

# *INTIMALS*

INTELLIGENT MODERNISATION  
ASSISTANCE FOR LEGACY SOFTWARE

14 September 2017 – 9:30

# PROBLEM & context



## raincode LABS

*compiler  
experts*

*migration &  
maintenance  
services*

*modernise  
Legacy  
Software*

**Increasing demand**  
for such services

Current approaches require  
significant **manual work**

financial, retail, LOGISTICS, Government, ...

# Goal



*Towards an intelligent modernisation assistant for legacy software*

Key Idea

**Automating** migration requires **pattern discovery**

# consortium



Partners know each other well

Have overlapping expertise in

- ❑ Programming languages, software and language engineering

And complementary expertise in

- ❑ **Compiler** technology and language **modernisation** (Raincode Labs)
- ❑ Pattern **mining** and software **evolution** (UCL)
- ❑ Pattern **matching** and software **analysis** (VUB)

# Goal



*Towards an intelligent modernisation assistant for legacy software*

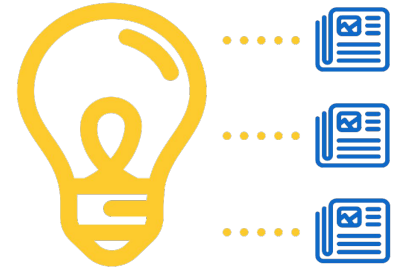
key idea

**Automating** migration requires **pattern discovery**

Mining  $\neq$  kinds of **patterns** in **3 use cases** for **3 objectives**

	use case 1	use case 2	use case 3
Objective A			
Objective B			
Objective C			

# uses cases



## use case 1

**Coding idioms** and  
programming  
**conventions**

Syntax of code

## use case 2

**Library usage**  
**protocols** and  
**violations**

Semantics of code

## use case 3

**Systematic edits** or  
**repetitive changes**

Evolution of code

# OBJECTIVES



## Objective A **Program comprehension**

Provide insights in legacy code

## Objective B **Anomaly detection**

Detect potential inconsistencies in legacy code

## Objective C **Modernisation assistance**

Provide recommendations to engineers for improving legacy code

# AMBITION



use case 1  
**Coding idioms** and  
programming  
conventions

use case 2  
**Library usage**  
protocols and  
violations

use case 3  
**Systematic edits** or  
repetitive changes

Objective A  
**Program**  
comprehension

Undiscovered syntactic  
patterns

***Replace** by macros or  
language built-ins*

API, library, framework  
usage patterns

***Refactor** based on  
understanding*

Locations frequently  
subject to past edits

***Refactor** to avoid future  
changes there*

Objective B  
**Anomaly detection**

Code deviating from  
expected patterns

***Rewrite** to adhere to  
expected pattern*

Violations of API and  
library usage patterns

***Correct** violations to fix  
faulty code*

Locations similar to but  
not included in past  
systematic edits

***Reapply** systematic  
edits to these locations*

Objective C  
**Modernisation**  
assistance

Propose actions to im-  
prove respect of idioms

***Suggest** to complete or  
transform code*

API, library, framework  
usage

***Suggest** correct use of  
API according protocol*

Frequently executed  
past edits

***Suggest** complete edit  
based on partial edit*



# MOTIVATING EXAMPLE



```
map STD_RTRN_INFO of SYSTEM_NAME_MNT_SRV_O  
to   STD_RTRN_INFO of STD_MSG_DIS_I
```

```
map CAPTION_TEXT of STD_CLIENT_PARM_V of SYSTEM_NAME_PD_W  
to   CAPTION_TEXT of STD_MSG_DIS_I
```

```
use rule STD_MSG_DIS nest
```

```
map ACTN_CD of STD_MSG_DIS_O  
to   ACTN_CD of STD_CLIENT_PARM_V of SYSTEM_NAME_PD_W
```

```
ActionCode := MessageDisplay(CaptionText, ReturnInfo);
```

