

# Ontology Evolution and Regression Analysis

Insights into Ontology Regression Testing

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#### **Motivation**

Current studies of Ontology Evaluation tend to:

- Focus on individual ontology versions
- Focus on shifts in the gross statistics

In either case we don't get objective and systematic evaluations of the life span of the ontology

Our goal is to extract insightful and useful information out of all the existing versions of an ontology



### **Ontology Testing Challenge**

- How do we systematically identify test areas?
- How do we systematically analyse change impacts to the ontology?

How can we effectively minimise testing efforts and cost and still achieve adequate testing coverage



### **Software Testing**



# The University of Manchester

# Software Regression Testing What is it?

- It is a test activity to systematically re-test existing components after software changes
- It test against current and updated requirements







# Software Regression Testing Testing Aspects

- Testing at the functional requirements
  - Unit Level
  - System Level
- Testing at the non-functional requirements

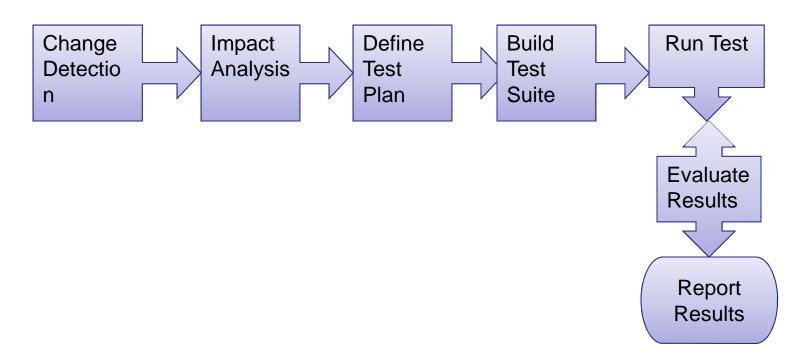


# Software Regression Testing Testing Plan

- Defines testing criteria
- Identifies test area or components
- Test execution strategy
- Test evaluation strategy
- Updates test and other relevant documentation

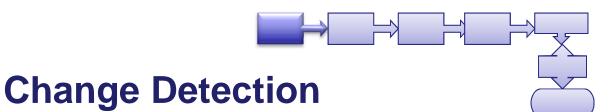


# Software Regression Testing Process



### **Ontology Regression Testing?**





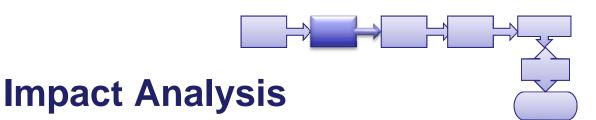
#### Explicit Changes

- Asserted logical and annotation axioms
- Properties
- Classes

#### Implicit Changes?

- Subsumption changes
- Entailment changes





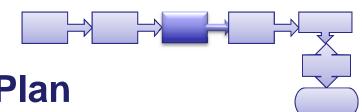
– Intentional Difference analysis?

Previous Version or all versions?

- Justifications analysis?
- Information Content?
  - Asserted content?
  - Entailed content?
- Requirements Impact?
  - Functional and Non-functional?
  - Which ones do we test?





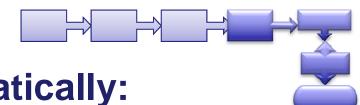


#### **Define Test Plan**

- Test criteria?
- Test area? Do we have test areas?
- How can the test be systematically run?
- Can results be interpreted?







### Can we systematically:

- Build test suites?
- Run tests?
- Evaluate results?
- Re-run tests if necessary?





### Manually test cases

- Check against a methodology
- Eyeballing

#### Automated test cases

- Satisfiability
- Inconsistency





### Manually test cases

- Time consuming
- Subjective
- Unsystematic

#### Automated test cases

- Reasoner based
- Limited in scope

# Can we expand the range of automatic test suites?

### YES

### **By Analysing Ontology Dynamics**

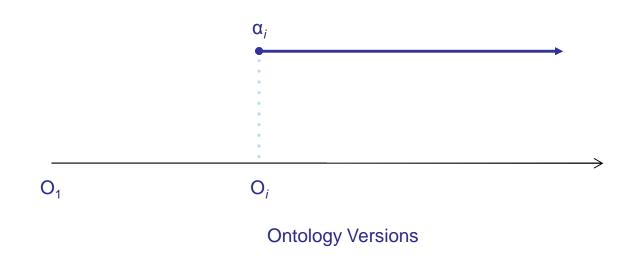


### **What are Ontology Dynamics?**

- Periods of growth, decline, and stability
- Axioms presence
- Types of axioms presence (e.g. continual, interrupted)
- Sequence editing types and patterns

