## Data Sharing, Standards and workflows in Metabolomics: Towards reproducible Metabolomics

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#### NETTAB Rome 2016



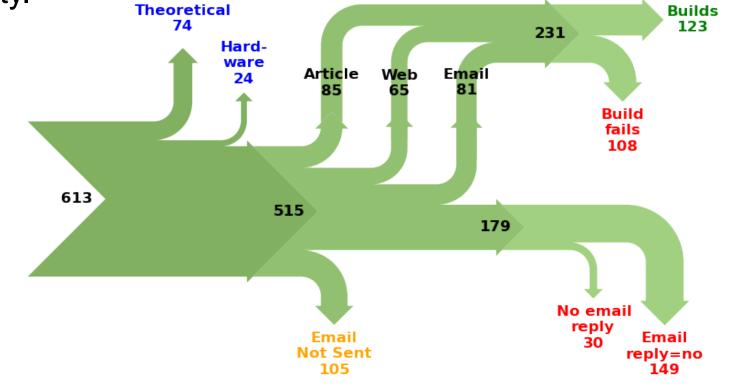
### To make efficient use of data...

- What do I mean by reproducibility
- Data Sharing;
  - > data publication is insufficient
  - > data "sharing" is needed for reuse, mashup, and integration of the data
- Standards;
  - > standardization of terminology MI and SOP
    - via Society or international organizations
  - > standardization of **data exchange** format
  - clarification of rules regarding data exchange (copyright, personal information, etc...)
  - Privacy and ethic were applicable
- Creation and management of a portal website from which users access existing DB
  - Data analysis reproducibility



## Example: Digital! Reproducibility

Reproducibility is a **cornerstone of the scientific** process: only if my colleagues can reproduce my work should they trust its veracity.



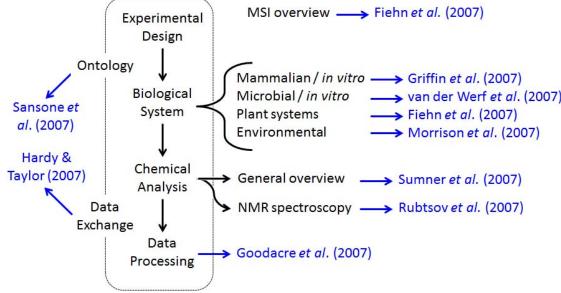
Christian Collberg & Todd Proebsting

http://reproducibility.cs.arizona.edu/



## Metabolomics Standard Initiative (WG)

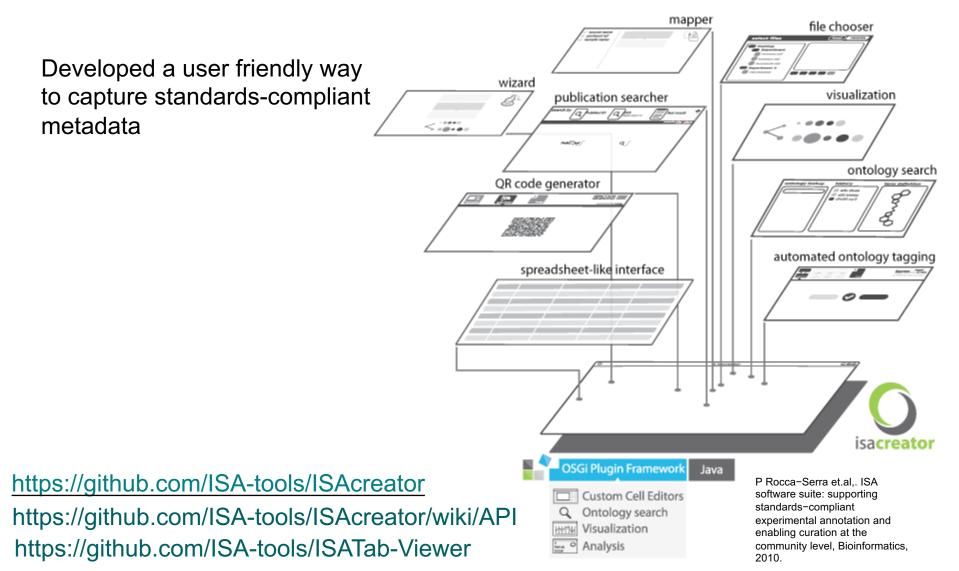
- Lives at <u>http://msi-workgroups.sourceforge.net</u>
- 5 Workgroups
  - Biological context metadata WG
  - Chemical analysis WG
     Data processing WG
     Ontology WG
     Experimental Design
     Ontology WG
    - Exchange format WG



Roy Goodacre Metabolomics (2014) 10:5-7



## Capturing Metadata: ISA-Tab format



#### Susanna-Assunta Sansone and ISA team



## **ISAcreator – Using Ontologies**

	×
search ontologies >>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>	🚔 term definition
Recommended Ontologies All Ontologies	Term name: Caenorhabditis elegans
Search for: Caenorhabditis elegans	Service Provider: BioPortal
4 terms from 2 ontologies	accession: obo:NCBITaxon_6239
NCBITaxon - NCBI organismal classification Caenorhabditis elegans(obo:NCBITaxon_6239)	database_cross_reference: GC_ID:1
Caenorhabditis elegans/Monacrosporium haptotylum mixed EST library(obo	has_exact_synonym: nematode
NEWT - NEWT UniProt Taxonomy Database	has_obo_namespace: ncbi_taxonomy
	has_related_synonym: Rhabditis elegans
	oboInOwl:id: NCBITaxon:6239
	rdfs:label: Caenorhabditis elegans
∲ filter ∫	
i unce l	
Selected term. (You can also enter freetext here): NCBITaxon:Caenorhabditis elegans	🛛 🖉 🖉 🖉