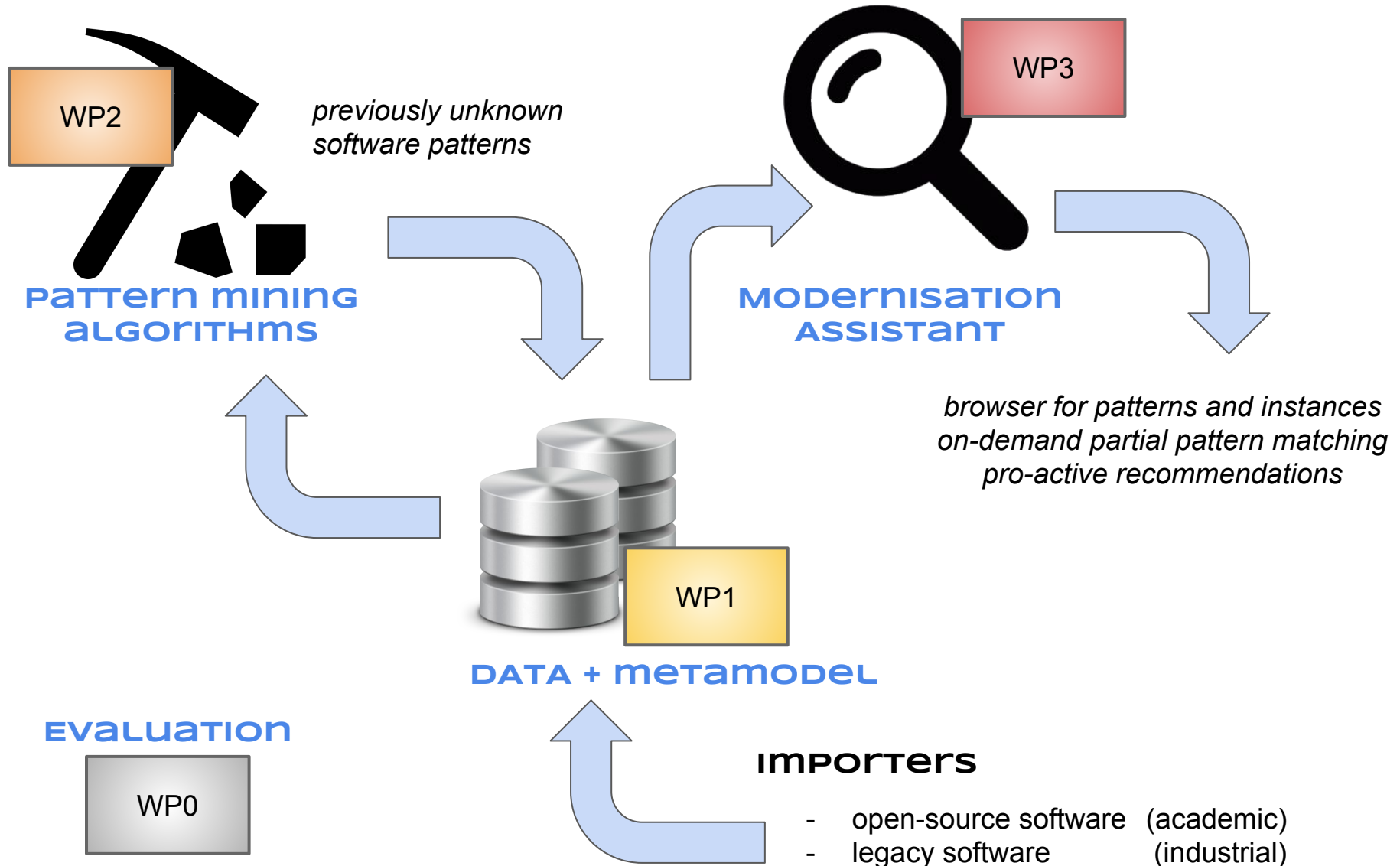
# DISTINGUISHING Features



The modernisation assistant will

- ❑ Give **proactive** advice to Raincode Labs' engineers
  - ❑ To support them in their renovation efforts
- ❑ Automatically discover *previously unknown patterns*
  - ❑ For our **3 use cases** and **3 objectives**
- ❑ Growing library of mined patterns
  - ❑ More patterns uncovered ⇒ **more intelligent** suggestions
- ❑ **Learn** from experience and feedback