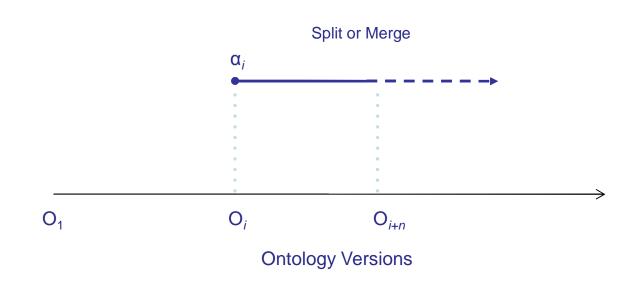


# Axiom Life Span - We expect: Axioms with Constant Unchanged Presence



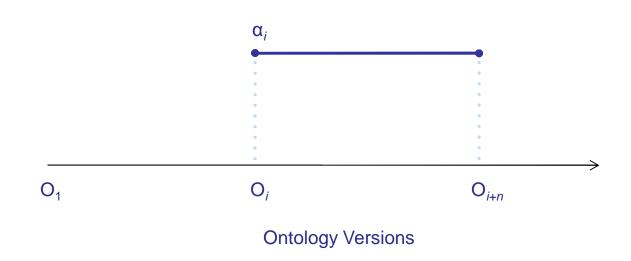


### **Axiom Life Span - We expect: Axioms that are Modified**





# Axiom Life Span - We expect: Axioms that Enter and Leave the Ontology



### **NCIt Ontology Dynamics**



#### **National Cancer Institute Thesaurus (NCIt)**

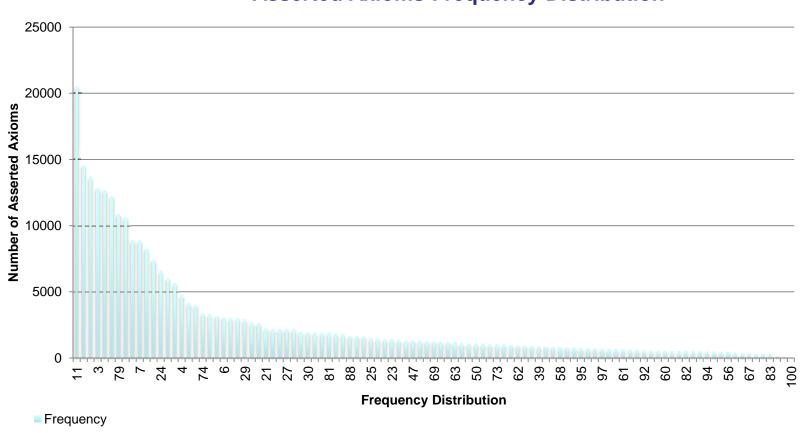
- The National Cancer Institute (NCI) is a U.S. government funded organisation for the research of causes, treatment, and prevention of cancer
- The NCIt is an ontology written in the Web Ontology Language (OWL) which supports the development and maintenance of a controlled vocabulary about cancer research
- Multiple publications about process, quality control, usage, and critiques
- Publicly available monthly releases and concept change logs

Rich source of ontology evolution data



#### NCIt Dynamics – Axioms Life Span Analysis

#### **Asserted Axioms Frequency Distribution**





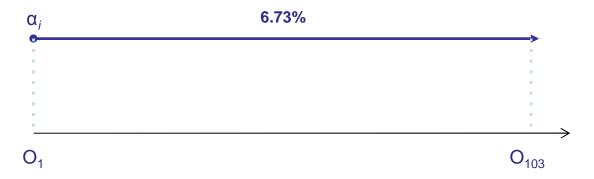
# NCIt Change Dynamics – Detailed View of Axiom Life Span

Frequency	Axiom Count	Appearing in version 103	Consecutive Appearance	Non-consecutive Apperance	
11	20,520	358	99.67%	0.33%	
5	14,586	831	99.99%	0.01%	
2	13,680	445	76.80%	TBC	
3	12,806	664	99.98%	0.02%	
87	12,689	12,669	99.86%	0.14%	
1	12,219	47 version 102; 2,084 version 103	N/A	N/A	
79	10,910	10,866	99.93%	0.07%	
8	10,662	599	99.93%	0.07%	
103	8,933	8,933	100.00%	0.00%	

**Top Ten Frequency Distributions** 



#### NCIt Axiom Life Span: Axioms with Constant Unchanged Presence

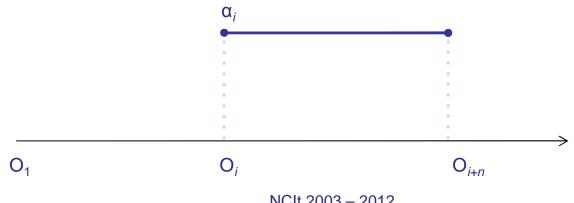


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#### NCIt Axiom Life Span: Axioms that Enter and Leave the Ontology

