

# Conceptual Code Mining

(work in progress)

Pr. Kim Mens INGI / UCL Dr. Tom Tourwé SEN / CWI



Monday, May 3rd 2004

# Software evolution and aspect-oriented programming

### Three important research goals

- 1. automatically identify crosscutting concerns
  - based on pattern matching, clone detection, logic reasoning, formal concept analysis, ...
- refactor/restructure object-oriented programs into aspect-oriented ones
- 3. deal with evolution of aspect-oriented programs
  - aspect refactoring
  - co-evolution of base program and aspects





- Relation to "Software evolution and AOP"
- A crash course in formal concept analysis
- Mining for croscutting concerns with FCA
- Overall approach
- The substring experiment in detail
- The parsetree experiment
- Conclusion

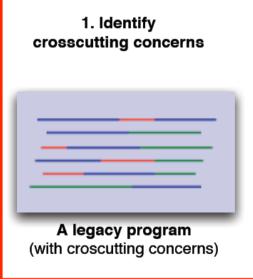


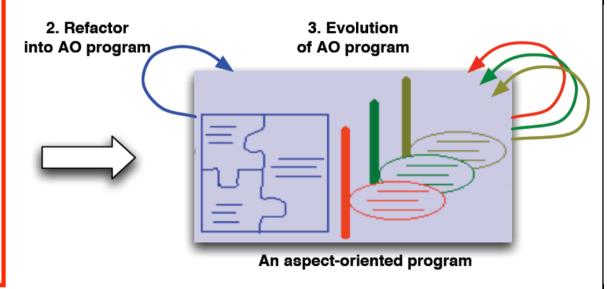
#### Research idea:

Mining for croscutting concerns
using Formal Concept Analysis



# Software Evolution and Aspect-Oriented Programming











- Relation to "Software evolution and AOP"
- A crash course in formal concept analysis
- Mining for croscutting concerns with FCA
- Overall approach
- The substring experiment in detail
- The parsetree experiment
- Conclusion





## Formal Concept Analysis (FCA)

#### Starts from

- a set of elements
- a set of properties of those elements
- Determines concepts
  - Maximal groups of elements and properties
  - Group:
    - Every element of the concept has those properties
    - Every property of the concept holds for those elements
  - Maximal
    - No other element (outside the concept) has those same properties
    - No other property (outside the concept) is shared by all elements





## Example: Elements and Properties

	object- oriented	functional	logic	static typing	dynamic typing
C++	×	-	-	×	-
Java	×	-	-	×	-
Smalltal	k X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	X	-	X





	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	1	X	-
Java	X	-	1	X	-
Smalltalk	X	-	-	-	×
Scheme	-	X	-	-	X
Prolog	-	-	X	-	X





	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	1	X	-
Java	X	-	-	X	-
Smalltalk	X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	X	-	X





	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	-	X	-
Java	X	-	-	X	-
Smalltalk	X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	×	-	×





	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	-	X	-
Java	X	-	-	X	-
Smalltalk	X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	X	-	X





	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	-	X	-
Java	X	-	-	X	-
Smalltalk	X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	X	-	X





	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	-	X	-
Java	X	-	-	X	-
Smalltalk	X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	X	-	X



