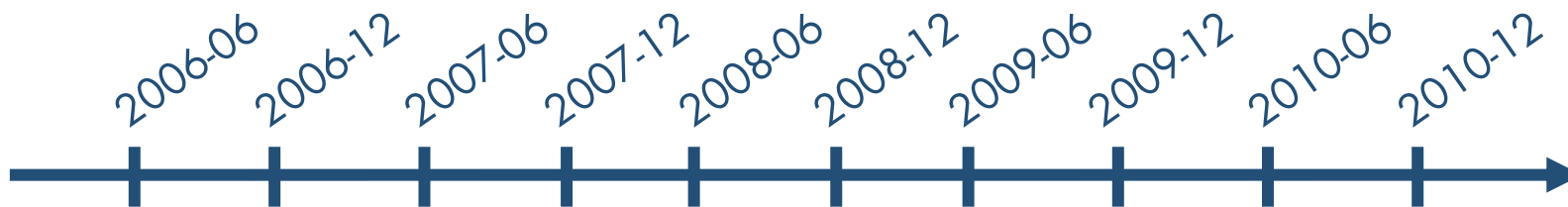
- Share of changed concepts that actually had an impact on changed correspondences
- For instance, fraction of additive ontology changes that led to new correspondences:  $IR(Ext, Add)$



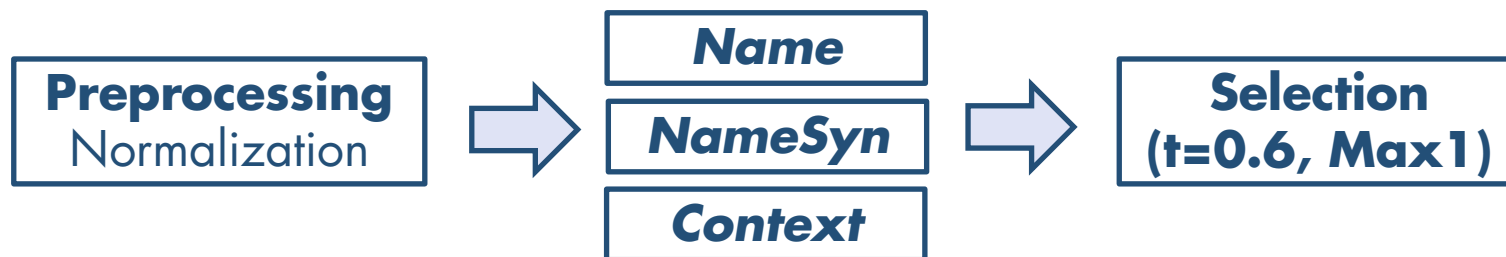
Mapping		ADD	DEL
		Ontologies	
EXT	$\{f_1, g_1\} \cup \{f_2\}$	2/3	0
RED	$\emptyset \cup \{d_2\}$	0	1
REV	$\{b_1\} \cup \{e_2\}$	1/2	1/2

