

# **Industrial Experiences with Automated Software Architecture Measurement**

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# Software Health Management System

From research to practice

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## Metrics for comparison and contrast

Monitor the degradation, variation, and evolution of software projects



## Hotspot detection

Pinpoint design flaws with ever-increasing maintenance costs



## Quantification

Calculate the cost of each flaw and estimate the benefits of refactoring

# Software Health Management System

Systems we have analyzed



252 Open Source Projects



50+ Industrial projects



softserve

SAMSUNG

BRIGHTSQUID



# General Work Flow

## Overview

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### Step 1: Data Collection

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Code dependency, history, issue record



### Step 2: Automated Analysis

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Measurement, hotspot detection, cost calculation



### Step 3: Collect Feedback

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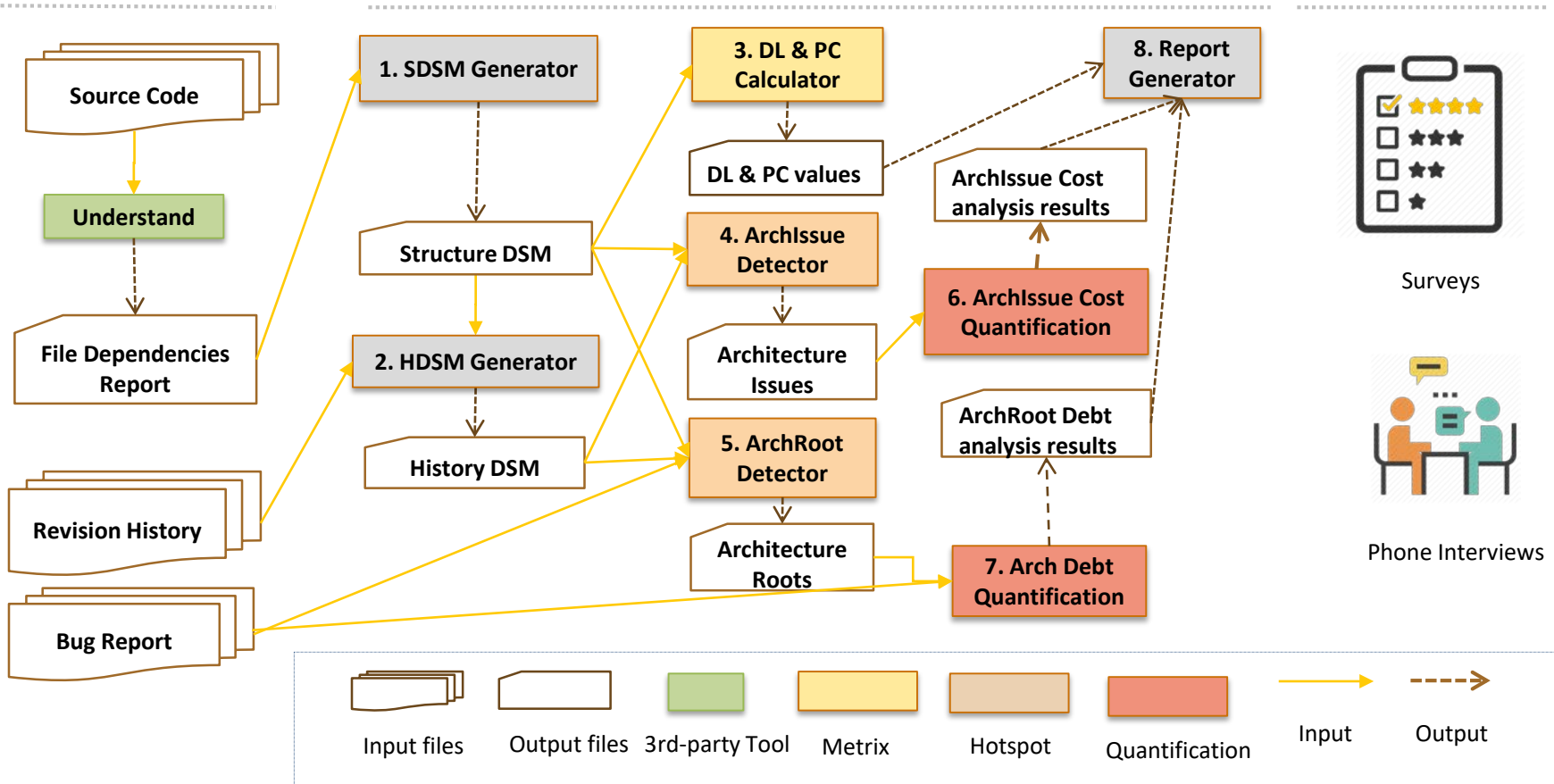
Surveys and Interviews

### Step 1: Data Collection

### Step 2: Automated Analysis

### DV8 Tool Suite

### Step 3: Collect Feedback



# Step 1: Data Accepted by DV8 tool suite

Beyond source code

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## ✓ Dependency information

- Currently support Understand Cytoscape output
- Extensible to other dependency formats through standard interfaces

## ✓ History information (optional)

- Commit history such as git record, svn record
- Extensible to other history record types through standard interfaces

## ✓ Issue information (optional)

- Issue tracking info such as Jira record, MTF work item, Bugzilla record etc.
- Extensible to other records through standard interfaces

# Design Rule Space (DRSpace) [Xiao et al. 2014]

A new architecture model supported by DV8

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A DRSpace is composed of a **meaningful subset** of a system's files along with the **architectural connections** among these files.

- Any subset of files may form a design space
- Architectural connections
  - Structural couplings: call, inherit, aggregate, etc..
  - Evolutionary couplings
  - One or multiple types
  - Implicit or explicit



# Design Rule Space (DRSpace)

A new architecture model supported by DV8

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Non-trivial software system must contain multiple design spaces:

- each feature implemented
- each pattern applied
- each concern addressed



Each file can participate in multiple design spaces



We propose that software architecture can, and should be modeled as **multiple, overlapping design spaces**