EMBL-EBI

## MetaboLights – Current submission pipeline

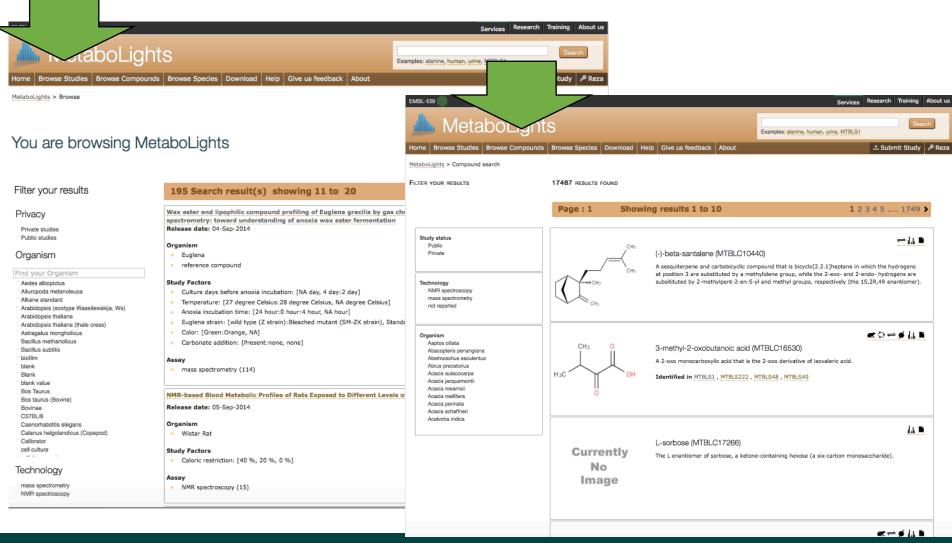


#### MetaboLights

Users browse investigations, query and view experimental metadata, and access associated data files via the **web application** 



## MetaboLights Studies and Compounds



MetaboLights - an open-access general-purpose repository for metabolomics studies and associated meta-data. *Nucl. Acids Res.* (2012) doi:10.1093/nar/gks1004



## MetaboLights – Study Validation Status

EMBL-EBI			Services	Research	Training	About us
MetaboLight	S	MTBLS1 Examples: alanine, human, urine, MTBLS1			Sear	ch
Home Browse Studies Browse Compounds	Browse Species Analysis Download Help Give us feedback About			1 Submi	t Study	🎤 Login
MetaboLights > Search						
You are searching Me	taboLights	Į	- Show	more data	from EMI	BL-EBI
Filter your results	52 results, showing 1 7 40		« ‹	Page 1 of	6 > »	
Туре	A metabolomic study of university changes in type 2 diabetes in human of	compared to the control grou	р			
<pre>compound study</pre>	Validations Status: O O ®					
Organism	Release date: 14-Feb-2012 Organism					
Find your Organism Homo sapiens	Homo sapiens					
<ul> <li>Daphnia magna</li> <li>Saccharomyces cerevisiae</li> <li>reference compound</li> <li>Caenorhabditis elegans</li> <li>Schizosaccharomyces pombe 972h-</li> <li>Arabidopsis thaliana</li> </ul>	Study Factors Gender Metabolic syndrome	To			-	



#### MetaboLights – Study Validation details

Study Design Description

Samples Assay -

Study Files St

Study Validation 🗶

Validations marked with (\*) are specially approved by the MetaboLights Curators

Protocols

Show 10 \$ entries

Condition 17	Status 1	Description 1	Requirement 1	Group 1	Message 11
*	PASSES	Study Title	MANDATORY	STUDY	ок
×	PASSES	Study Description	MANDATORY	STUDY	ок
*	PASSES	Study text successfully parsed	OPTIONAL	STUDY	ок
*	PASSES	Study Contact(s) have listed email	MANDATORY	CONTACT	ок
×	PASSES	Sample(s)	MANDATORY	SAMPLES	ок
*	PASSES	Sample Name consistency check	MANDATORY	ASSAYS	ок
×	FAILS	Publication(s) associated with this Study	MANDATORY	PUBLICATION	Study Publication is missing
*	PASSES	Minimal Experimental protocol	MANDATORY	PROTOCOLS	ок
×	INCOMPLETE	Comprehensive Experimental protocol	OPTIONAL	PROTOCOLS	Protocol description is not sufficiently detailed or not all required fields are provided. Missing field(s): Chromatography, Metabolite identification, Sample collection
×	FAILS	Sample Collection protocol	MANDATORY	PROTOCOLS	Sample data is provided but no 'Sample collection' protocol is described

Showing 1 to 10 of 19 entries

Previous 1 2 Next

Search:



## Data sharing repositories

MBL-EBI Metaboligh Metaboligh Iome Browse Studies Browse Compound	Is Browse Species Download Help Give us feedback About	Services Research Training About us Search Champies: alanine, human, urine, MTBL51
retabolights > Browse You are browsing Me	etaboLights	
Filter your results Privacy Private studies Public studies Organism	71 Search result(s) showing 1 to 10 NMR based metabolomics of Human Type 2 Diabetes urine samples Release date: 15-Feb-2012 Organism Homo sapiens (Human)	Actions - http://www.metabolomicsworkbench.org/
Find your Organism Alkane standard Arabidopsis (ecotype Wassilewskija, Ws) Arabidopsis thaliana. Col-0 Arabidopsis thaliana (thale cress) biofilm Bos taurus (Bovine) Bovinae CS7BL/6 Ospeck belika shares	Study Factors <ul> <li>Metabolic syndrome: [type 2 diabetes mellitus:Control Group]</li> <li>Gender: [Female Gender(Female_Gender):Male Gender(Male_Gender)]</li> </ul> <li>Assay         <ul> <li>NMR spectroscopy (132)</li> </ul> </li>	Home Metabolomics Update Data Standards Resources NIH Metabolomics Training About
Calanus helgolandicus     Release date: 14-Aug-2012       HEK293     Organism       Homo sapiens (Human)     Nicotiana attenuata (Coyote tobace)	Organism Nicotiana attenuata (Coyote tobaco	Welcome to the UCSD Metabolomics Workbench, a resource sponsored by the Common Fund of the National Institutes of Health.         Invitation to deposit metabolomics experimental data         Funding Opportunities         Call for Pilot and Feasibility Project         Applications from XIH grantees/projects, as long as the metadata and results requirements are followed. Templates for data deposition are available in the "Metadata and Experimental Data Deposition" section d <sup>2</sup> of the website along with tutorials and examples on the organization of the data infrastructure and use of these templates. For any questions concerning data upload please contact <u>Dr. Eoin Fahy</u> .       Regional Comprehensive Metabolomics Resource Cores (RCMRC)s
Format conversion		Invitation to Nominate Compounds for Synthesis         Michigan Regional Comprehensive Metabolomics Resource Core (MRC) <sup>2</sup> &           As part of the NIH Common Fund's Metabolomics Program, the Metabolite Standards Synthesis Core (MSSC) aims to provide metabolomics researchers with high quality metabolite standards. We invite scientists to <u>nominate compounds for synthesis</u> . Nominated compounds will be reviewed by the NIH Common Fund's executive committee, and prioritized for synthesis.         NIH West Coast Metabolomics Center at UC Davis &           NiH Eastern Regional Comprehensive Metabolomics (Resource Core at RT] International &         NIH Eastern Regional Comprehensive Metabolomics (SECIM) &           Southeast Center for Integrated Metabolomics (SECIM) &         Southeast Center (Integrated Metabolomics (SECIM) &
nttp://ebi.a	c.uk/metabolights/	Metabolomics Workbench Highlights         Ressure Carlor for Stabil Isotope- Resolved Metabolomics (RC-SiRM) 6 <sup>a</sup> Three new Regional Comprehensive Metabolomics Resource Cores (RCMRC)s have joined the NIH Metabolomics Consortium: <ul> <li>Southeast Center for Integrated Metabolomics (SECIM) 6<sup>a</sup></li> </ul> Resource Cores releases
		EMBL-EBI

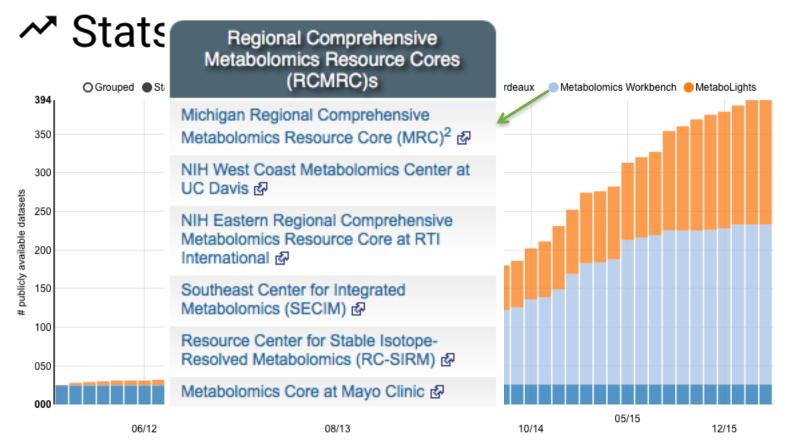
### http://metabolomexchange.org

395 datasets available 📃

2

Metabolome change

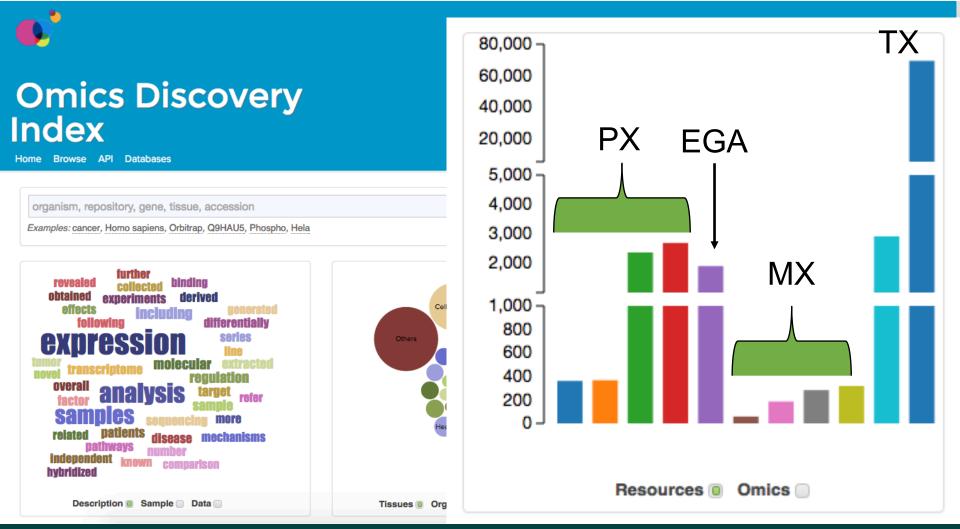
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**COSMOS** - Coordination of Standards in Metabolomics