# EVALUATION SETUP

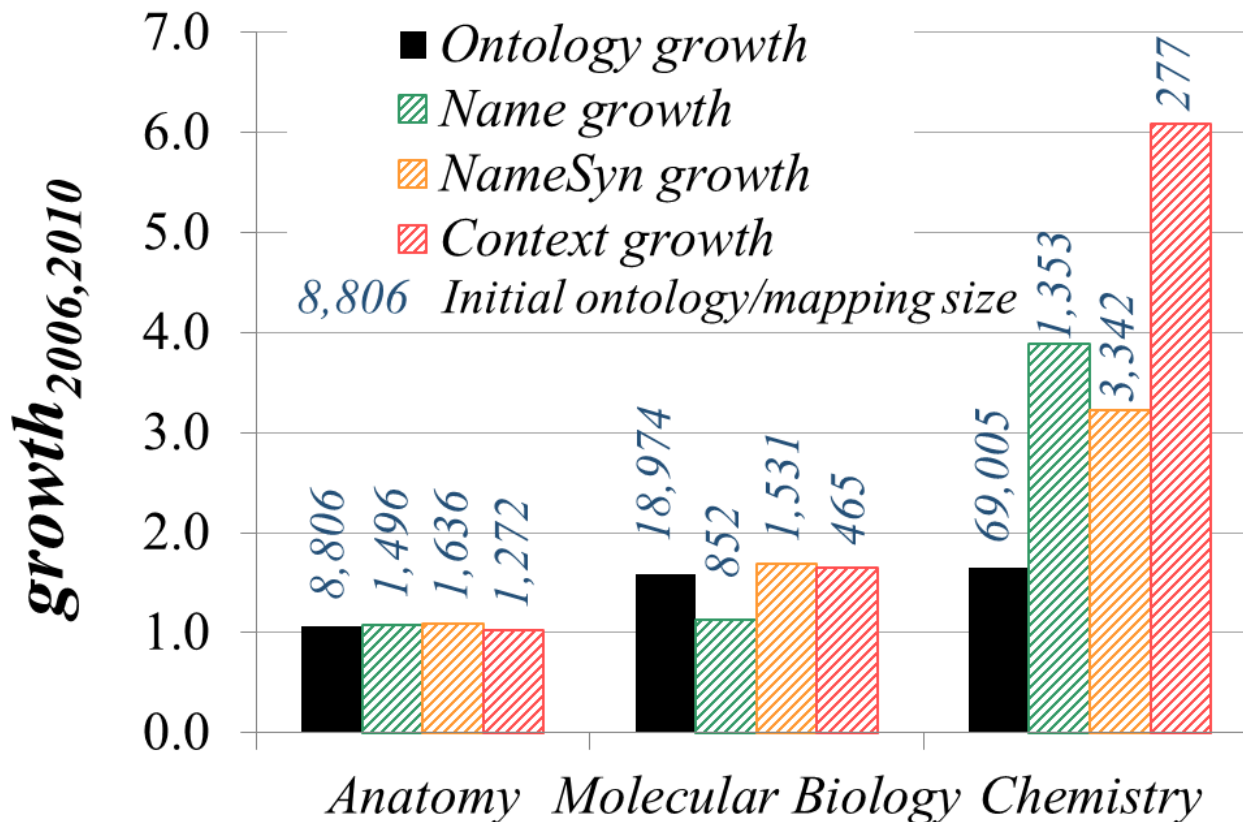
	<h2>Anatomy</h2>		Adult Mouse Anatomical Dictionary (MA)	NCI Thesaurus Anatomy part (NCITa)	
	<h2>Molecular Biology</h2>		Molecular Functions (MF)	Biological Processes (BP)	
	<h2>Chemistry</h2>		Chemical Entities of Biological Interest (ChEBI)	NCI Thesaurus (NCIT)	