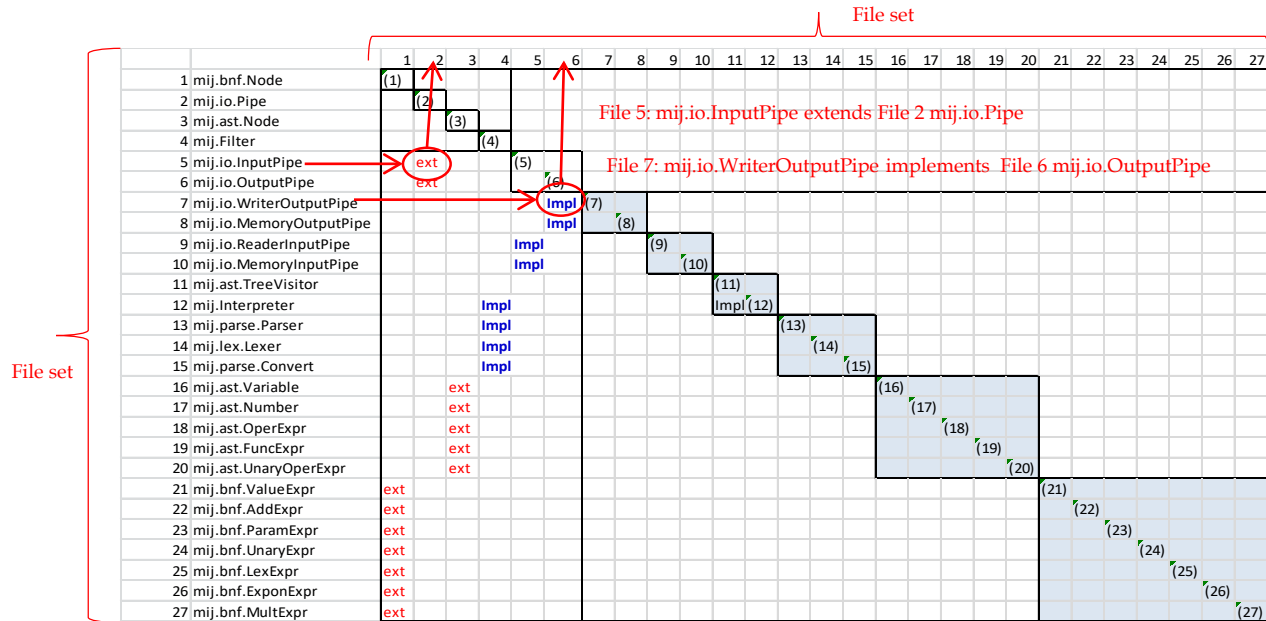


Each design space can be visualized as a ***Design Structure Matrix*** (DSM)

# Design Rule Space (DRSpace) in Design Structure Matrix (DSM)

A small calculator example

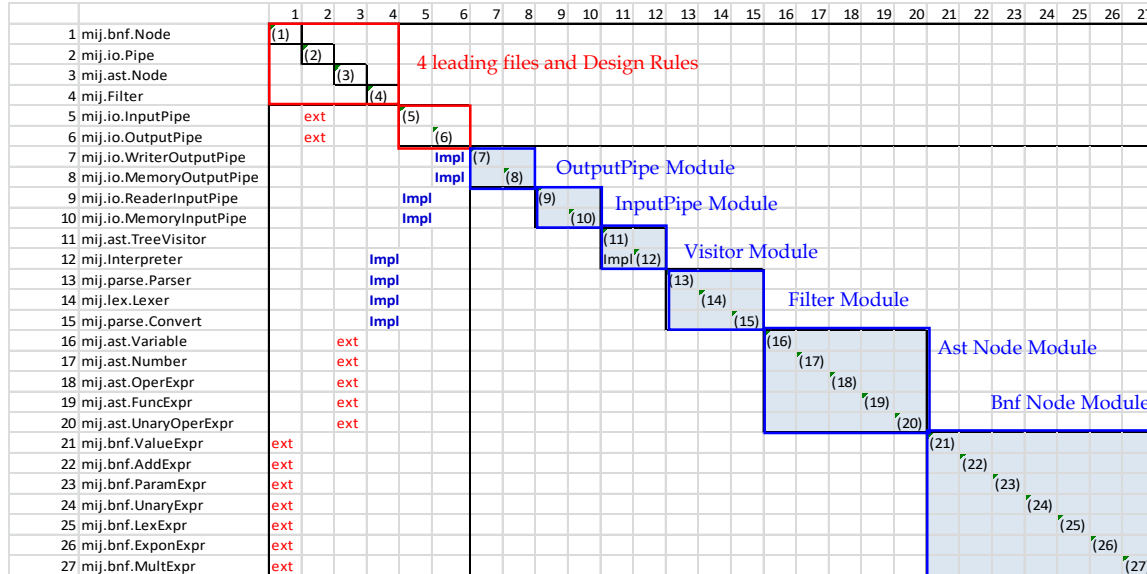
DRSpace 1: Polymorphism DRSpace : formed by “extend” and “implement”



# Design Rule Space (DRSpace)

A small calculator example

DRSpace 1: Polymorphism DRSpace : formed by “extend” and “implement”



# Design Rule Space (DRSpace)

A small calculator example

DRSpace 2: Visitor Pattern DRSpace: formed by multiple dependency types

		1	2	3	4	5	6	7	8	9	10
1	mij.ast.Node	(1)									
2	mij.ast.TreeVisitor		(2)								
3	mij.ast.Variable	Ext, dp	dp	(3)							
4	mij.ast.UnaryOperExpr	Ext, dp	dp		(4)						
5	mij.ast.OperExpr	Ext, dp	dp			(5)					
6	mij.ast.Number	Ext, dp	dp				(6)				
7	mij.ast.FuncExpr	Ext, dp	dp					(7)			
8	mij.Interpreter	dp	Impl	dp					(8)		
9	mij.parse.Convert	dp	dp	dp	dp	dp	dp			(9)	
10	mij.Console	dp							dp	dp	(10)

Ext: Extend **Impl**: Implement

dp: General dependencies such as call, use, and create

- Visitor interface: mij.ast.TreeVisitor
- Element interface: mij.ast.Node
- Concrete elements of the pattern: m(rc3-7)
- Concrete visitor role: Calculator

# Design Rule Space (DRSpace)

A small calculator example

DRSpace 2: Visitor Pattern DRSpace: Viewing the *evolutionary coupling* and the *modular structure* of a DRSpace *simultaneously* helps to reveal flawed architectural connections.

	1	2	3	4	5	6	7	8	9	10
1 mij.ast.Node	(1)									
2 mij.ast.TreeVisitor		(2)								
3 mij.ast.Variable	Ext, dp, 5	dp	(3)							
4 mij.ast.UnaryOperExpr	Ext, dp, 10	dp		(4)						
5 mij.ast.OperExpr	Ext, dp, 25	dp			5 (5)					
6 mij.ast.Number	Ext, dp, 8	dp		20		(6)				
7 mij.ast.FuncExpr	Ext, dp, 6	dp			15		(7)			
8 mij.Interpreter	dp, 10	Imp	dp					(8)		
9 mij.parse.Convert	dp	dp	dp	dp	dp	dp	dp		(9)	
10 mij.Console	dp							dp	dp	(10)

Ext: Extend **Impl**: Implement

dp: General dependencies such as call, use, and create

- Visitor interface: mij.ast.TreeVisitor
- Element interface: mij.ast.Node
- Concrete elements of the pattern: m(rc3-7)
- Concrete visitor role: Calculator

# Step 2: Automated Architecture Analysis

## Overview

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### Step 2.1 Measure and Monitor

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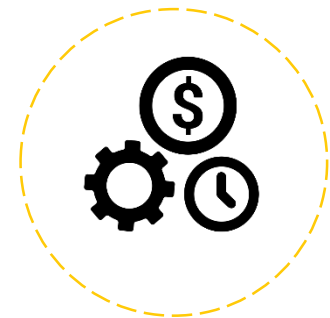
Compare, Contrast, and Monitor



### Step 2.2: Pinpoint Hotspots

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Detection and Visualization



### Step 2.3: Quantify Design Debt

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Costs and benefits

## Step 2.1 Measure and Monitor

A new metric suite



**Decoupling Level (DL) [Ran et al. 2016]:**

an options-based metric, measuring the system's ability to generate options



**Propagation Cost (PC) [MacCormack 2006]:**

a DSM-based metric, measuring how tightly coupled a system is

# The Concept of “Metrics”

What is a "real" metric?