# APPROACH



# WORK PACKAGES



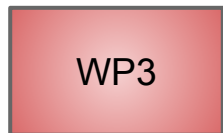
**Evaluation** of developed system on legacy systems (**RL**)



Data and **meta-model** for software repositories and software patterns (**VUB**, **UCL**, **RL**)



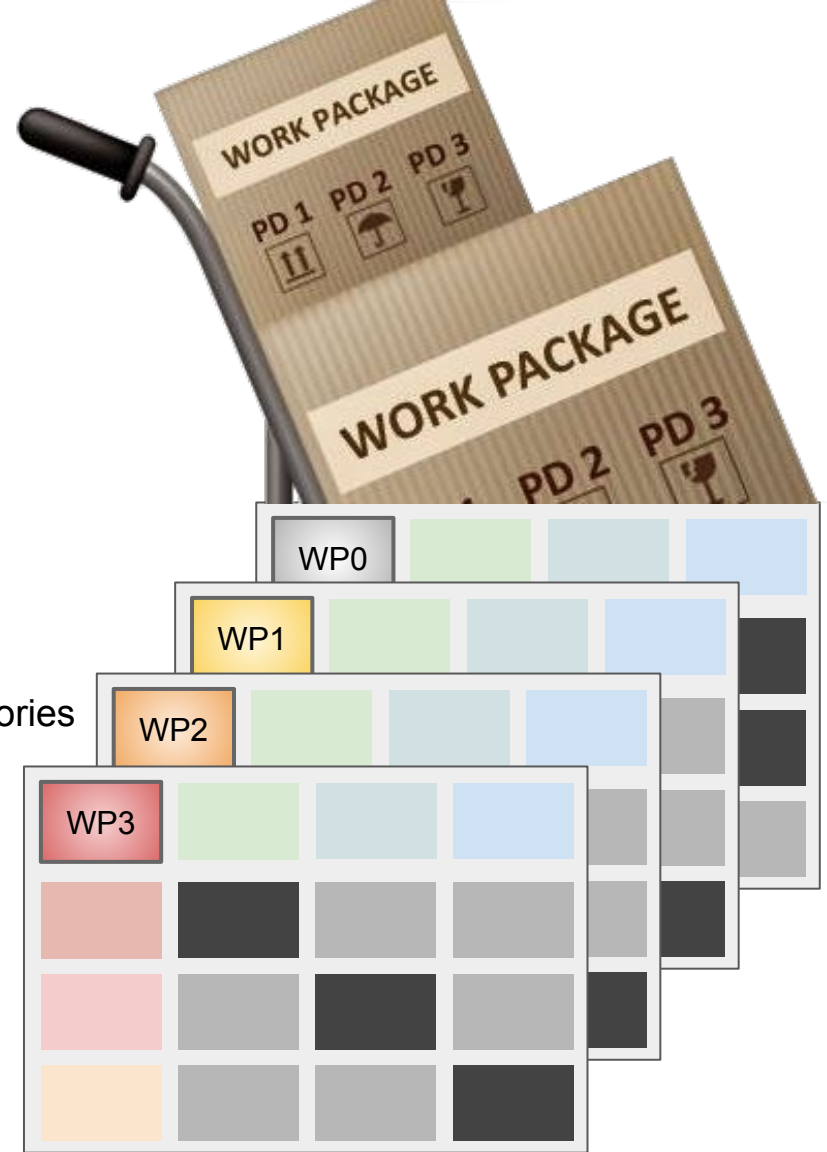
**Pattern mining** algorithms (**UCL**, **VUB**)



Pro-active **modernisation assistant** (**VUB**, **UCL**, **RL**)



Project coordinator (**VUB**)