- Meta-data based matchers

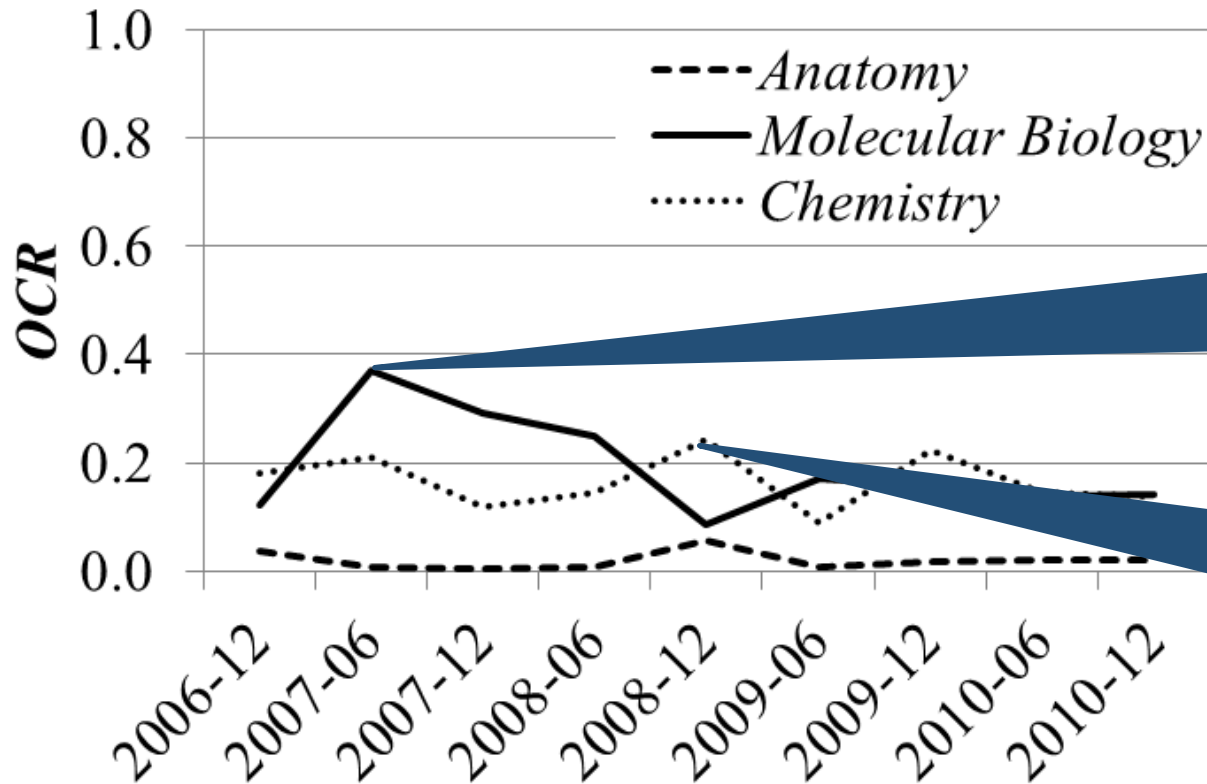


# ONTOLOGY AND MAPPING GROWTH



- Slight ontology growth for *Anatomy* (10%)
- 60-70% for *MolecularBiology* and *Chemistry*
- Mapping growth similar to ontology growth, except for chemistry