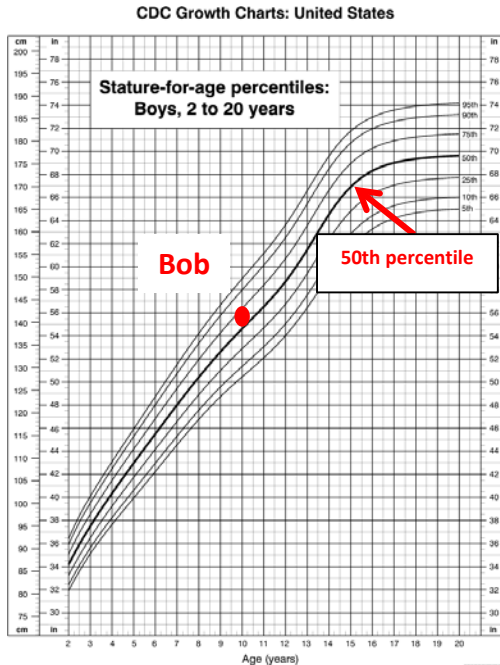
- x** Software “metrics”:  
Lines of Code (LOC), CK metrics, McCabe complexity
- ✓** Real metrics  
Meter, Pound, Kilogram





# The Properties of a Real Metric

Toward a real metric



## Support cross-project comparison

Precisely tell maintainability differences  
Independent of project domains, sizes, ages, etc.



## Support Evolution Monitoring

Remain stable for non-refactored versions  
Non-trivial changes should reflect architecture variation  
Architectural debt thermometer



## Form a Maintainability Chart

Similar to real health chart  
An industrial benchmark

# Decoupling Level (DL): Towards a Real Metric

## Rationale

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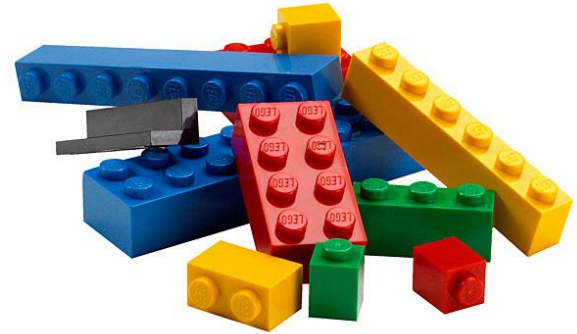
**Module:** A true module (with high option value) should be

- Small
- Independent



**System:** A highly modularized system should

- Have large numbers of true modules...
- connected by design rules



# Decoupling Level (DL)

## Algorithm

### Upper Layer modules:

- The fewer dependents, the higher the value
- The smaller the module, the higher the value

### True modules:

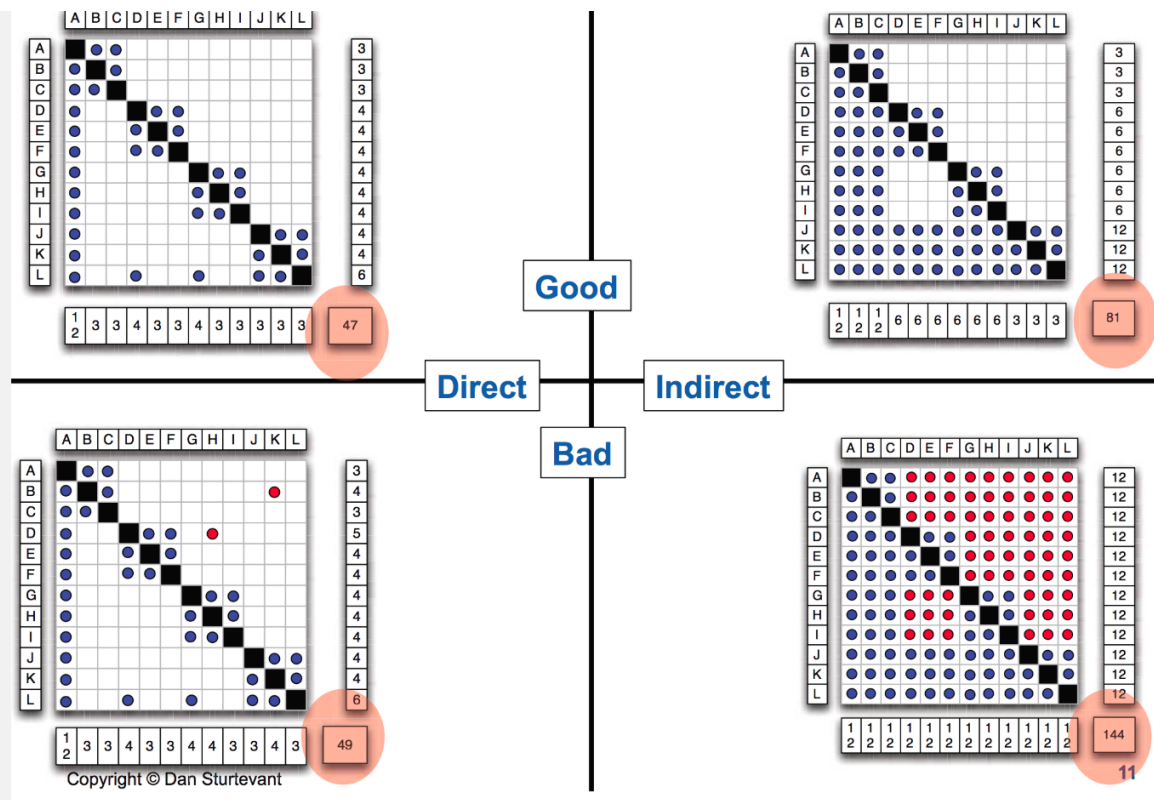
- The smaller a true module, the higher the value
- The more true modules, the higher the value

The more files are clustered into true module, the higher the value

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
1 UI_java	(1)															
2 Answer_java	x	(2) x														
3 Question_java	x	x	(3)													
4 Survey_java				x	(4)											
5 SaveLoadFile_java					x	(5)										
6 TextFileUI_java	x					(6)										
7 CommandLineUI_java	x						(7)									
8 Letters_java								(8)								
9 Match_java	x	x	x					x	(9) x							
10 MatchingAnswer_java	x	x	x					x	x	(10)						
11 ChoiceAnswer_java	x	x	x								(11) x					
12 Choice_java	x	x	x								x	(12)				
13 EssayAnswer_java	x	x	x										(13) x			
14 Written_java	x	x	x										x	(14)		
15 Test_java		x	x	x											(15)	
16 AnswerSheet_java															x	(16)