# PROJECT CONTRIBUTIONS



## **Scientific** contributions to the **AI** field

pattern mining over source code: “*Big Code*”

frequent subgraph mining algorithms for property-based graphs

supporting pattern-specific relevance constraints

## **Scientific** contributions to the **SE** field

language-parametric meta-model

partial pattern matching algorithms against modernisation context

modernisation support based on mined idioms, usage patterns, edit patterns

## **Technical** contributions

prototype of an intelligent modernisation assistant

importers for legacy programming languages

# Economic Valorisation (Raincode Labs)



**Outperform competition** through unique selling features (niche market)

**automation** of understanding, migration and renovation of legacy software

increased **customer intimacy** because patterns can be customer-specific

Easy to address **new markets**

other languages and technologies

Increased **quality of services** and improved **market share**

increased **sales** and **turnover**

increased **visibility**

**employee retention** and **staff growth**

# Economic Valorisation (BRUSSELS-CAPITAL REGION)



**Strengthen Brussels' position** as strong ICT hub with high-tech companies

through close collaboration between businesses and academia (AI for SE)

and proximity of clients (banks, insurances, IT, retail, logistics, government) in need for expert services to modernise their legacy software systems

**Increased competitiveness**



improving clients' legacy allows them to focus on their core business

new key functionality rather than maintaining and fixing old systems

**Increased employment**

modern software systems are more attractive to young developers

increases employment on the Belgian market (as opposed to outsourcing)



# conclusion



**AI that creates jobs**

**Explore novel pattern mining algorithms**

by treating code and edit history of legacy software as data

**Incorporate them in an intelligent modernisation assistant**

to pro-actively recommend modernisation actions to software engineers

**Learn from past experience and feedback** from engineers

to improve modernisation assistant and discovered patterns

Through an **academic-industrial collaboration**

develop state of the art technology and validate it on industrial cases

To let industrial partner **keep and strengthen its competitive advantage**

by offering improved services and quality

directly beneficial to its clients



**QUESTIONS & ANSWERS**



**BACKUP SLIDES**

# BACKUP SLIDES

- 21. Use cases matrix (E.1.1)
- 22. Work programme (E.3)
- 23. WP1 Meta-model (E.3)
- 24. WP1 Deliverables (E.3)
- 25. WP2 Pattern mining (E.3)
- 26. WP2 Deliverables (E.3)
- 27. WP3 Pro-active modernisation assistant through pattern matching (E.3)
- 28. WP3 Deliverables (E.3)
- 29. WP0 Tasks (E.3)
- 30. WP0 Deliverables (E.3)
- 31. Planning (E.4)
- 32. Budget – Raincode Labs
- 33. Budget – VUB
- 34. Budget – UCL
- 35. Financial details of Raincode
- 36. Consortium agreement and ownership
- 37. AI as job creator
- ...

## (E.1.1) use cases matrix

	<b>Objective A: Program comprehension</b>	<b>Objective B: Anomaly detection</b>	<b>Objective C: Modernisation assistance</b>
<b>Y1: syntactic mining for coding idioms</b>	<i>UC1.A</i> Uncovered syntactic patterns	<i>UC1.B</i> Code is similar but not identical	<i>UC1.C</i> Proposing actions to adhere to idioms and conventions
<b>Y2: semantic mining for usage patterns</b>	<i>UC2.A</i> API, library, framework usage patterns in legacy systems	<i>UC2.B</i> Suspected violations of discovered usage patterns	<i>UC2.C</i> On-demand recommendations to correct violations
<b>Y3: mining changes for edit patterns</b>	<i>UC3.A</i> Frequently changed code locations	<i>UC3.B</i> Near-miss edit matches	<i>UC3.C</i> Automated proactive modernisation aspects
<b>Industrial evaluation of results</b> (WP0 and WP3)	T0.1 legacy importers T0.2 case study T3.1 pattern browser	T0.3 legacy importer T0.4 case study T3.2 on-demand matching	T0.5 legacy importer T0.6 case study T3.3 proactive matching

## (E.3) WORK Programme

**Objective A**  
Program comprehension

**Objective B**  
Anomaly detection

**Objective C**  
Modernisation assistance

**WP1 – Objective D** : Meta-model for software repositories and software patterns (VUB, UCL, **RL**)

**WP2:** Pattern mining algorithms for uncovering software patterns (**UCL**, VUB)

**WP3:** Towards a pro-active modernisation assistant (**VUB**, UCL, RL)

**WP0 – Objective E** : Evaluation of developed technology on legacy systems (**RL**)

**Year 1 – Use Case 1**  
**Year 2 – Use Case 2**  
**Year 3 – Use Case 3**

Syntactic mining for coding conventions & idioms  
Semantic mining for usage patterns  
Mining changes for edit patterns