# Use case for metadata: OmicsDI – Collection of omics



BD2K-EBI Yasset Perez Riverol and Henning Hermjakob; Perez-Riverol, Yasset, et al. "Omics Discovery Index - Discovering and Linking Public Omics Datasets." bioRxiv (2016): 049205. (bioRxiv)

EMBL-EBI



\*:\* AND instrument\_platform:"Orbitrap" AND omics\_type:"Metabolomics

Q Search

Examples: cancer, Homo sapiens, Orbitrap, Q9HAU5, Phospho, Hela

#### Omics Discovery Index

Home Browse API Databases

Help About 🗣 Feedback

#### 46 Q Results for search term: \*:\* AND instrument\_platform:"Orbitrap" AND omics\_type:"Metabolomics"

Show results for	Page 1 2 3 4 Sort by: Accession Relevant	Page size 15 20	Showing 1 - 15 of 46
Proteomics (0) Metabolomics (46) Transcriptomics (0) Genomics (0) Multi-Omics (0)	Metabolomics-based e	lucidation of active metabolic pathways in e d reticulocytes were compared with mature piens	
Repository Find your repositories GNPS (14) MetaboLights (22)			
MetabolomicsWorkbench (10)	A total of 8 samples fro	nic analysis of the small intestinal content of m 6 week old, female C57BL/6 mice, treate n the small intestinal fecal content at the ter	d for 3 weeks with a malnourished diet or a control-fed isocaloric o



## Leading to data discovery

 organism, repository, gene, tissue, accession
 Q Search

 Examples: cancer, Homo sapiens, Orbitrap, Q9HAU5, Phospho, Hela

#### Omics Discovery Index

Home Browse API Databases

•

y	Dataset Information	Similar Datasets
f	Metabolomics-based elucidation of active metabolic pathways in erythrocytes and HSC-derived reticulocytes	P Hs_GSCs 2014-12-31l PAe005052   PeptideAtlas
	ABSTRACT: Human stem cell derived reticulocytes were compared with mature erythrocytes by metabolomics analysis.	V Test Metabolomics set
+	DATA PROTOCOL: HILIC POSITIVE ION MODE	2014-05-02l E-TABM-289   ArrayExpress
	INSTRUMENT(S): Orbitrap;	Metabolomic profiling of twenty
in	ORGANISM(S): Homo sapiens;	metabolites from human tissues in six studies 2014-05-02I E-TABM-290   ArrayExpress
G+	TISSUE(S): Blood;	2014-05-021 E-TABM-230 TATTayExpress
	ST000403   MetabolomicsWorkbench	Quantitative Proteomics Reveals Metabolic Differences in Homing and Non- Homing Glioma Stem Cell Xenografts and Stromal Cells 2016-02-17J PXD001778   PRIDE



## DATA FORMATS

## Why different formats?



U-Matic (3/4")







8mm, Hi-8, Digital8













Beta SP

Betamax

VHS-C

**DVCam** 

#### **COordination of Standards in** MetabOlomicS -FP7





#### Images from Google

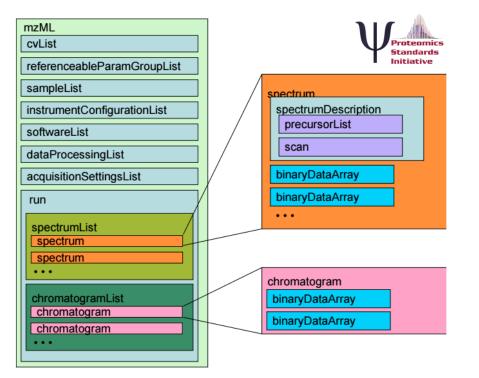
#### Data Standards, Exchange; What is XML?

- XML stands for EXtensible Markup Language
- XML is a markup language much like HTML
- XML was designed to carry data, not to display data
- XML is designed to be self-descriptive

#### NMR analysis

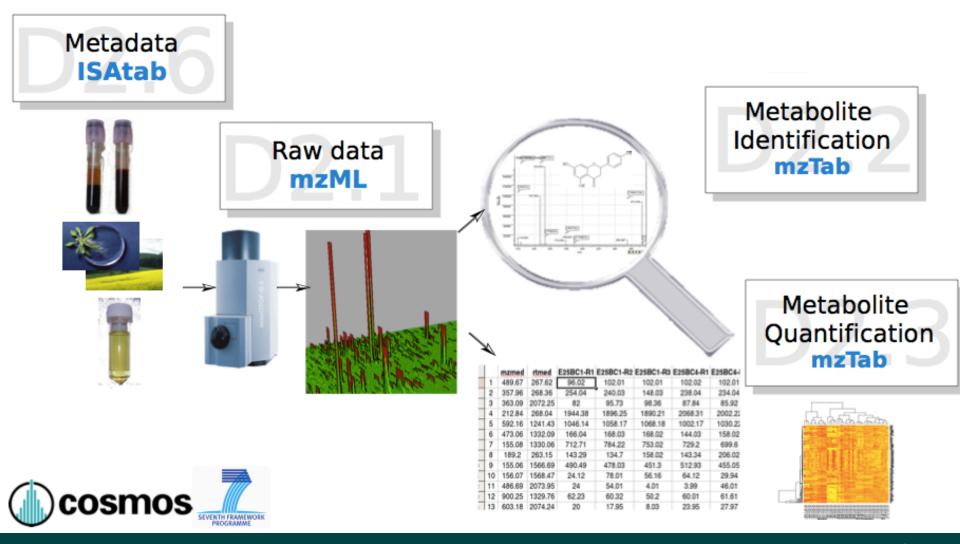
All spectra were recorded on a <Varian NMR Instrument> Varian VNMRS 600 NMR Spectrometer </Varian NMR Instrument> operating at a proton NMR frequency of <Irradiation frequency>599.83 <Megahertz>MHz</Megahertz> </Irradiation frequency> using a <cryoprobe>5 mm inverse detection cryoprobe</cryoprobe>. <acquisition nucleus>1H</acquisition nucleus> NMR

spectra were recorded [...].