# Propagation Cost (PC)

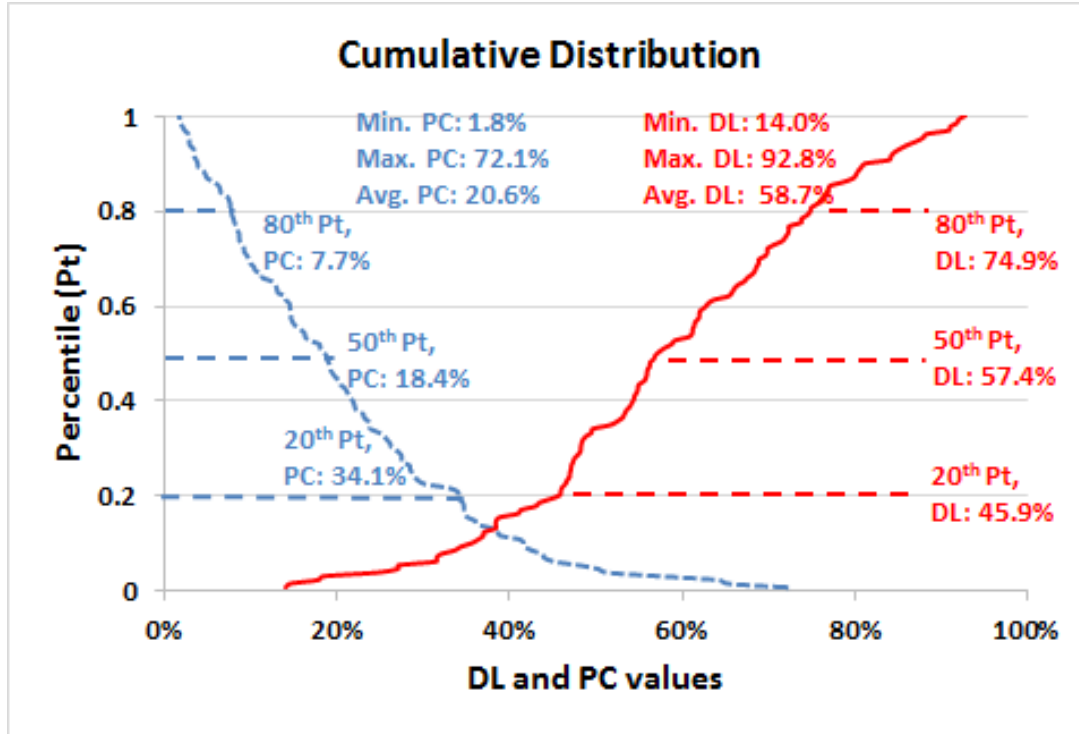
Rationale



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# Decoupling Level (DL) and Propagation Cost (PC)

From 129 open source projects: 108 open source, 21 industrial



# Decoupling Level (DL) and Propagation Cost (PC)

Cross project comparison

	Open Source(%)			Commercial(%)		
	DL	PC	IL	DL	PC	IL
Avg	60	20	43	54	21	35
Median	58	18	41	56	20	28
Max	92	72	100	93	50	83
Min	14	2	12	15	2	9
20 <sup>th</sup> Pt	47	8	28	36	6	24
40 <sup>th</sup> Pt	55	14	37	46	17	26
60 <sup>th</sup> Pt	66	21	45	59	24	38
80 <sup>th</sup> Pt	75	34	55	65	35	46

Pt: Percentile

- Best DL (93%) is from industrial
- Worst DL (14%) is from open source

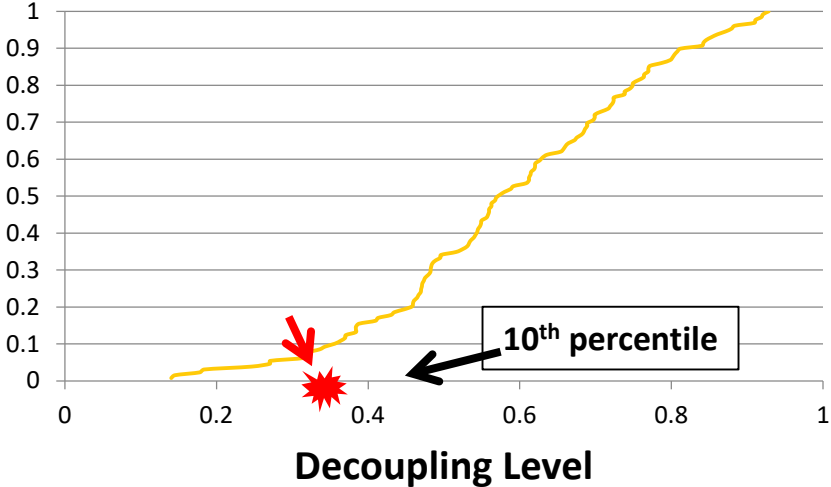
# Decoupling Level (DL) and Propagation Cost (PC)

Towards a Heath Chart



An industrial project:

DL: 29%, 10th percentile: Confirmed to have severe maintenance difficulty



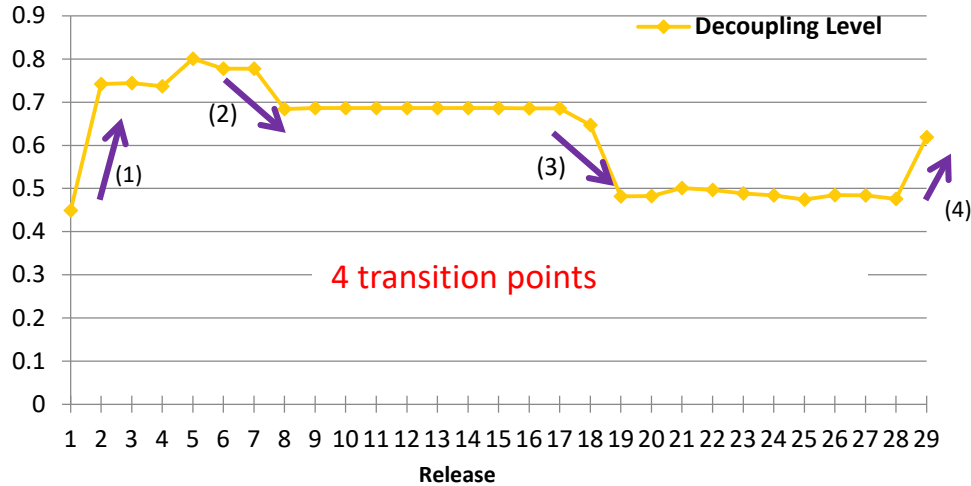
# Evolutionary Monitoring

Towards a Heath Chart



Non-trivial variation in DL indicate major architecture variation

- An industrial project: Evolved for 6 year, 29 releases, 1082-1852 files





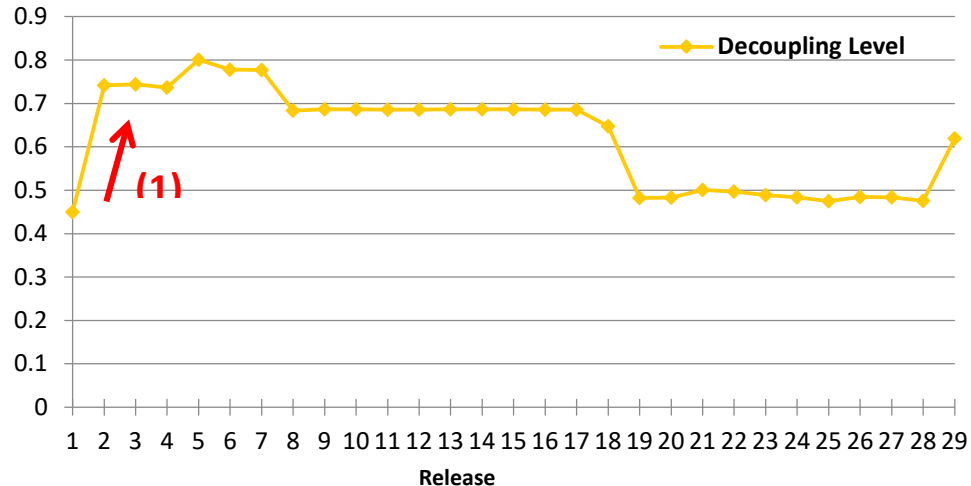
# Evolutionary Monitoring

Non-trivial variation in DL faithfully indicate major architecture variation

1

DL increases from 45% to 74%:

Transforming from a prototype to a real product



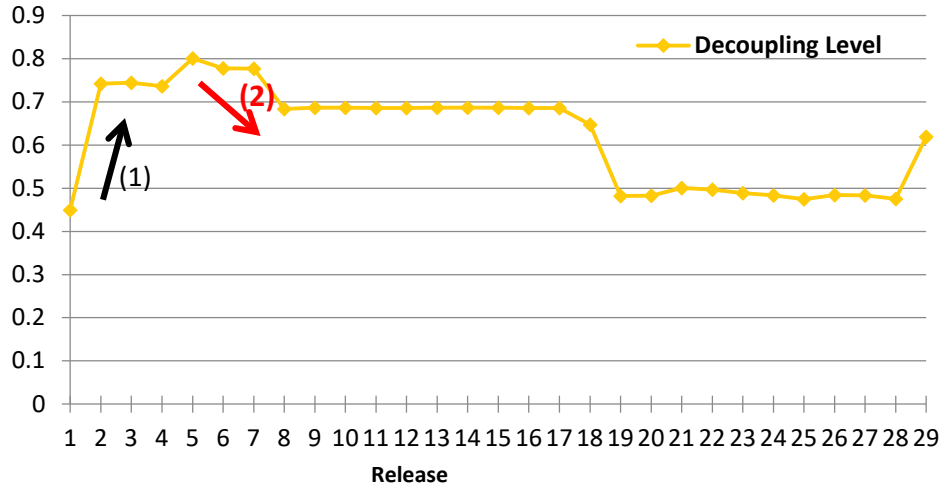
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# Evolutionary Monitoring

Non-trivial variation in DL faithfully indicate major architecture variation

**2** DL **decreases** from 78% to 68%:

New features were added and Technical debt accumulates



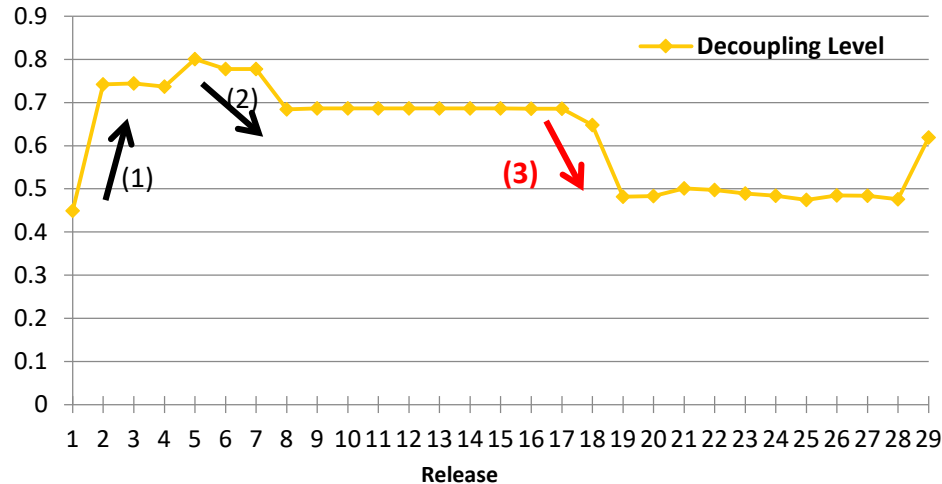
# Evolutionary Monitoring

Non-trivial variation in DL faithfully indicate major architecture variation

3

DL **decreases** from 65% to 48%:

Unsuccessful refactoring



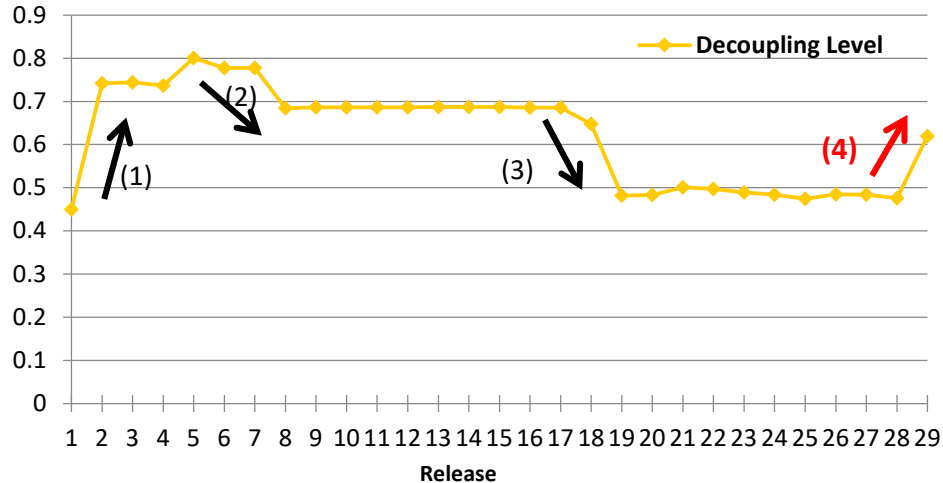
# Evolutionary Monitoring

Non-trivial variation in DL faithfully indicate major architecture variation

4

DL **increases** from 48% to 62%:

“Cleaning up” technical debt



## Step 2.2 Pinpoint Hotspots: (1) Flaw Detection

Flaws responsible for high-maintenance



We automatically identify 6 types of design flaws

1. Unstable interface
2. Modularity violation
3. Crossing
4. Improper inheritance
5. Cliques among files
6. Package cycles