# WP1: Meta-model for software repositories and patterns

WP leader: RL; Overall effort: 21MMs (M01 to M27)

Effort per partner: RL 3MMs - VUB 9MMs - UCL 9MMs

Task 1.1: meta-model for representing syntactic information and coding idioms

- Task leader: RL; Overall effort: 7MMs (M01–M03)  
Effort per partner: RL 1MMs - VUB 3MMs - UCL 3MMs

Task 1.2: meta-model for representing semantic information and usage patterns

- Task leader: UCL; Overall effort: 7MMs (M13–M15)  
Effort per partner: RL 1MMs - VUB 3MMs - UCL 3MMs

Task 1.3: meta-model for representing version information and edit patterns

- Task leader: VUB; Overall effort: 7MMs (M25–M27)  
Effort per partner: RL 1MMs - VUB 3MMs - UCL 3MMs

# WP1: Meta-model for Software Repositories and Patterns

## Deliverables:

- P1.1 Prototype implementation of the meta-model and an accompanying importer for syntactic information
- P1.2 Prototype implementation of its representation for coding conventions & idioms
- P1.3 Extension of meta-model and importer with support for semantic information
- P1.4 Prototype implementation of its representation for usage patterns
- P1.5 Extension of meta-model and importer with support for change information
- P1.6 Prototype implementation of its representation for edit patterns



# WP2: MINING algorithms for uncovering software patterns

WP leader: UCL ; Overall effort: 36MMs (M04 to M36)

Effort per partner: VUB 18MMs - UCL 18MMs

Task 2.1: Mining to discover syntactic coding conventions and idioms

- WP leader: UCL; Overall effort: 12MMs (M04–M06 + M10–M12)  
Effort per partner: VUB 6MMs - UCL 6MMs

Task 2.2: Mining to discover usage patterns

- WP leader: UCL; Overall effort: 12MMs (M16–M18 + M22–M24)  
Effort per partner: VUB 6MMs - UCL 6MMs

Task 2.3: Mining to discover edit patterns

- WP leader: VUB; Overall effort: 12MMs (M28–M30 + M34–M36)  
Effort per partner: VUB 6MMs - UCL 6MMs

# WP2: MINING algorithms FOR uncovering SOFTWARE PATTERNS

## Deliverables:

- P2.1 Frequent subgraph mining system for discovering patterns in attributed graphs, optimized for directed acyclic graphs
- R2.2 Report on its application to mining for coding conventions & idioms in syntactic information represented according to the meta-model of P1.1
- P2.3 Adaptation of the frequent subgraph mining algorithm to support usage patterns
- R2.4 Report on its application to mining for usage patterns in semantic information represented according to the meta-model of P1.3
- P2.5 Adaptation of the frequent subgraph mining algorithm to support edit patterns
- R2.6 Report on its application to mining for edit patterns in change information represented according to the meta-model of P1.5

# WP3: MATCHING algorithms for modernization assistance

WP leader: VUB; Overall effort: 24MMs (M07 to M33)

Effort per partner: RL 6MMs - VUB 9MMs - UCL 9MMs

## Task 3.1: Browser for inspecting mined coding idioms

- WP leader: RL; Overall effort: 8MMs (M07–M09)  
Effort per partner: RL 2MMs - VUB 3MMs - UCL 3MMs

## Task 3.2: On-demand detection of partial matches within a software snapshot

- WP leader: UCL; Overall effort: 8MMs (M19–M21)  
Effort per partner: RL 2MMs - VUB 3MMs - UCL 3MMs

## Task 3.3: Pro-active detection of matches within current modernisation context

- WP leader: VUB; Overall effort: 8MMs (M31–M33)  
Effort per partner: RL 2MMs - VUB 3MMs - UCL 3MMs