**EMBL-EBI** 

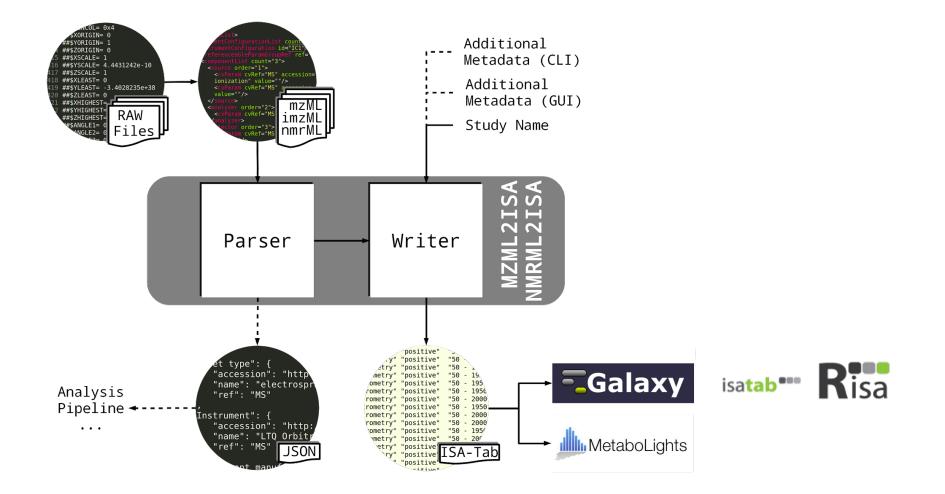
## Data exchange standards in MS





Slide from; Steffen Neumann (IPB-Halle), Proteomics and HUPO-PSI community

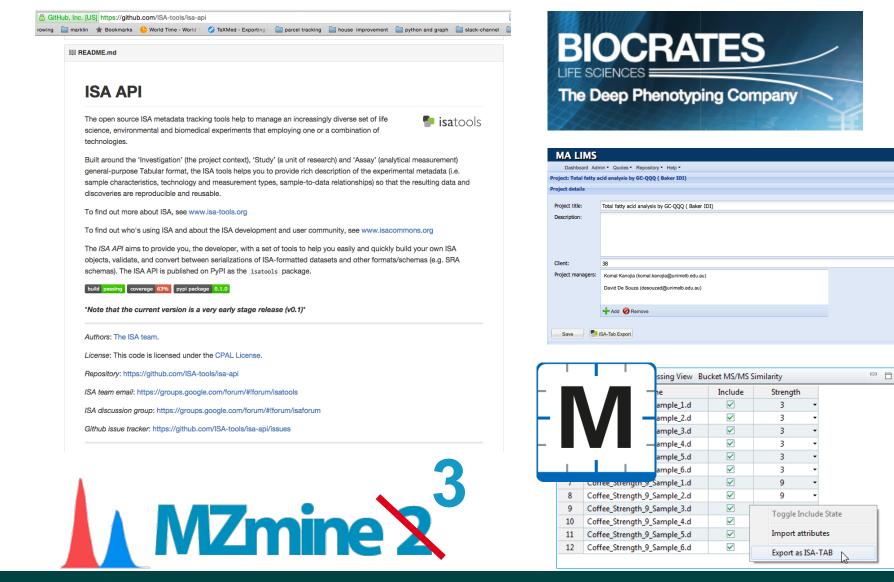
# Generating ISA-Tab metadata files from metabolomics XML data



#### https://github.com/ISA-tools/mzml2isa



## Tools the way forward!



8

9

10

11 12 Coffee\_Strength\_9\_Sample\_3.d

Coffee\_Strength\_9\_Sample\_4.d

Coffee\_Strength\_9\_Sample\_5.d

Coffee\_Strength\_9\_Sample\_6.d



q

Toggle Include State

Import attributes

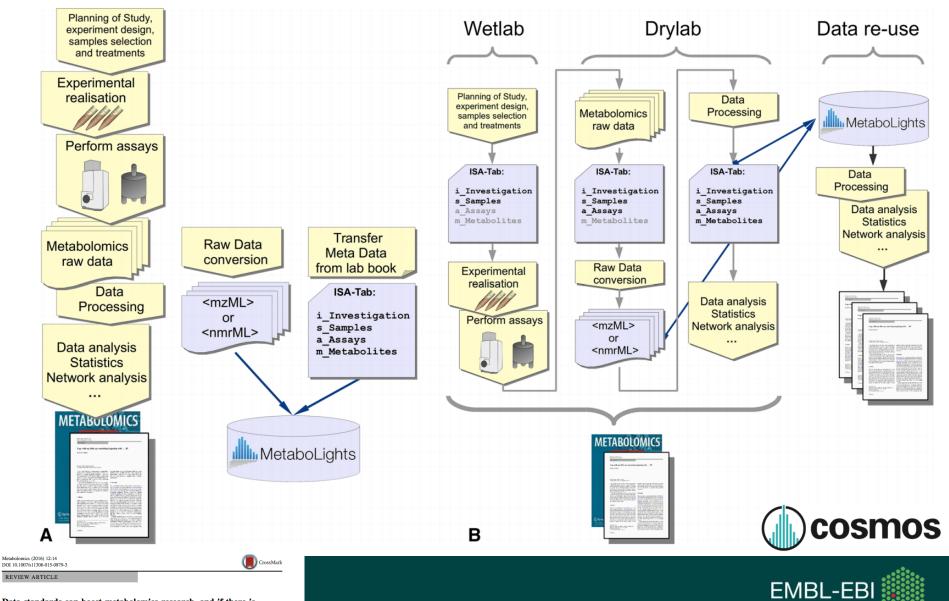
Export as ISA-TAB

 $\checkmark$ 

~

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## Current way and ideal



Data standards can boost metabolomics research, and if there is a will, there is a way