These flaws are highly correlated with bugs, changes, and churn

# Flaw 1: Unstable Interface

## Sample Flaw

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
1 config.DatabaseDescriptor	(1)	p,44	14	,10	,10	,6	,14	,36	,118	,12	,	,16	,12	,42	,52	,4	,18	,30
2 utils.FBUtilities	dp,44	2)	40	,4	,6	,10	,6	,12	,38	,28	,12	,8	,14	,24	,46	,6	,18	,28
3 utils.ByteBufferUtil	,14	p,40	3)	,	,	,	,4	,10	,20	,4	,4		,10	,26		,12	,4	
4 service.WriteResponseHandler	,10	p,4	2	(4)	,4	,6	,18	dp,22						,6	,			
5 locator.TokenMetadata	,10	6		,4	(5)	,4	,10	dp,24		,8				,4	,6	,4		
6 locator.NetworkTopologyStrategy	,6	p,10	2	,6	dp,4	(6)	,10	ih,22	,4					,16	,			,8
7 service.DatacenterWriteResponseHandler	dp,14	p,6	2	ih,18	,10	dp,10	(7)	,20						,6	,6			
8 locator.AbstractReplicationStrategy	,36	p,12	4	dp,22	ag,24	,22	dp,20	(8)	,6					,16	,10			,10
9 config.CFMetaData	,118	p,38	p,10	,	,	,4		,6	(9)			,16		,36	,46			,56
10 dht.RandomPartitioner	,12	p,28	dp,20	,8	,	,				(10)	dp,4			,4	,16			,50
11 utils.GuidGenerator	,	p,12	4		,	,				,4	(11)				,4			
12 io.sstable.SSTable	,16	8	dp,4						ag,16			(12)	,4	dp,68	,10			
13 utils.CLibrary	,12	p,14										,4	(13)	,12				
14 io.sstable.SSTableReader	dp,42	24	dp,10					,36	,4			ih,68	dp,12	(14)	,22	,4		,10
15 cli.CliClient	,52	p,46	dp,26	,6	,4	,16	,6	,16	,46	,16	,4	,10		,22	(15)	,6	,14	,48
16 locator.PropertyFileSnitch	,4	p,6			dp,6		,6	,10					,4	,6	(16)			,4
17 dht.OrderPreservingPartitioner	dp,18	p,18	dp,12	,4						,50				,14			(17)	
18 thrift.ThriftValidation	dp,30	28	dp,4	,	,	,8		dp,10	dp,56				,10	,48	,4			(18)

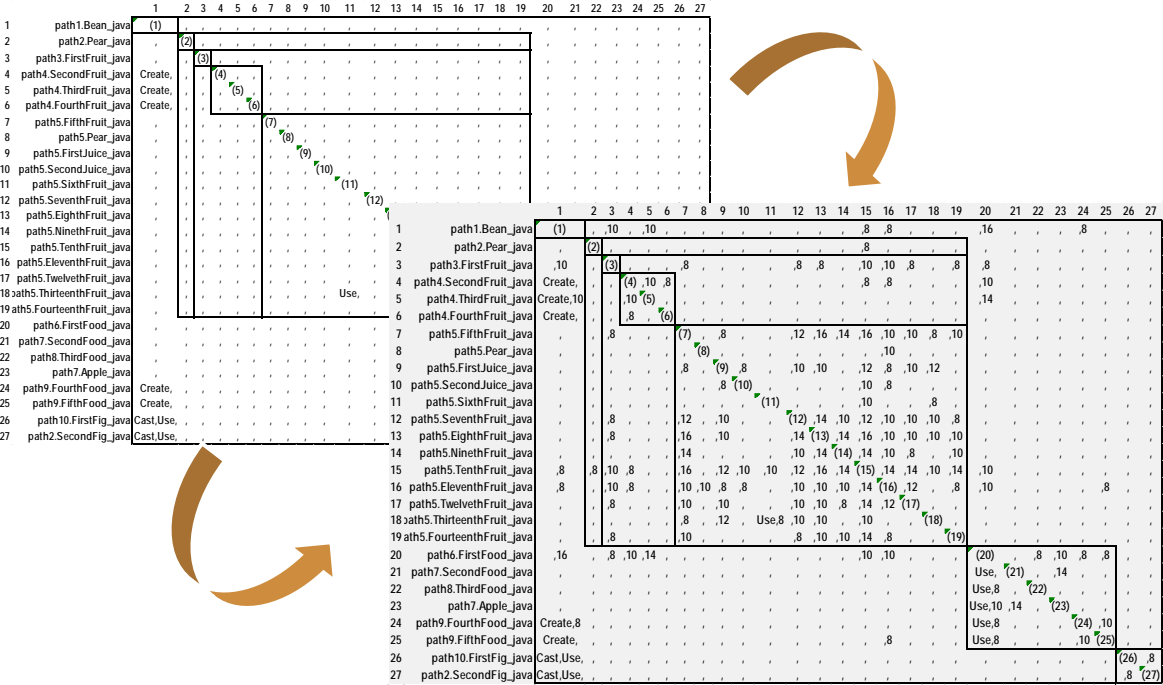
# Flaw 2: Crossing

## Sample Flaw

		1	2	3	4	5	6	7	8	9	10	11	12	13
1	path1.File1_h	(1)	, 2		, 6	, 11	, 3	, 2	, 8	, 6	, 5		, 2	
2	path1.File2_h	d, 2	(2)			, 2								
3	path1.File3_h	d		(3)		, 2			, 2				, 2	
4	path2.File1_h	, 6			(4)	, 5	, 2	, 2	, 5	, 5	, 4		, 2	
5	path2.File2_h	d, 11	d, 2	d, 2	d, 5	(5)	, 3	, 2	, 10	, 6	, 5	, 2	, 3	, 2
6	path2.File3_h	d, 3			, 2	d, 3	(6)	d, 2	, 2	, 3	, 2		, 2	
7	path3.File1_h	d, 2			, 2	d, 2	d, 2	(7)	, 2	, 2	, 2		, 2	
8	path3.File2_c	d, 8		, 2	, 5	d, 10	d, 2	d, 2	(8)	, 6	d, 5		, 3	
9	path3.File3_c	d, 6			, 5	d, 6	d, 3	d, 2	d, 6	(9)	, 8		, 2	
10	path4.File1_c	d, 5			, 4	d, 5	d, 2	d, 2	d, 5	d, 8	(10)		, 2	
11	path4.File2_c	d				d, 2						(11)		, 7
12	path4.File3_c	d, 2		, 2	, 2	d, 3	d, 2	d, 2	, 3	, 2	, 2		(12)	
13	path5.File1_c	d	d	d		d, 2	d	d	d			d, 7	d	(13)

# Flaw 3: Modularity Violation

## Sample Flaw

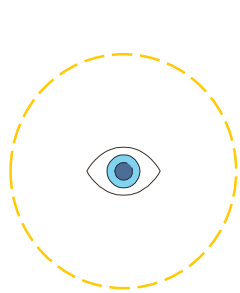




## Step 2.2 Pinpoint Hotspots: (2) Root Detection

Design Spaces that Grow and Propagate Errors

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### Architecture Roots

DRSpaces propagate errors among multiple files through flawed connections

The more error-prone files are, the more likely they are architecturally connected



### Observations about Roots

File in the DRSpaces led by an error prone file is also error-prone

A few (~5) DRSpaces capture more than half of the most error-prone files.