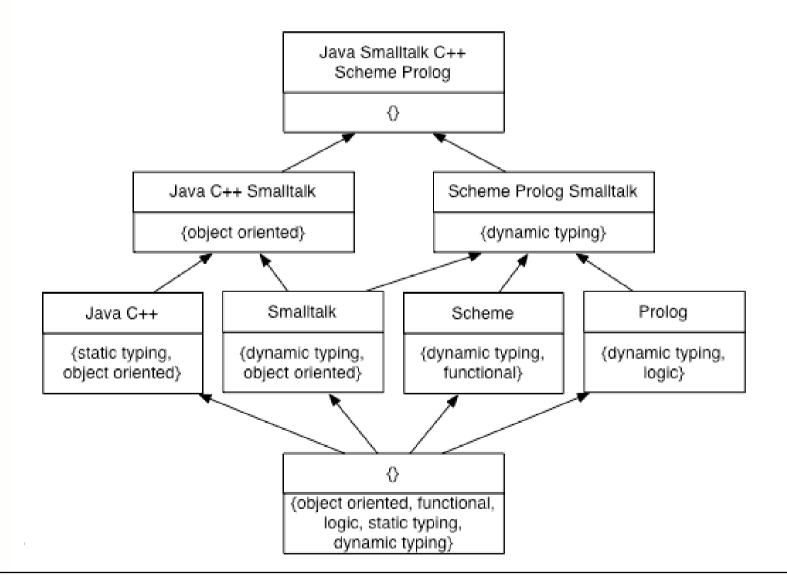


	object- oriented	functional	logic	static typing	dynamic typing
C++	X	-	-	X	-
Java	X	-	-	X	-
Smalltalk	X	-	-	-	X
Scheme	-	X	-	-	X
Prolog	-	-	X	-	×





### Concept Lattice









- Relation to "Software evolution and AOP"
- A crash course in formal concept analysis
- Mining for croscutting concerns with FCA
- Overall approach
- The substring experiment in detail
- The parsetree experiment
- Conclusion





# Mining for crosscutting concerns with formal concept analysis

#### First Step

- Use substrings of class, method & parameter names to group related source code elements
- Relies on coding conventions
- Assumes that elements corresponding to a same concern will have a similar name

#### Next step

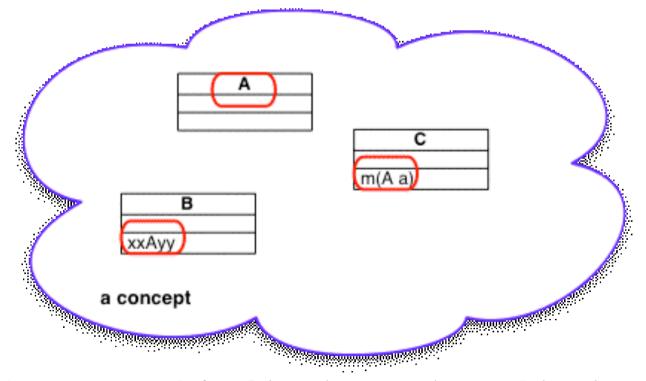
- Use generic parse trees to group source code that implements similar behaviour
- Looks for recurring patterns in the source code
- Similar to clone detection, but more advanced
- Assumes that elements corresponding to a same concern will have similar code





## Substring Concepts

- Elements: classes, methods, parameters
- Properties: substrings of classes, methods, ...

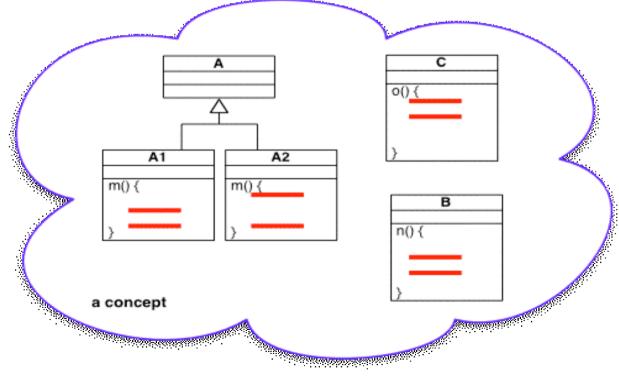






### Parse tree Concepts

- Elements: methods
- Properties: generic parse tree elements









- Relation to "Software evolution and AOP"
- A crash course in formal concept analysis
- Mining for croscutting concerns with FCA
- Overall approach
- The substring experiment in detail
- The parsetree experiment
- Conclusion