# DATA ANALYSIS THE MISSING LINK

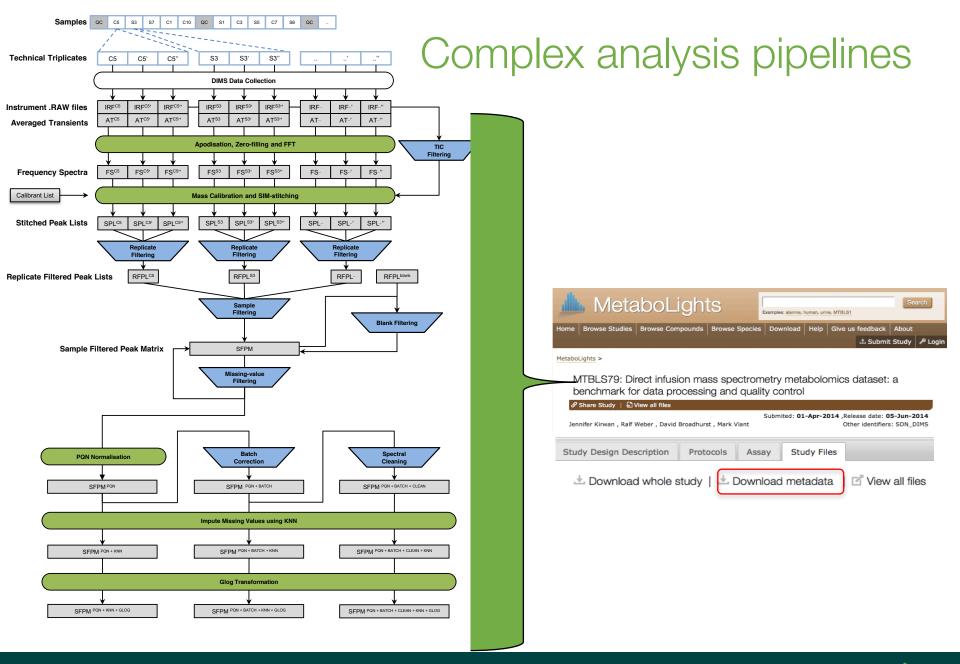


# What software we have –which one should I choose?

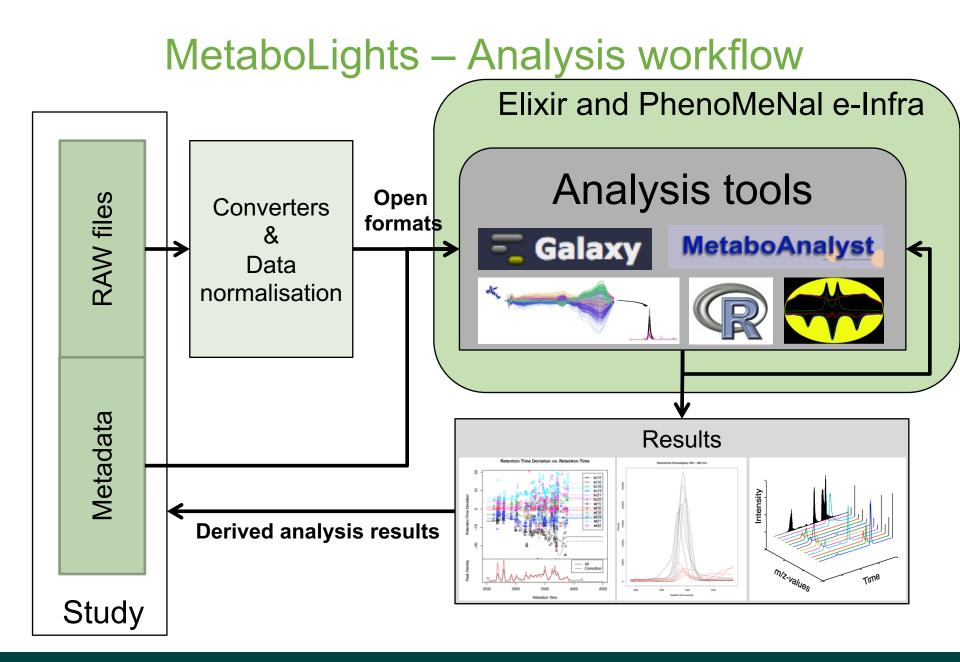
Type of Tool	Number
LC/MS	93
GC/MS	32
NMR	24
Metabolite Identification	29
Lipid Identification	6
Lipidomics - Other	2
Statistical Analysis	13
Pathway Analysis	9
Total	208

#### **Rachel Spicer**











### PhenoMeNal - Goal





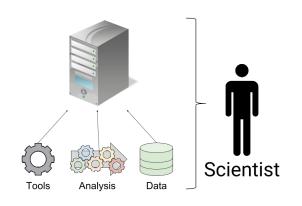
PhenoMeNal; http://phenomenal-h2020.eu/

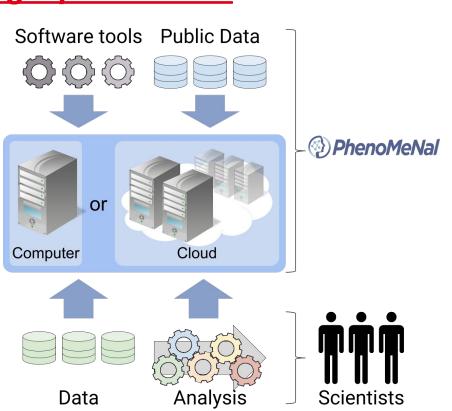


# Key objectives

- Understand the computational needs of the Metabolomics Community.
- Integrate and scale <u>existing Open Source</u> tools into a welltested e-infrastructure.