Error-prone DRSpaces often have architectural flaws

# Sample Root from JBoss

Each root has multiple design problems

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
1 \$RelationDataManager	(1)																			
2 JDBCEntityBridge	,35	(2)		ag,35																
3 CascadeDeleteStrategy		ag,	(3)	ag,																
4 JBCCMRFieldBridge	ag,163	ag,35	ag,	(4)																
5 JDBCInsertRelationsCommand	,15	,15	,15	(5)																
6 JDBCDeleteRelationsCommand	,11			,15	(6)															
7 JDBCPostCreateEntityCommand	,13	ag,	ag,13				(7)													
8 JDBCStopCommand	,11	ag,11	,11	,13	,11		(8)						ag,14							
9 JDBCRemoveEntityCommand	,21	ag,17	,21	,15	,13		,12	(9)					ag,20							
10 JDBCStartCommand	,18	ag,22	,18	,19	,15		,19	,16	(10)				ag,17							
11 JDBCLoadRelationCommand	,18	ag,21	,18	,19	,15	,11	,15	,15	,22	(11)			ag,19							
12 ReadAheadCache	,11		,11								,14	(12)	ag,							
13 JDBCStoreManager	,30	ag,23	,30	ag,18	ag,13	ag,	ag,14	ag,20	ag,17	ag,19	ag,	(13)								
14 JDBCAbstractQueryCommand	,17	ag,20	,17	,13	,11		,11	,13	,14	,23			ag,16	(14)						
15 JBCEJBQLCompiler	,15	,14	,15	,12					,16	,22			ag,	,26	(15)					
16 RelationData			ag,																	
17 RelationPair			ag,															(16)		
18 \$LeftJoinCMRNode	,17	,20	ag,17	,13	,11		,11	,13	,14	,23			,16	,56	,26			(17)		
19 RelationSet	,16	,11	ag,16															(18)		,11
20 \$CMRChainLink	,32	,26	ag,32	,11		,12		,15	,14	,12			,16	,11					(19)	

4 command classes and cache class also aggregate JDBCStoreManager

JDBCStoreManager aggregates command classes and cache class

## Jboss JBCCMRFieldBridge DRSpace

# The Impact of Roots in Open Source Projects

The observation is consistent with other projects

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**Consider JBoss: 5 Root spaces captured 52% of all files with more than 5 bugs**

Proj	Bug2		Bug5		Bug10	
	Top 5	Top 10	Top 5	Top 10	Top 5	Top 10
JBoss	57%	64%	52%	57%	78%	78%
Hadoop	59%	67%	68%	75%	76%	85%
Eclipse	71%	78%	83%	89%	89%	92%

## Step 2.3 Quantification

Calculate the Costs and Benefits

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Calculate the costs of each root, each flaw and each types of flaws



Calculate ROI (Return on Investment)

# The Costs of Each Flaw and Each Type of Flaw

Sample output from DV8

	#Instances	#Files	Pt.	Flaw CF	Pt.	Flaw CC	Pt.	Flaw BF	Pt.	Flaw BC	Pt.
Clique	26	322	21%	1,790	28%	26,294	41%	643	34%	16,557	45%
Crossing	91	368	24%	3,146	50%	40,247	63%	1,051	55%	25,177	68%
ModularityViolation	667	588	38%	4,538	72%	46,224	72%	1,438	75%	27,648	74%
PackageCycle	175	499	32%	2,417	38%	29,906	47%	778	41%	18,889	51%
UnstableInterface	6	316	21%	1,669	26%	19,898	31%	388	20%	11,457	31%
UnhealthyInheritance	72	257	17%	1,528	24%	22,007	34%	480	25%	13,481	36%

Instance Name	Size	Tot. CF	Tot. CC	Tot. BF	Tot. BC
Clique1	99	226	7,847	112	4,673
Clique2	78	181	431	7	212
Clique3	28	181	1,686	49	897
Clique4	18	246	3,130	39	1,427
Clique5	16	168	3,553	89	2,662

# Return on Investment Calculation

Experience with SoftServe [Kazman et al. 2015]

**Penalty Caused by Architecture Debt    Refactoring Cost    Expected Savings**

	A	B	C	D	E	F	G	I	J	K	L	M	N
	DRSpace Leading File	DRSpace Size	Norm Size	Current Defects/Yr	Norm Defects	Current Changes/Yr	Norm Changes/Yr	Tot LOC Changed	Norm LOC Changed	Refactor Cost (PM)	Norm Exp Defects/Yr	Norm Exp Changes/Yr	Norm Exp LOC Changed
1	<i>Pear.java</i>	139	119.33	166	142.5	1068	839.2	49,171	42,213	5.5	39	346	20,281
2	<i>Apple.java</i>	158	133.83	63	53.4	607	451.7	25,603	21,686	7	44	388	22,745
3	<i>Bean.java</i>	65	37.83	72	41.9	429	207.2	17,807	10,364	1.5	12	110	6,429
4													
5	<b>DRSpace Total</b>		<b>290.99</b>		<b>237.8</b>		<b>1498</b>		<b>74,263</b>		<b>96.0</b>	<b>843.871</b>	<b>49,455</b>
6	<b>Project Total</b>	<b>797</b>		<b>265</b>		<b>2332</b>		<b>135,453</b>		<b>14</b>			
7	<b>Savings</b>										<b>142</b>	<b>654</b>	<b>24,808</b>
8													
9													
10													
11	Base defect rates	0.33											
12	Base change rates	2.9										<b>Exp PM saved</b>	<b>41.35</b>
13	Base LOC/file	169.95											
14	LOC/PM	600											

**Result: ~300% ROI in the first year alone!**

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# Analyzing 8 ABB Projects

Recent and Representative Experiences

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Using 3 complementary techniques:

- Architecture-level maintainability metrics
- Architecture flaw analysis and root detection
- Cost and benefit analysis



8 projects developed at multiple locations (India, USA, and Switzerland) and differ in their ages, domains, and sizes.



We reported the results back to each project and collected feedback

# Research Questions

Collecting feedbacks of practitioners

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- ① RQ1: does the tool suite help to close the gap between management and development? That is, does it help them to decide *if*, *when*, and *where* to refactor?
- ② RQ2: does the tool suite help practitioners understand the maintainability of their systems *relative to other projects* internal to the company, and relative to a more broad-based benchmark suite?
- ③ RQ3: does the tool suite help developers pinpoint the *hotspots* of their systems, i.e., the groups of files with severe design flaws?