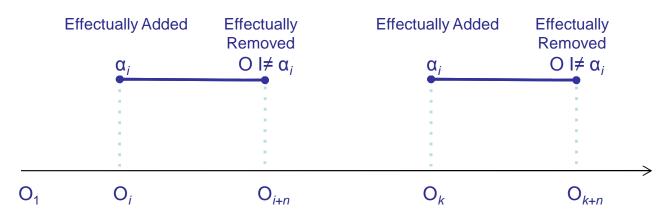


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# NCIt Axiom Life Span: Axioms with <u>Gaps</u> between Unchanged Presence

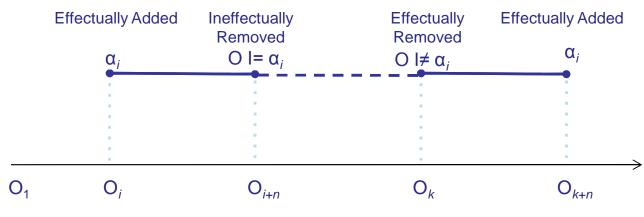


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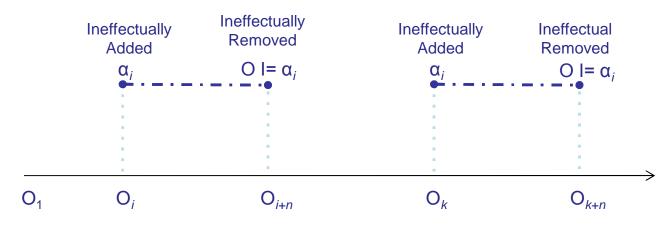


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#### **NCIt Dynamics – Editing Patterns**

Frequency	Axiom IDs	First version	1, USS (1, 185)	Effectual	Ineffectual	Ineffectual	Last version
rate		in NCIt	addition version	removal version	addition version	removal version	in NCIt
	57506, 58364	4	4,7	5, 17		[- 3	16
	103206, 105069	7	7	26	25	17	25
11	110594	10			10, 31	20, 32	31
	210295	40	40, 51	47, 55	0.00	E APA S	54
	215592, 215897	50	50		98	55	103
5	157661	20	20		45	24, 46	45
	49544, 50602	2	2,4	3,5			4
	50858	2	2, 18	3, 19	2.00		18
- 6	99659	6	6	17	16	7	16
2	120551	12	12, 16	13, 17			16
	127241	16	16		21	17, 22	21
	172613, 172917	25	25, 62	26, 63		10	62
	159025	21	21, 27	22		29	28
3	257839	83	83, 93, 103	84, 94			103
	3241	1	1		23	7	103
1	12085	1	1		33	17	103
	30433	1	1, 14, 89	12, 75			103
	39267	1	1, 18	2			103
	68617	5	5, 18	6			103
87	106537, 106569, 106569, 107407, 107860, 107952, 108468	9	9		25	17	103
	111380, 114579	10	10		24	17:	103
1	118516, 119326	12	12, 79	74			103
	121919, 122832	13	13, 51	47			103
	6838, 44135	1	1	86	23	17	85
	8905	1	1,30	6			103
70	42533	1	1	100000	41	17	103
79	44135	1	1	86	23	17	85
	125718, 125895	15	15, 29	19			103
	162303	23	23, 94	93, 103			102
t	162304	23	23, 36	34		S (6	103
	22465	1	1	52	45	2	51
	67505	5	5, 10	6, 17			16
8	153578	.17.			17, 20	18, 27	26
٥	215709	50	50	2000	99	53	103
	238416, 238488	72	72, 103	79			103
	262226	87	87, 94	93, 96			95



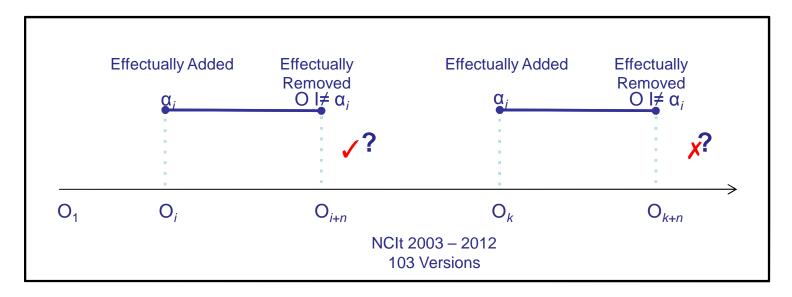


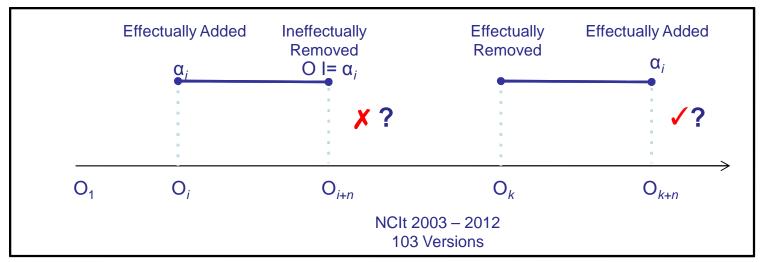
### **NCIt Regression Analysis – Main Finding**

This means that we are able to identify 'bugs', the sequence pattern of these bugs, and their location!



