

# Impact of Software Environment on Replicability of Biomedical Workflows

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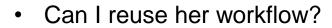
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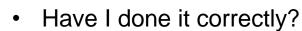
## Replicability

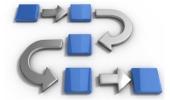


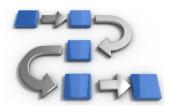


Do the results match?













Original experiment

2/17

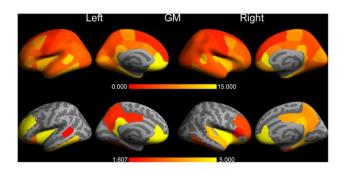
Re-executed experiment

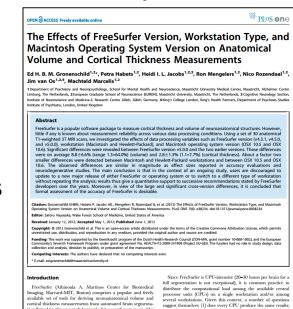




## Replicability

- Current studies show very low reproducibility in
  - medicine
  - economy
  - computer science
- Reproducibility requires
  - well documented research workflows
  - precise information
     on the experiment's environment







(2) is there any interaction between the processes runnin

nied with documentation describing the changes relative to the previous release (http://surfer.nmr.mgh.harvard.edu/fswiki/ ReleaseNotes). However, transition to a new release during the

Just like similar neuroimaging packages, new releases of FreeSurfer are issued regularly, fixing known bugs and improving existing tools and/or adding new ones. Each release is accompa-



cortical thickness measurements from automated brain segmentation (http://surfer.nmr.mgh.harvard.edu), recently summarised by Fischl [1]. A number of reported studies discussed the accuracy of

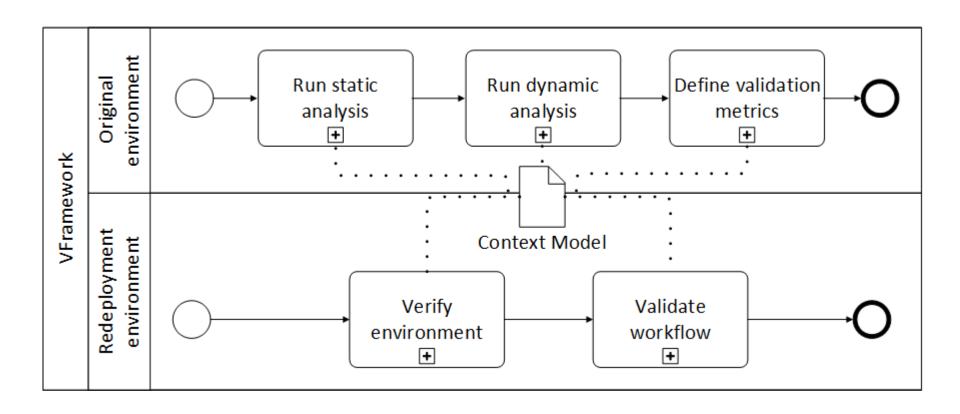
the technique by comparing the volume of specific brain structures, such as the hippocampus or amygdala, with manually derived volumes [2–5]. The measurement of cortical thickness was

validated against histological analysis [6] and manual measurements [7,8]. Also the reliability of the measurements was subject of a number of investigations. Some of these studies addressed the

effect of scanner-specific parameters, including field strength, pulse



### **VFramework**

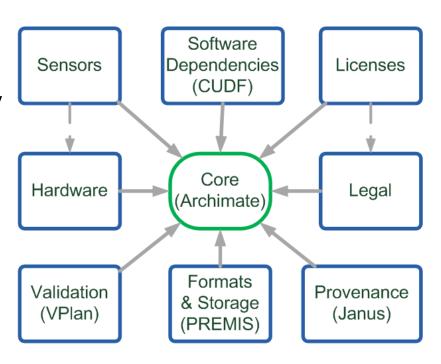




#### **Context Model**

- OWL ontology
- Modular architecture
  - Domain Independent Ontology
  - Domain Specific Ontologies
- Process preservation







#### **Context Model**

Metric Target Value: tolerance - 0 MTV1 plan:hasMetricTargetValue Absolute Error count (Metric) volan:isCalculatedFor Validation rdfs:comment of the number AbsoluteErrorCount: M21 of different pixels vplan:hasMetric WeatherWorkflowVPlan metrics The output plot of a workflow step FunctionalRequirement: vplan:hasRequirment volan desciration R2 VisualiseTemperature must be identic dio:association Workflow **Business Process:** BusinessObject: BusinessObject: plot -hasAccessTypeWrite -hasAccessTypeRead Visualise Temperature temperature definition dio:realizes dependsDown <mapping using SPARQL query> <mapping using SPARQL query> Premis:File plot Node: processor\_spec: has\_parameter -xrn://+machine?+hostid=007f0101/+hostname=ck temperature(MakeDecision) MakeDecision premis:hasObjectCharacteristics User: has\_execution Operating System: has\_value\_binding remis:ObjectCharacteristics Ubuntu 15.04 tomek plotCharacteristics processor\_exec port\_value Package: Data File: premis: hasFormat libpng12-0 has\_enactmentstarted \$TAVERNA/lib/chart-1.0-jar-with-dependencies.jar has\_content Premis: Format: ortable Network Graphic 2015-10-14T18:58:09.55 composedOf premis: hasFormatRegistry [MakeDecision][temperature]-7030832074416806461.txt System Software: taverna-commandline-core-2.5.0 Premis:FormatRegistry oremis:hasFormatRegistryName PronomRegistry[plot] premis: hasFormatRegistryKey http://www.nationalarchives.gov.uk/PRONOM info:pronom/fmt/11 Software Provenance File formats dependencies http://dx.doi.org/10.1016/j.jbi.2016.10.011 IfS