# Metrics Scores and Rankings

Measure and Monitor

	DL	Percentile	PC	Percentile	#Files
Proj_EO	78%	85th	6%	85th	144
Proj_BM	77%	85th	2%	98th	371
Proj_CH	76%	81st	16%	54th	6,948
Proj_EP	72%	74th	7%	83th	1,541
Proj_SS	57%	49th	20%	45th	15,333
Proj_OP	57%	49th	21%	41th	7,754
Proj_CO	55%	43rd	17%	52th	491
Proj_EC	28%	5th	62%	2nd	4,125

# Hotspots Detected

## Pinpoint Hotspots



Unstable Interface

File Cliques

Modularity Violations

Most error-prone files

	CF	Top	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
1	p1.F1	17	3%	(1)	d,6	,4	,2				,6	,4	,2	,8	,2	,3						,3	,2	,2	,3	,9	,2	,2	,2	,2			
2	p1.F2	8	5%	i,6	(2)	,3	,3	,2			,3		,2	,3								,2		,2	,4								
3	p1.F3	16	3%	i,6	,3	(3)	,2	,2			,3	,2	,3	,3	,3							,2	,2	,2	,3	,4	,3	,2		,3			
4	p1.F4	2	24%				(4)								,2										,2								
5	p1.F5	45	1%	d,4	,3	,2					,3	,5	,7	,2	,3	,2					,2	,3	,4	,4	,12	,2	,6	,5	,3	,4			
6	p1.F6	22	2%	d,2	,2	,2					d,4	(6)	,2	,2	,10	,2	,2					,3	,3	,3	,6	d,7	,3	,2					
7	p1.F7	1	43%	i,																													
8	p2.F1	18	3%	d							,4	d,2	d	(8)	,5										,2	,2	,8	,4		,2			
9	p2.F2	6	6%	d							d,4		d,5	(9)	,2											,2	,2			,2			
10	p2.F3	10	4%	i,6	,3	,3																								,2			
11	p2.F4	5	8%	d,4							i,3	(11)			,4															,5			
12	p2.F5	2	24%																														
13	p2.F6	30	2%	d,2	,2	,2	i,2	d,5	d,10	d,5	(2)	,2		d	(13)						,2			,3	,4	,4	,8	,11	,3				
14	p2.F7	1	43%																														
15	p2.F8	40	1%	d,8	,3	,3	d,7	,2			,5	,4	,2		d	(15)	,4	,4					,2	,3	,3	,4	,30	,6	,3	,3	,4		
16	p3.F1	11	4%	d	,3	,2									,4	(16)	,3													,5	,3	,2	,3
17	p3.F2	2	24%	i,2																													
18	p3.F3	15	3%	d,3	,3	,3	,2				,2		,2	,4	,3	(18)							,2	,2	,3	,3	,8	,2	,2	,2	,3		
19	p3.F4	41	1%	d,		,2																(19)	,20	,8	,2	,2	,26	,36			,3		
20	p3.F5	4	9%																														
21	p3.F6	82	0.3%	d,																		d,2	d	(21)	,2	,2	,16	,59		,4			
22	p3.F7	28	2%	d,			,2															d,8	,2	(22)	,6	,2	,6	,29		,5		,2	
23	p3.F8	10	4%	d,3	,2	,2	,3	,3			,2		,3	,2	,2							d,2		i,6	(23)	,2	,5	,10		,3			
24	p4.F1	14	3%	d,2	,2	d,4	,3				,2		,4	,3	,2							,2	d,2	,2	,2	(24)	,7	,8	,4				
25	p4.F2	59	1%	d,2	,2	d,4	,3	,2			,2		,4	,3	,3							i,26	d,16	,6	,5	,7	(25)	,42	,5				
26	p4.F3	361	0.1%	d,3	,2	,3	d,2	d,12	,6	,2		,2		,8	,4	,3	,3					d,36	d,4	d,59	i,25	i,10	d,8	d,42	(2)	,21	,2	,2	,3
27	p4.F4	114	0.2%	d,9	,4	d,4	d,2	d,7	d,8	,2	,16	,15	,2	,11	,12	,15	,1	,19	,2				,12	,5	,2	,4	,5	,14	(27)	,14	,8	,6	,5
28	p4.F5	29	2%	d,2	,1	d,3	d,6	,3	d,4	d,2	d	d	,3	d,6	d,3	,2									,2	d,14	(28)	,14	,2	,7			
29	p4.F6	21	2%	d,2	,2	d,5	,2				d			,3	,2	,2									,2	,8	d,1	(29)	,2	,7			
30	p4.F7	10	4%	d,2		,3					,2			,3	,2	,2								,2		,3	d,6	,2	,2	(30)	,2		
31	p4.F8	12	4%	d,2	,3	,4		,2	,2					,4	,3	,3										,5	d,7	,7	,4	(31)	,2		

# Costs and Benefits of Architecture Debts

Costs and benefits

Debt Penalty

	Size (%)	Rt. CF (%)	Rt. CC (%)	Rt. BF (%)	Rt. BC (%)
root1	147 (10%)	1,109 (18%)	13,487 (21%)	414 (22%)	9,347 (25%)
root2	93 (6%)	1,050 (17%)	11,486 (18%)	452 (24%)	6,696 (18%)
root3	79 (5%)	601 (10%)	5,453 (9%)	183 (10%)	3,821 (10%)
root4	104 (7%)	486 (8%)	10,794 (17%)	166 (9%)	6,236 (17%)

Root	Size	% Size	Coverage	
			Change	Bug
root1	147	10%	24%	29%
root2	222	14%	38%	52%
root3	263	17%	47%	57%
root4	364	24%	55%	65%
Penalty of Architecture Roots				
	Extra CF	Extra CC	Extra BF	Extra BC
root1	612	8,450	263	6,418
root2	1,332	16,601	615	11,175
root3	1,687	19,570	724	13,552
root4	1,754	26,110	763	17,314
Percentage	28%	41%	40%	47%

Expected Benefits

## Step 3: Collecting User feedback

Answering research questions

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Surveys



Interviews

# Post-Mortem

Survey with practitioners

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Q1: What did the report reveal that you didn't know about your software?

Q2: Are the metrics useful for reflecting the architecture of your software?

Q3: What did the architecture design flaws reveal about your software?

Q4: What actions have you planned as a result of the architecture design flaws report?

Q5: What did the architecture roots reveal about your software?

Q6: What actions do you plan to take to address architecture roots?

# Results

## RQ review

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RQ1: does the tool suite help to close the gap between management and development? That is, does it help them to decide if, when, and where to refactor?



5 Participants of all 8 projects verified that the information provided was useful in closing the understanding gap with management. They have begun the refactoring process.

# Results

## RQ review

---

RQ2: does the tool suite help practitioners understand the maintainability of their systems relative to other projects internal to the company, and relative to a more broad-based benchmark suite?



All participants said the report gave them quantifiable results with which to judge their project. The comparison with industrial benchmarks made it clear that maintenance difficulty caused by degrading architecture is common.

# Results

## RQ review

---

RQ3: does the tool suite help developers pinpoint the *hotspots* of their systems—that is, the groups of files with severe design flaws?

- ✓ Six of the eight projects planned to or already started refactoring to address the detected flaws. The project with the lowest DL score is undergoing a major rewrite.



# Lessons Learned

## Feedback Summary

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- ✓ It is possible to automatically and objectively assess and quantify architecture quality.
- ✓ These results were enthusiastically received by the projects.
- ✓ 6 of the 8 projects are now embarking on major refactorings.
- ✓ ABB is incorporating DV8 into its development process

# Conclusion

RQ review

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You can't manage it if you don't measure it.

DV8 tool suite make measurement of design complexity, design flaws and design debt less labor-intensive and easily repeatable.



Incorporating these techniques into the build process ensures rapid feedback with supporting data.



This measurement, detection, and quantification practice leads to improved architectures.



# Questions?

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Office hour:  
**Thursday**  
**1:30-2:30**  
**Room E**



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