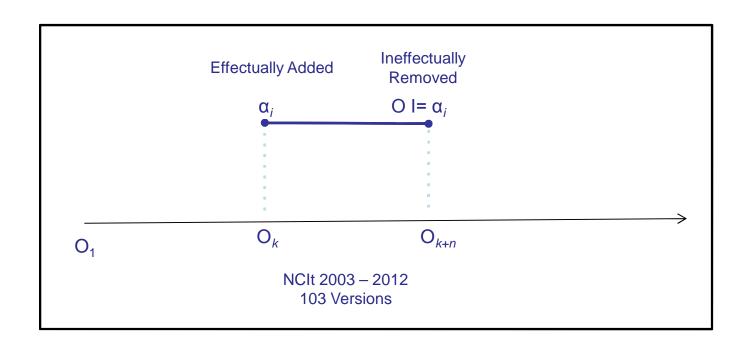
# NCIt Regression Analysis: <a href="Indicative">Indicative</a> of Faults In Sequence of Changes







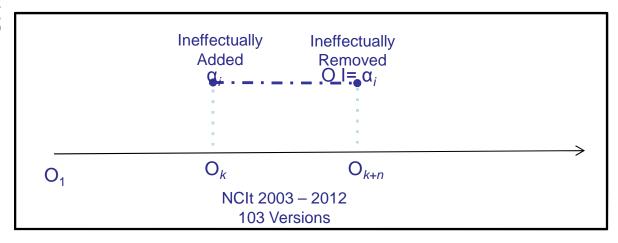
# NCIt Regression Analysis: <u>Suggestive</u> of Faults In Sequence of Changes



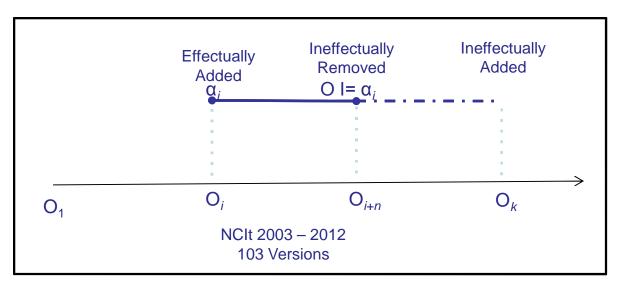
Refactoring



# NCIt Regression Analysis: <u>Suggestive</u> of Faults In Sequence of Changes

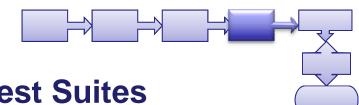




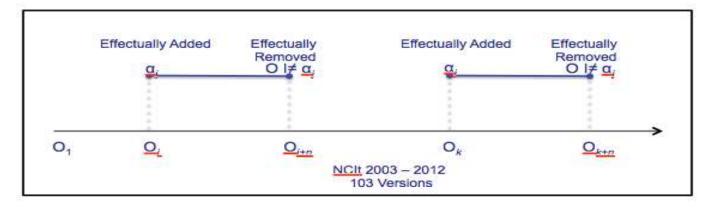


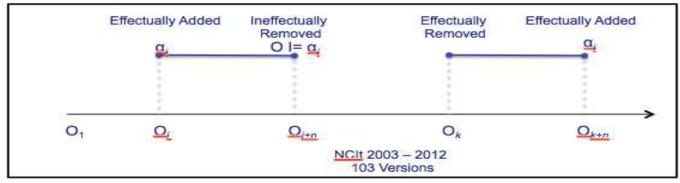
# From Change Dynamics to Ontology Regression Testing





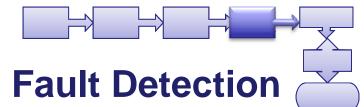
#### **Systematically Build Test Suites**





**Indicative** of Faults In Sequence of Changes





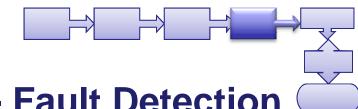
### **Automated Test Suites - Fault Detection**

- It provides systematic regression test for all version of the ontology
- It conclusively identifies content regression and content refactoring
- It suggests other faults based on regression sequence

It is efficient and cheap to run

And there are still more potential benefits ...





#### **Automated Test Suites - Fault Detection**

- Entailment Set Studies
- Sub Domain Dynamics
- Ontology Classes Dynamics

. . .

#### **Thanks**