# WP3: MATCHING algorithms FOR modernization assistance

## Deliverables:

- P3.1 Prototype offering assistance for program comprehension in the form of a browser for mined patterns
- P3.2 Prototype offering assistance for anomaly detection in the form of a browser for partial matches of mined patterns
- P3.3 Prototype offering assistance for program modernisation in the form of edit recommendations that complete a partial match for a mined pattern

# WPO: EVALUATION OF TECHNOLOGY ON LEGACY SYSTEMS

WP leader: RL; Overall effort: 27MMs (M02 to M36); Effort per partner: RL 27MMs

Task 0.1: Importer of syntactic information for meta-model

- Task leader: RL; Overall effort: 3MMs (M02—M04); Effort per partner: RL 3MMs

Task 0.2: Evaluation by mining legacy software for coding idioms

- Task leader: RL; Overall effort: 6MMs (M05—M07 + M10—M12); Effort per partner: RL 6MMs

Task 0.3: Importer of semantic information for meta-model

- Task leader: RL; Overall effort: 3MMs (M14—M16); Effort per partner: RL 3MMs

Task 0.4: Evaluation by mining legacy software for usage patterns

- Task leader: RL; Overall effort: 6MMs (M17—M19 + M22—M24); Effort per partner: RL 6MMs

Task 0.5: Importer of version information for meta-model

- Task leader: RL; Overall effort: 3MMs (M26—M28); Effort per partner: RL 3MMs

Task 0.6: Evaluation by mining legacy software for edit patterns

- Task leader: RL; Overall effort: 6MMs (M29—M31 + M34—M36); Effort per partner: RL 6MMs

# WPO: EVALUATION OF TECHNOLOGY ON LEGACY SYSTEMS

## Deliverables:

- P0.1 Prototype of legacy software importer (syntactic information)
- R0.2 Report on evaluation of support for mining coding conventions & idioms
- P0.3 Extension of legacy software importer (semantic information)
- R0.4 Report on evaluation of support for mining usage patterns
- P0.5 Extension of legacy software importer (version information)
- R0.6 Report on evaluation of support for edit patterns

## (E.4) PLAnning

<b>Total MMs</b>	VUB	36
	UCL	36
	RL	36

			2018												2019												2020															
			Q1			Q2			Q3			Q4			Q5			Q6			Q7			Q8			Q9			Q10			Q11			Q12			MM	MM/task		
			M01	M02	M03	M04	M05	M06	M07	M08	M09	M10	M11	M12	M13	M14	M15	M16	M17	M18	M19	M20	M21	M22	M23	M24	M25	M26	M27	M28	M29	M30	M31	M32	M33	M34	M35	M36				
WP0 lead: RL	T0.1 legacy importer (syntactic)	VUB UCL RL			1	1	1																																0 0 3	3		
	T0.2 case study (idioms)	VUB UCL RL																																					0 0 6	6		
	T0.3 legacy importer (semantic)	VUB UCL RL																																					0 0 3	3		
	T0.4 case study (usage patterns)	VUB UCL RL																																					0 0 6	6		
	T0.5 legacy importer (version)	VUB UCL RL																																					0 0 3	3		
	T0.6 case study (edit patterns)	VUB UCL RL																																						0 0 6	6	
WP1 lead: RL	T1.1 meta-model (syntactic)	VUB UCL RL	1	1	1										1	1	1										1	1	1											3 3 1	7	
	T1.2 meta-model (semantic)	VUB UCL RL													1	1	1										1	1	1											3 3 1	7	
	T1.3 meta-model (version)	VUB UCL RL																									1	1	1											3 3 1	7	
WP2 lead: UCL	T2.1 mining (idioms)	VUB UCL RL				1	1	1																																6 6 0	12	
	T2.2 mining (usage patterns)	VUB UCL RL																																						6 6 0	12	
	T2.3 mining (edit patterns)	VUB UCL RL																																						6 6 0	12	
WP3 lead: VUB	T3.1 pattern browser	VUB UCL RL																																							3 3 2	8
	T3.1 on-demand matching (against snapshot)	VUB UCL RL																																						3 3 2	8	
	T3.2 pro-active matching (against snapshot)	VUB UCL RL																																						3 3 2	8	
			3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3		