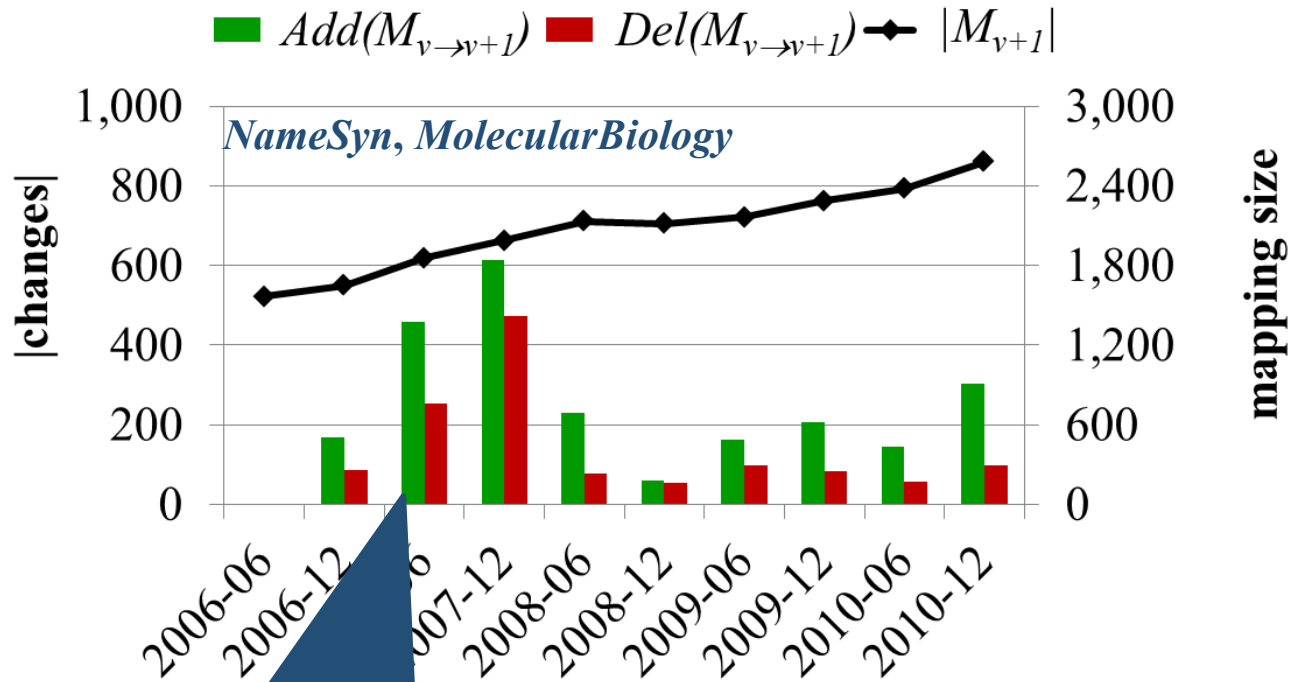
# ONTOLOGY CHANGE RATIO



**Heavy changes  
for Molecular  
Biology  
(nearly 40%)**

**Chemistry  
OCR around  
20%**

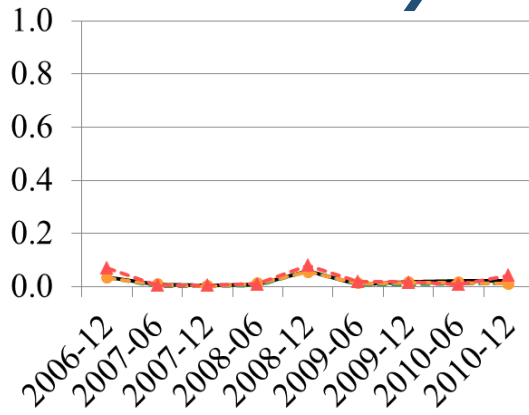
# MAPPING CHANGES



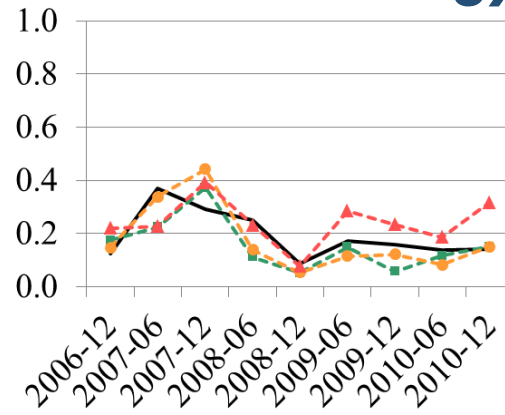
**More correspondence additions  
+ High degree of deletions**

# CHANGE RATIOS

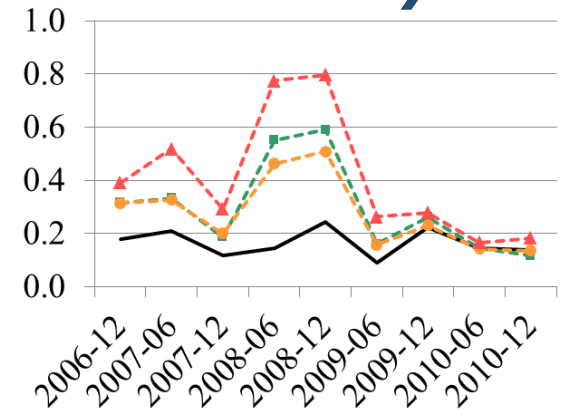
## Anatomy



## MolecularBiology



## Chemistry



—OCR

- - MCR(Name 0.6)

- - MCR(NameSyn 0.6)

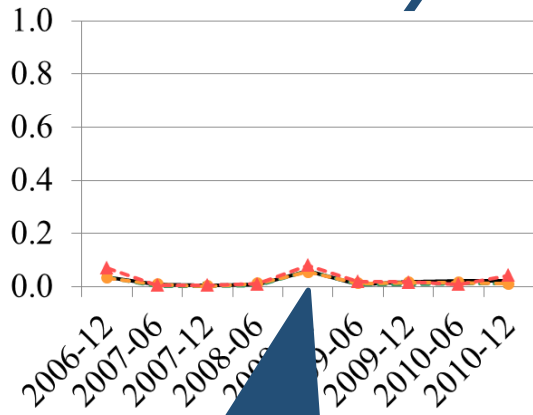
- - MCR(Context 0.6)