Today





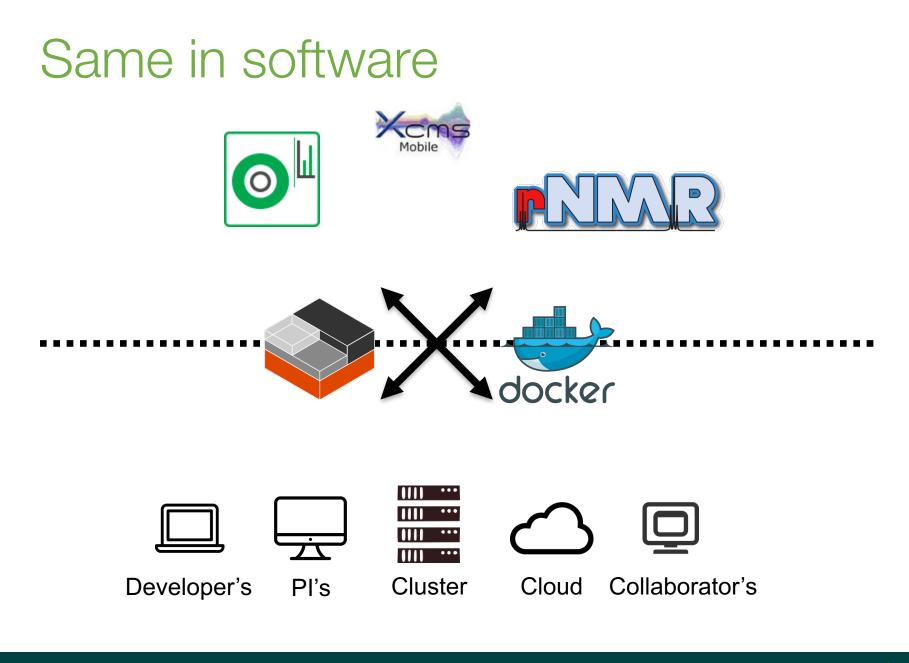
#### PhenoMeNal; EMBL-EBI



## Major revolution







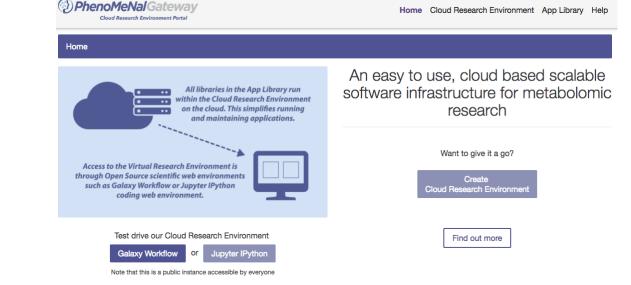
PhenoMeNal; EMBL-EBI



#### VRE Portal

- Three usability rounds
- 80% functionality running.
- Public instance access.
- App Library, hooked to EGI AppDB.
- Documentation.

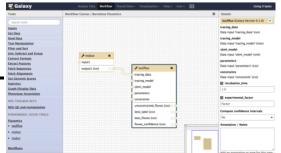
http://portal.phenomenalh2020.eu/



The open-source App Library provides a catalogue of free Metabolomic data analysis libraries available within the Cloud Research Environment

With user feedback and ratings it is easier to choose the best software for	
your analysis	
Browse App Library	





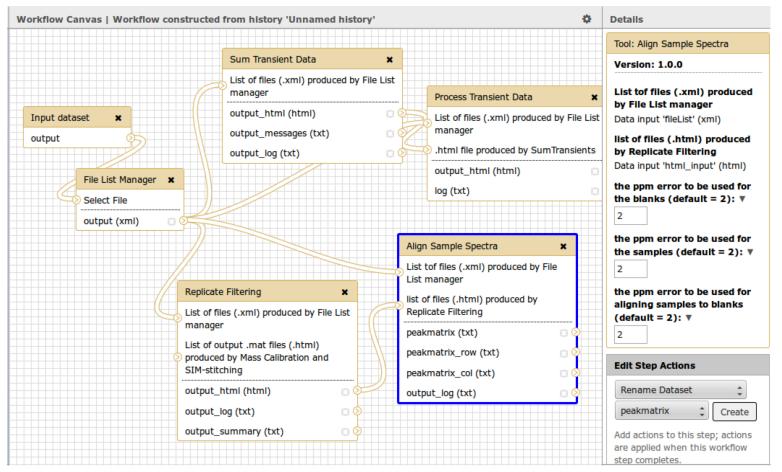
Access your Cloud Research Enviroment through standard scientific open-source web environments, Galaxy Workflow tool and Jupyter coding environment

#### PhenoMeNal; EMBL-EBI



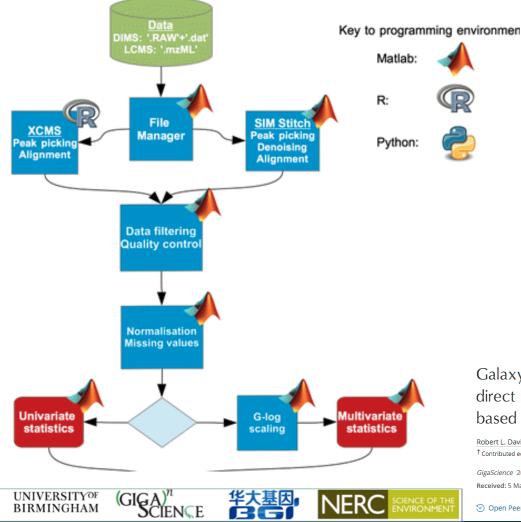
## Why workflow?