# BUDGET — RainCODE LABS

					Year 1	Year 2	Year 3
<b>1.</b>	<b>Staff costs</b>				<b>90,000 €</b>	<b>90,000 €</b>	<b>90,000 €</b>
<b>1.1</b>	<b>Staff</b>				<b>90,000 €</b>	<b>90,000 €</b>	<b>90,000 €</b>
	<i>Name</i>	<i>Diploma</i>	<i>Function</i>	<i>Allocation (%)</i>	<i>Cost</i>	<i>Cost</i>	<i>Cost</i>
	NN	PhD in Computer Science	Analyst / developer	100.00%	90,000 €	90,000 €	90,000 €
<b>1.2</b>	<b>Self-employed persons</b>				<b>0 €</b>	<b>0 €</b>	<b>0 €</b>
	/	/	/	/	/	/	/
<b>2.</b>	<b>Operating costs</b>				<b>5,000 €</b>	<b>5,000 €</b>	<b>5,000 €</b>
General academic operating costs	Conference attendance	1 conference in the field of pattern mining; 1 conference in the field of software engineering & programming languages	2000€/conference x 2/yr x 3 yrs		4,000 €	4,000 €	4,000 €
	Additional workshops (meetings) with clients	2 trips per year to internationally located clients with problems where the newly developed methods will be applicable, needed to obtain relevant but sensitive data on their premises and complete the feedback loop to the researchers	500€ / year x 2/yr 3 years		1,000 €	1,000 €	1,000 €
<b>3.</b>	<b>Investment costs</b>				<b>5,000 €</b>	<b>0 €</b>	<b>0 €</b>
Computer equipment	Powerful high-end laptop for heavy duty data mining activities	E.g., a fully configured MacBook Pro 15" with a 3.1 Ghz quad-core Intel core i7 processor and 2TB of SSD storage	(1 x 5000€ x 36 x 100%) / 36		5,000 €		
<b>4.</b>	<b>General costs</b>				<b>9,500 €</b>	<b>9,500 €</b>	<b>9,500 €</b>
	10% (Operating costs + Salaried staff costs)						
<b>5.</b>	<b>Subcontracting</b>				<b>0 €</b>	<b>0 €</b>	<b>0 €</b>
	/	/	/	/	/	/	/
<b>TOTAL</b>					<b>109,500 €</b>	<b>104,500 €</b>	<b>104,500 €</b>
		<b>TOTAL BUDGET</b>			<b>318,500 €</b>		
		<b>TOTAL SUBSIDY</b>		<b>60%</b>	<b>191,100 €</b>		
		<b>PARTNER'S SHARE</b>			<b>127,400 €</b>		



# BUD- GET VUB

					Year 1	Year 2	Year 3
1.	Staff costs				74.454 €	77.682 €	91.007 €
1.1	Staff				74.454 €	77.682 €	91.007 €
	<i>Name</i>	<i>Diploma</i>	<i>Function</i>	<i>Allocation (%)</i>	<i>Cost</i>	<i>Cost</i>	<i>Cost</i>
	NN	PhD in Computer Science	Post-doctoral researcher	100,00%	74.454 €	77.682 €	91.007 €
1.2	Self-employed persons				0 €	0 €	0 €
	/	/	/	/	/	/	/
2.	Operating costs				5.000 €	5.000 €	5.000 €
General academic operating costs	Conference attendance	<i>1 conference in the field of pattern mining; 1 conference in the field of software engineering &amp; programming languages</i>	2000€/conference x 2/yr x 3 yrs		4.000 €	4.000 €	4.000 €
	Printing and organisational costs for dissemination of results	<i>posters, postage, workshop organisation, article publication, ...</i>	500€ / year x 3 years		500 €	500 €	500 €
	Software	<i>software products, services and updates</i>	500€ / year x 3 years		500 €	500 €	500 €
3.	Investment costs				5.000 €	0 €	0 €
Computer equipment	Powerful high-end laptop for heavy duty data mining	<i>A fully configured MacBook Pro 15" with 3.1 Ghz quad-core Intel core i7 processor and 2TB of SSD storage</i>	(1 x 5000€ x 36 x 100%) / 36		5.000 €		
4.	General costs				7.945 €	8.268 €	9.601 €
	10% (Operating costs + Salaried staff costs)						
5.	Subcontracting				0 €	0 €	0 €
	/	/	/	/	/	/	/
TOTAL					92.399 €	90.950 €	105.608 €