### Overall approach

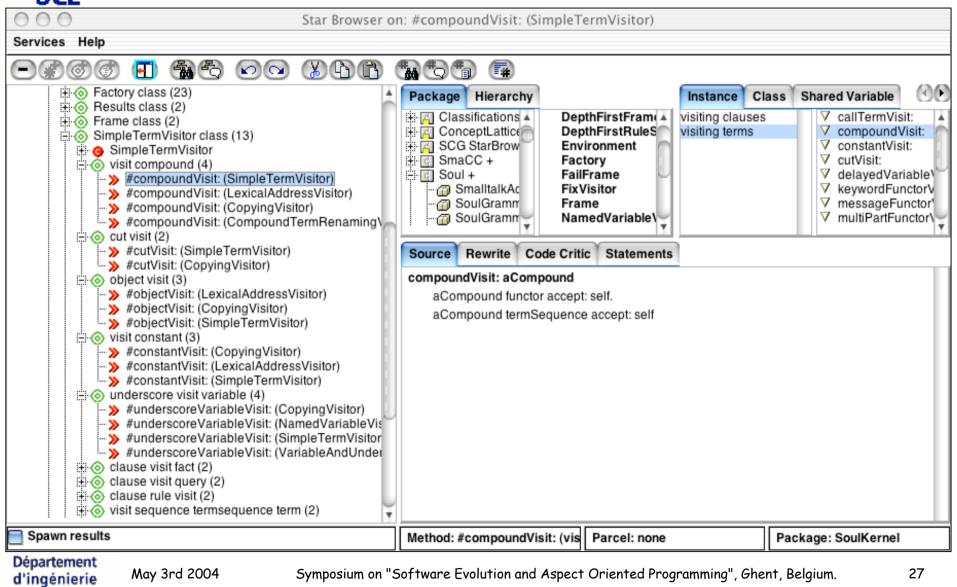
- Generate elements & properties for FCA algorithm
  - ✓ Pre-filter irrelevant ones
- 2. Concept Analysis
  - ✓ Find relevant groupings of elements in source code
- 3. Filtering
  - ✓ Remove irrelevant concepts (false positives, noise, useless, ...)
- 4. Classification
  - ✓ Classify results according to relevance for user
- 5. Analyse unclassified concepts
  - ✓ Manually analyse concepts that were not classified automatically
- 6. Completion of concepts
  - ✓ Some concepts are relevant but need to be completed to represent reality correctly





informatique

# Our Conceptual Code Mining Tool







- Relation to "Software evolution and AOP"
- A crash course in formal concept analysis
- Mining for croscutting concerns with FCA
- Overall approach
- The substring experiment in detail
- The parsetree experiment
- Conclusion







- We want to group elements that share a substring
- Problem:
  - "Having a substring in common" is binary
  - FCA properties are unary
    - Does an element satisfy the property or not?
- Solution:
  - Every substring corresponds to an FCA property
    - Does an element have this substring in its name?
  - Generate relevant substrings
    - · Based on where uppercases occur in an element's name
      - QuotedCodeConstant { quoted, code, constant }
    - Filter substrings that produce too much noise





# The substring experiment 2. Concept Analysis - a concept (1)

#### AbstractTerm

unifyWithVariable:inEnv:myIndex:hisIndex:inSource: unifyWithCompound:inEnv:myIndex:hisIndex:inSource; unifyWithSmalltalkTerm:inEnv:myIndex:hisIndex:inSource unifyWithQuotedCodeTerm:inEnv:myIndex:hisIndex:inSource::

#### Variable

unifyWithVariable:inEnv:myIndex:hisIndex:inSource: unifyWithCompound:inEnv:myIndex:hisIndex:inSource: unifyWithSmalltalkTerm:inEnv:myIndex:hisIndex:inSource: unifyWithQuotedCodeTerm:inEnv:myIndex:hisIndex:inSource:

#### CompoundTerm

unifyWithVariable:inEnv:myIndex:hisIndex:inSource: unifyWithCompound:inEnv:myIndex:hisIndex:inSource;



Département

d'ingénierie informatique

#### SmalltalkTerm

unifyWithVariable:inEnv:myIndex:hisIndex:inSource: unifyWithSmalltalkTerm:inEnv:myIndex:hisIndex:inSource:

#### QuotedCodeTerm

unifyWithVariable:inEnv:myIndex:hisIndex:inSource: unifyWithQuotedCodeTerm:inEnv:myIndex:hisIndex:inSource:



# The substring experiment 2. Concept Analysis - a concept (2)

	unify	index	env	source	message	functor	variable	
Object>>unifyWithObject: inEnv: myIndex: hisIndex: inSource:	X	X	Х	Х	-		-	
Variable>>unifyWithMessageFunctor: inEnv: myIndex: hisIndex: inSource:	X	X	X	X	Х	X	1	
AbstractTerm>>unifyWith: inEnv: myIndex: hisIndex: inSource:	X	X	Х	X	-	-	-	
AbstractTerm>>unifyWithVariable: inEnv: myIndex: hisIndex: inSource:	X	X	X	X	-	X	X	:
	X	X	Х	X				





# The substring experiment 2. Concept Analysis - a concept (2)

	unify	index	env	source	message	functor	variable	::
Object>>unifyWithObject: inEnv: myIndex: hisIndex: inSource:	Х	X	Х	Х	-		-	
Variable>>unifyWithMessageFunctor: inEnv: myIndex: hisIndex: inSource:	Х	X	Х	Х	Х	X	-	
AbstractTerm>>unifyWith: inEnv: myIndex: hisIndex: inSource:	Х	Х	Х	Х	-	-	-	:
AbstractTerm>>unifyWithVariable: inEnv: myIndex: hisIndex: inSource:	Х	X	Х	Х	-	X	Х	
	Х	Х	Х	Х				







Case study	#elements	#properties	#raw concepts	#combined concepts	time (sec)
	4440	400	•		, ,
Soul	1469	439	1197	593	29
StarBrowser	512	262	500	196	5
CodeCrawler	1370	478	1502	699	37
CA tool	750	238	656	347	7

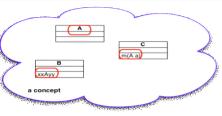


- Without filtering
- | properties | < | elements | is a good sign
- Time to compute = a few seconds
- Lots of noise and some false positives
  - Better filtering & classification needed







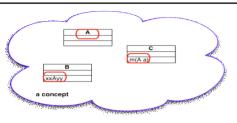


- Irrelevant substrings are already filtered
  - with little meaning: "do", "with", "for", "from", "the", "if True", ...
  - too small (< 3 chars)
  - ignore plurals, uppercase and colons
- More filtering needed
  - Drop top & bottom concept when empty
  - Drop concepts with only one element
  - Recombine substrings belonging together
  - Require some minimal coverage of element name by properties
  - Concepts higher in the lattice (more properties) may be more relevant
  - Avoid redundancy in discovered concepts
    - · Make better use of the lattice structure (Now it is "flattened")
- Ongoing work





# The substring experiment 4. Classification



- In single class
  - Accessors
  - Chained messages
  - Delegating methods
  - Similar signatures
- Too few elements
- In same hierarchy

May 3rd 2004

- Polymorphic methods
- Substring shared by method name & parameter name
- Similar signatures
- Similar class names

- Croscutting
  - Polymorphic methods
  - Substring shared by method name & parameter name
  - Similar signatures
  - Similar class names
- Substring shared by method name & class name
- Substring shared by class name & parameter name
- Unclassified



These seem most relevant when mining for concerns



# The substring experiment Discovered aspectual views (Soul)

- Programming idioms
  - Accessor methods (accessors)
  - Polymorphism (hierarchy methods)
- Design patterns (hierarchy methods)
  - Visitor, Abstract Factory,
     Observer
- Features
  - "Unification" (hierarchy methods)
  - Crosscutting class-related behaviour (class name in keyword & class name in parameter)
  - "Bindings", "Horn clauses", "resolution" (unclassified)
- Code duplication

(methods in single class & crosscutting methods)



Symposium on "Software Evolution and Aspect Oriented Programming", Ghent, Belgium.



An aspectual view is

a set of source code entities,

such as classes, methods

and parameters, that are

structurally related and

often crosscut the entire

source code.





- Relation to "Software evolution and AOP"
- A crash course in formal concept analysis
- Mining for croscutting concerns with FCA
- Overall approach
- The substring experiment in detail
- The parsetree experiment
- Conclusion





### Conclusion

#### Current status

- Substring experiment already performed, but needs refinement
  - · Mainly more advanced filtering
- Parse tree experiment seems promising complement / extension to already existing experiment
- Enough to detect aspects?

#### Future work

- Work out parse tree experiment
- Check it on a real aspect program: are the weaved aspects discovered by the approach?