# CHANGE RATIOS

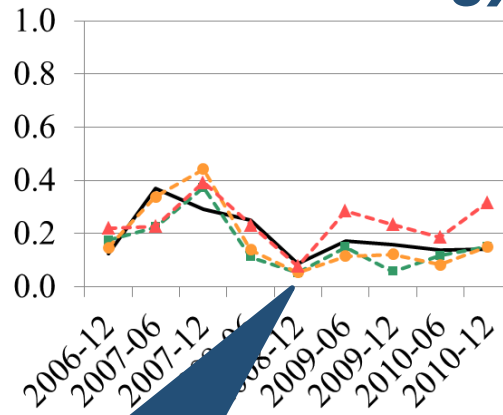
**Anatomy: few mapping changes, relatively stable**

**MolecularBiology, Chemistry: high degree of mapping changes (10 - 80 %)**

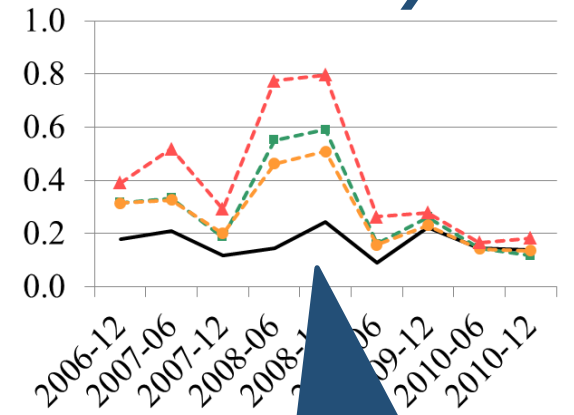
## Anatomy



## MolecularBiology



## Chemistry



—OCR

- -MCR(Name 0.6)

- -MCR(NameSyn 0.6)

- -MCR(NameContext 0.6)

**Correlation between ontology and mapping change factors**

**Different stability for different matchers**  
**Name: relatively stable**  
**Context: most unstable**

# IMPACT OF ONTOLOGY CHANGES ON MAPPING CHANGES

	Ext	IR <sub>Ext</sub>		Red	IR <sub>Red</sub>		Rev	IR <sub>Rev</sub>	
		→Add	→Del		→Add	→Del		→Add	→Del
<b>Anatomy</b>	95	<b>18.7%</b>	0.1%	7	0.0%	<b>7.8%</b>	89	<b>6.8%</b>	<b>4.1%</b>
<b>Molecular Biology</b>	2,359	<b>4.6%</b>	0.7%	223	2.4%	<b>8.8%</b>	2,209	<b>3.5%</b>	<b>2.1%</b>
<b>Chemistry</b>	8,377	<b>11.7%</b>	1.2%	366	3.5%	<b>5.3%</b>	6,441	<b>8.1%</b>	<b>4.0%</b>

**Most  
correspondence  
additions are  
caused by  
ontology  
extensions**

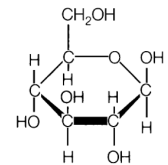
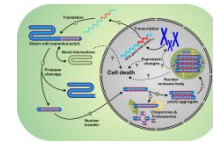
**Most  
correspondence  
deletions are  
caused  
by ontology  
reductions**

**Surprisingly high  
degree of mapping  
changes caused  
by ontology  
revisions**



# CONCLUSIONS & FUTURE WORK

- Study the evolution of ontology mappings
  - General evolution scheme and measures (change factors)
- Evaluation for ontology mappings in three life science domains + comparison of three match strategies
  - Correlation between ontology and mapping change factors
  - Different stability for different match techniques and domains
  - Impact of ontology on mapping changes
    - Most correspondence *Add* / *Del* are caused by ontology *Ext* / *Red*
    - Surprisingly high degree of mapping changes caused by ontology *Rev*



## Future Work

- Use known ontology changes to semi-automatically adapt ontology mappings (without completely new mapping determination)

# HOW DO COMPUTED ONTOLOGY MAPPINGS EVOLVE? A CASE STUDY FOR LIFE SCIENCE ONTOLOGIES



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"EVOLUTION OF ONTOLOGIES AND MAPPINGS"