TOTAL BUDGET

288.957 €

TOTAL SUBSIDY

100%

288.957 €

PARTNER'S SHARE

0 €

BUD-  
GET  
  
UCL

					Year 1	Year 2	Year 3
1.	Staff costs				90.736 €	92.551 €	99.533 €
1.1	Staff				90.736 €	92.551 €	99.533 €
	Name	Diploma	Function	Allocation (%)	Cost	Cost	Cost
	NN	PhD in Computer Science	Senior post-doc researcher	100,00%	90.736 €	92.551 €	99.533 €
1.2	Self-employed persons				0 €	0 €	0 €
	/	/	/	/	/	/	/
2.	Operating costs				5.000 €	5.000 €	5.000 €
General academic operating costs	Conference attendance	1 conference in the field of pattern mining; 1 conference in the field of software engineering & programming languages	2000€/conference x 2/yr x 3 yrs		4.000 €	4.000 €	4.000 €
	Printing and organisational costs for dissemination of results	posters, postage, workshop organisation, article publication, ...	500€ / year x 3 years		500 €	500 €	500 €
	Software	software products, services and updates	500€ / year x 3 years		500 €	500 €	500 €
3.	Investment costs				5.000 €	0 €	0 €
Computer equipment	Powerful high-end laptop for heavy duty data mining	A fully configured MacBook Pro 15" with 3.1 Ghz quad-core Intel core i7 processor and 2TB of SSD storage	(1 x 5000€ x 36 x 100%) / 36		5.000 €		
4.	General costs				9.574 €	9.755 €	10.453 €
	10% (Operating costs + Salaried staff costs)						
5.	Subcontracting				0 €	0 €	0 €
	/	/	/	/	/	/	/
TOTAL					110.310 €	107.306 €	114.986 €
TOTAL BUDGET					332.602 €		
TOTAL SUBSIDY					100%	332.602 €	
PARTNER'S SHARE						0 €	

# FINANCIAL DETAILS OF RainCODE

Année	<b>2012</b>	<b>2013</b>	<b>2014</b>	<b>2015</b>	<b>2016</b>	<b>2017</b>
Chiffre d'Affaire	€ 1.658.674,00	€ 1.744.686,00	€ 1.375.521,00	€ 1.943.948,00	€ 2.638.405,00	€ 3.200.000,00
Marge brute d'exploitation	€ 481.792,00	€ 97.138,00	€ 47.715,41	€ 326.027,00	€ 311.808,37	€ 1.200.000,00
Benef net	€ 328.510,29	€ 70.825,00	€ 42.276,03	€ 210.754,00	€ 189.055,94	€ 784.679,25

# consortium agreement & OWNERSHIP

- Efforts will result in a generic framework for modernisation assistants
  - A language-parametric meta-model
  - Pattern mining algorithms
  - Pattern matching algorithms
  - Modernisation recommendations
- Framework needs to be instantiated for specific legacy languages by complementing it with dedicated importers
- Generic guidelines on IP are understood and agreed upon
  - IP for a particular task or deliverable belongs to the partners contributing to it
  - Examples according to proposed work plan:
    - e.g., language-parametric meta-model is joint academic-industrial IP,  
but importer for legacy language and mined patterns for such language is industrial IP
    - e.g., dedicated mining and matching algorithms are mostly joint academic IP,  
but modernisation support is joint academic-industrial IP
- Background knowledge will be listed before the start of the project
- Exploitation of joint results dependent on permission of co-owners
- Licensing of other results based on market prices

# AI as JOB creator

Media often characterises AI as a job killer that will replace people in workplaces by robots or intelligent agents.

Industry, however, employs AI to solve challenges for which they currently lack the resources or corporate worker base to succeed.

*“What makes the best AI projects stand out is that they allow for solutions that previously would have been impossible to conceive. They include what seems like human insights but at a volume humans could never achieve.”*