#### Validation report for the WeatherExample

Evaluation result: There are 2 not fulfilled metrics. Please see tables below for details.

Comparison performed using following workflow execution traces

Original Workflow

ID: 37b4d2fb-e71c-4b67-b7b3-17888ee82977

Timestamp: 2015-10-14 18:58:06.475

Compared Workflow

ID: ede04b87-5f58-4a89-b0c3-e179957cbad0

Timestamp: 2015-11-13 13:59:56.443

Table 1: Overview of requirements

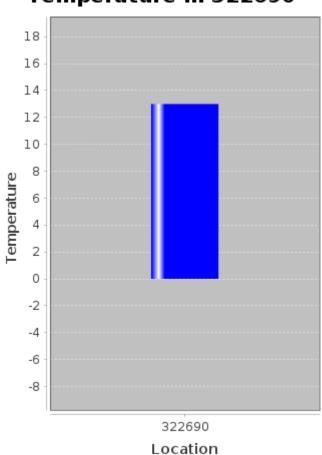
Requirement	Description	
R1	The inputs to the workflow are the same	true
R2	The outputs of the workflow are the same	false
R3	The workflow step ExtractTemperature must have identical outputs	true
R4	The workflow step GetWeatherData must have identical outputs	true
R5	The workflow step MakeDecision must have identical outputs	true
R6	The workflow step ExtractWeatherType must have identical outputs	true
R7	The workflow step VisualiseTemperature must have identical outputs	false
R8	Execution duration of each of the workflow steps shall be similar	true

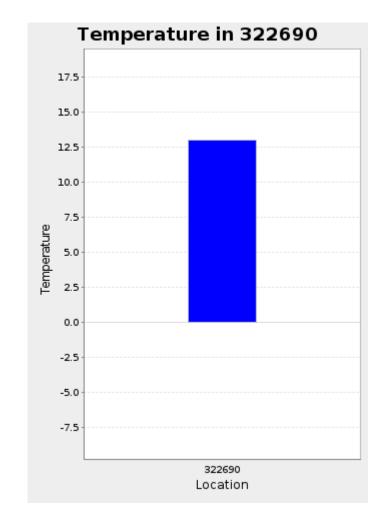
Table 2: List of requiremements and metrics that failed.

Req	Sub- req	Sub-requirement description	Measure ment point	Metric	Validity
R2 R7.1		R7.1 The output plot of workflow step VisualiseTemperature must be identical	plot	ImageFingerPrintEquality	false
	R7.1			ImageResolutionEquality	true
				AbsoluteErrorCount	false
R7 R7.1		The output plot of workflow step VisualiseTemperature must be identical	plot	ImageFingerPrintEquality	false
	R7.1			ImageResolutionEquality	true
				AbsoluteErrorCount	false



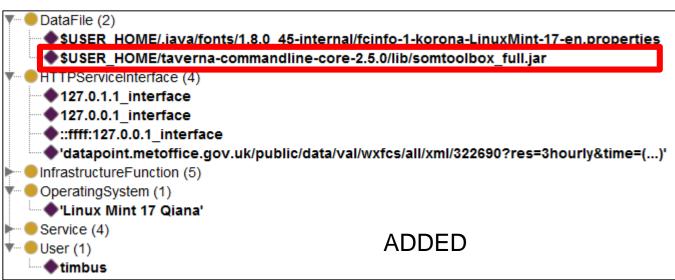
#### Temperature in 322690

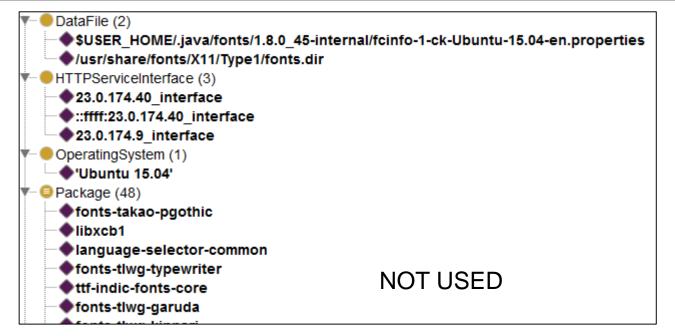














#### **Use Cases**

- Characteristics of Taverna workflows on myExperiment
  - 50% use Beanshells
  - 30% use WSDL web services