#### View, share, edit, rerun workflow





## Birmingham galaxy-m metabolomics workflow



- Many tools
- Many languages
- Complex to learn
- Many parameters
- Complex to report

Galaxy-M: a Galaxy workflow for processing and analyzing direct infusion and liquid chromatography mass spectrometry-based metabolomics data

Robert L. Davidson<sup>†</sup>, Ralf J. M. Weber<sup>†</sup>, Haoyu Liu, Archana Sharma-Oates and Mark R. Viant 📼 <sup>†</sup> Contributed equally

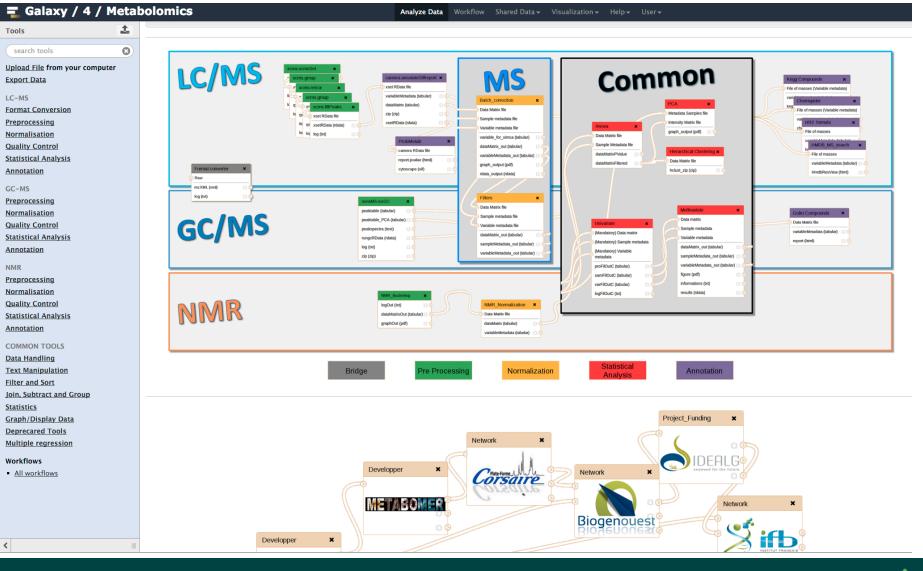
 GigaScience
 2016
 5.10
 DOI: 10.1186/s13742-016-0115-8
 © Davidson et al. 2016

 Received: 5 March 2015
 Accepted: 6 February 2016
 Published: 23 February 2016

Open Peer Review reports



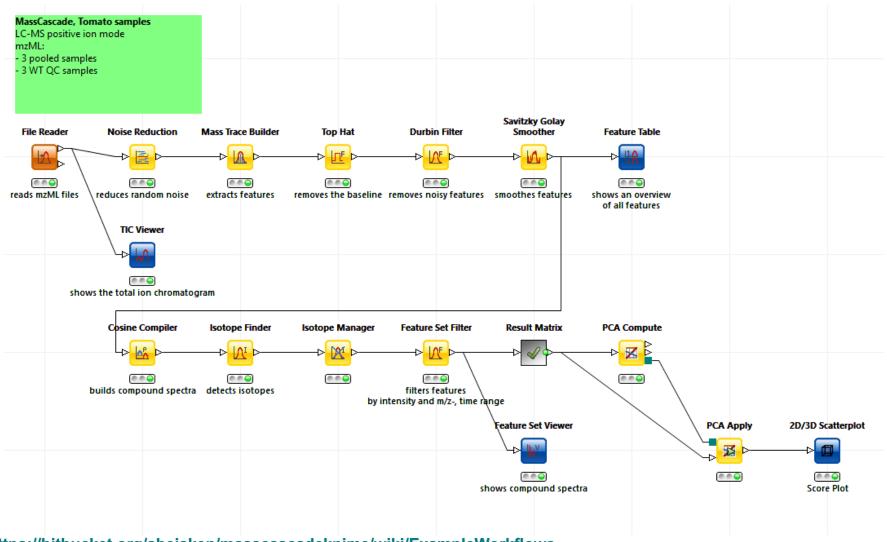
## Workflow4metabolomics.org



#### Workflow4metabolomics.org



#### MassCascade EMBL-EBI



https://bitbucket.org/sbeisken/masscascadeknime/wiki/ExampleWorkflows



## MetaboLights – The team



#### Kenneth Haug



Kalai Jayaseelan



Venkata Chandrasekhar



Jose Ramon Macias Gonzalez



Christoph Steinbeck



Reza Salek



Mark Williams



Keeva Cochrane

Xuefei Li (MRC)



Jules Griffin (UC/MRC)

Previous: Paula de Matos, Mark Rijnbeek, Tejasvi Mahendraker, Pablo Conesa



## EBI PhenoMeNal – The team



#### Kenneth Haug



#### Pablo Moreno



#### Christoph Steinbeck



Reza Salek



Sijin He



Namrata Kale



### **COSMOS** consortium











#### PhenoMeNal consortium





## **Funding and Collaborators**









MRC Human Nutrition Research

Improving health through nutrition research