- 15% local tool invocations
- Access to the original environment was necessary
- 5 Taverna workflows from 3 domains
  - 3 biomedical workflows (Leiden University, NL)
  - 1 music classification workflow (TU Wien)
  - 1 sensor data analysis workflow (LNEC, Portugal)





#### **Use Cases**

- Workflows required
  - specific dependencies in the environment
  - external services
- Re-executions on different
  - version of operating system
  - distribution
  - system architecture















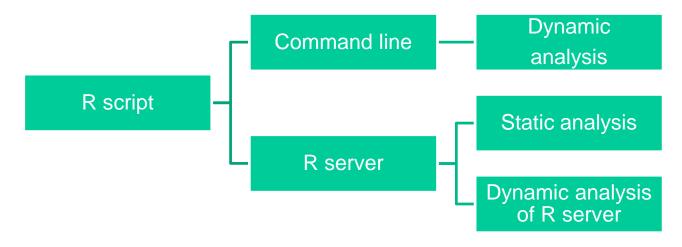






## **Results - dependencies detection**

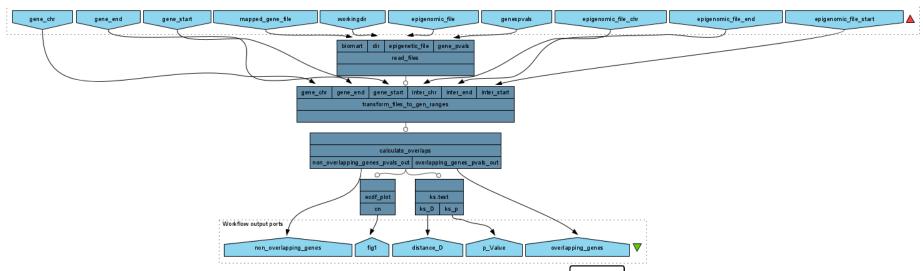
- All dependencies were identified
  - R dependencies
  - Ruby dependencies
  - Java libraries
  - local tools (e.g. pdflatex)





#### Results- external services

- All external communications detected (web services)
- Limited validation for external services (Rserve scripts)
  - global variables
  - steps with no outputs
  - only final result of workflow computation is validated
    - black box testing





#### Results – instance data

- Dynamic analysis detected
  - data created through shell calls
    - such files are not a part of provenance traces in Taverna
  - 'real' workflow outputs
    - Taverna traces can contain paths only, but not the content
    - Taverna workflows can create files not linked to any output

```
I, [2015-11-30T15:44:14.448859 #8787] INFO -- : row 1
skipped. I, [2015-11-30T15:44:15.159204 #8787] INFO -- :
========= running time total: 0.710367914 ==========
No of statements in a file 29590 I,
[2015-11-30T15:44:15.159824 #8787] INFO -- : 0.708272803
```





#### **Results— validation metrics**

- detected changes on different stages of workflow processing
  - metadata included in data
    - generation timestamp
  - file format comparison improved the results
    - ZIP archives

% latex table generated in R 3.0.2 by xtable 1.7-1 package % Tue Apr 21 13:37:05 2015

\begin{table}[ht]\centering \begin{tabular}{rrrrrr} \hline & Min & 1Q & Mediana & Media & 3Q & Max \\ \hlineResiduos (mm) & -2.42 & -1.23 & -0.52 & -0.00 & 0.45 & 5.52 \\ \hline \end{tabular} \caption{Residuos do modelo} \end{table}

Utilizador admin		
Data da execu��o	21-04-2015 12:37	
Barragem	275	
Fim da construï $\frac{1}{6}$ $\frac{1}{2}$ $\ddot{i}$ $\frac{1}{2}$ $\ddot{o}$	1943-04-01	
Inï¿ 1/2 cio do primeiro enchimento	1960-01-01	
Tipo de instrumento	125	
Grandezas	Desl. radial (mm)	
	Desl. tangencial (mm)	
Nï, 1/2 instrumentos	4	
Designa��o	FP1	
22	FP1	
	FP2	
	FP2	
Elementos da matriz X	CTE	
	H, H4	
	COSD, SEND	
	T	
Peri <u>j</u> ado ani <u>j</u> lise	[2005-01-01,2013-01-01]	
Fim da IQ	2008-01-01	





#### Recommendations

- Analyse dependencies and evade shell calls
  - e.g. use scripting mechanisms provided by the workflow engine
- Write code that runs on all platforms
  - e.g. do not encode specific paths
- Publish experiment setup and context
  - e.g. exact versions of tools used
- Publish validation data
  - e.g. provenance but also other files created during execution
- Test the replicability on your own
  - e.g. try rerunning your experiment in a clean virtual machine



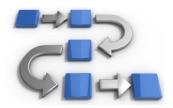


### **Conclusions**

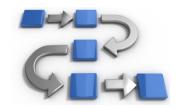


I have repeated her experiment in the same way!
I got the same results!
I can reuse any part of it!





VFramework







Original experiment

Re-executed experiment

