Multi-Omics Bioinformatics across Application Domains

#### Christoph Steinbeck

European Bioinformatics Institute (EMBL-EBI)

#### The European Molecular Biology Laboratory

- 60 nationalities
- 1800 personnel

#### Main laboratory



#### **Bioinformatics**

# Hinxton, Cambridge, UK

#### Structural biology



#### Neuroscience



#### Structural biology





## **European Bioinformatics Institute**



### **European Bioinformatics Institute**



### **European Bioinformatics Institute**



# **European Bioinformatics Institute**



#### A word about BrExit: EMBL member states

Austria, Belgium, Croatia, Czech Republic, Denmark, Finland, France, Germany, Greece, Iceland, Ireland, Israel, Italy, Luxembourg, Netherlands, Norway, Portugal, Spain, Sweden, Switzerland and the UK

Associate member states: Argentina, Australia

Prospect member states: Hungary, Poland, Slovak Republic



+-

### Our funders

- EMBL-EBI is primarily funded by EMBL member states.
- Other major funders:
  - European Commission
  - Research Councils UK
  - National Institutes of Health
  - Wellcome Trust
  - Industry Programme





### **Bioinformatics services**

Data and tools to support life-science research

#### www.ebi.ac.uk/services



## **European Bioinformatics Institute (EBI)**

#### Genes, genomes & variation



#### Big data, big demand

#### ~18.5 million requests to EMBL-EBI websites every day

#### Scientists at over 5 million unique sites use EMBL-EBI websites

#### EMBL-EBI handles 9.2 million jobs on average per month

# 60 petabytes

of EMBL-EBI storage capacity



# Post Genomic Era

[O]ur understanding of the human genome has changed in the most fundamental ways. The small number of genes -- some 30,000 -- supports the notion that we are not hard wired. We now know the notion that one gene leads to one protein, and perhaps one disease, is false.

#### Craig Venter, June 2001



# Genes are not the full story







#### 'Indians are getting as fat as Americans': Obesity crisis swells among India's middle class youth as children choose Western fast food over traditional cuisine

- Obesity spreading across India as a result of Western food invasion
- Indian fast food market worth £7bn expected to double by 2016
- Doctors fitting gastric bands on children as young as 13
- As a result of the obesity epidemic the country also has diabetes epidemic
- India already has largest diabetes population in world: 50m sufferers
- Medical professionals expect it to reach 100m soon
- Indians are more genetically predisposed to developing diabetes
- Documentary India's Supersize Kids on BBC iPlayer now

#### By MARTHA DE LACEY

PUBLISHED: 16:58, 15 August 2013 | UPDATED: 17:00, 15 August 2013







Top 10 Causes of Death: 1900 vs. 2010.







Disease



Nutrition





Phenome/

Exposome

Exercise



Environment



Drugs

The Metabolome is the most accessible and dynamically changing Molecular Phenotype



# Metabolomics

# Measures occurrence and concentrations of many small molecules (metabolites) in an organism at once.





Urine (time-averaged data) Plasma (snap-shot data)



Other accessible analytical compartments



Organism Parts





### Metabolomics uses a wide-range of analytical techniques



# Metabolomics has taken off world-wide



Year





An international data aggregation and notification service for metabolomics.

### Stats





### •8.7 mio eukaryotic species on earth (+- 1.3mio)



# 8.7 mio eukaryotic species on earth (+- 1.3mio) 1.2 mio species identified and classified

•8.7 mio eukaryotic species on earth (+- 1.3mio)

- I.2 mio species identified and classified
- 3000 4000 complete species genomes sequenced



•8.7 mio eukaryotic species on earth (+- 1.3mio)

- I.2 mio species identified and classified
- 3000 4000 complete species genomes sequenced



8.7 mio eukaryotic species on earth (+- 1.3mio)
1.2 mio species identified and classified
3000 - 4000 complete species genomes sequenced

What about completed metabolomes?



8.7 mio eukaryotic species on earth (+- 1.3mio)
1.2 mio species identified and classified
3000 - 4000 complete species genomes sequenced

What about completed metabolomes?





Metabolites. 2016 Feb 15;6(1)



#### Communication

#### The Time Is Right to Focus on Model Organism Metabolomes

Arthur S. Edison <sup>1</sup>, Robert D. Hall <sup>2</sup>, Christophe Junot <sup>3</sup>, Peter D. Karp <sup>4</sup>, Irwin J. Kurland <sup>5</sup>, Robert Mistrik <sup>6</sup>, Laura K. Reed <sup>7</sup>, Kazuki Saito <sup>8</sup>, Reza M. Salek <sup>9</sup>, Christoph Steinbeck <sup>9</sup>, Lloyd W. Sumner <sup>10</sup> and Mark R. Viant <sup>11,\*</sup>

Building upon extensive genomics research, we argue that the time is now right to focus intensively on model organism metabolomes. We propose a grand challenge for metabolomics studies of model organisms: to identify and map all metabolites onto metabolic pathways, to develop quantitative metabolic models for model organisms, and to relate organism metabolic pathways within the context of evolutionary metabolomics, *i.e.*, phylometabolomics. These efforts should focus on a series of established model organisms in microbial, animal and plant research.



# Species Metabolomes are being assembled on the fly right now through data sharing in Metabolomics

# MetaboLights Database at the EBI





# MetaboLights Database at the EBI



# MetaboLights Database at the EBI



# MetaboLights Repository at the EBI



Labs around the world send us their data and we...

EBI databases are supported over decades

Archive it

Classify it

EMBL-EB

Share it with other data providers

...provide

tools to hel

researcher

Analyse it

use it

## Data growth in EBI data repositories



## Data growth in EBI data repositories











EMBL-EBI





# **Repository Entry**

EMBL-E	:ві 🌒							Servic	es Research Training Abou
	Metab	oLights						Examples: alanine, Homo sapiens, urine, N	Search
Home	Browse Studies	Browse Compounds	Browse Species	Analysis Do	wnload Help	Give us feedback	k About		土 Submit Study 🎤 Lo
Metabo	Lights > Study								
	Submitte	d		In curation			In review		Public
M	IS assay)							•	
M •	Authors: Shi Jianxin ,	Hu Chaoyang				🛗 Subr	mitted: 30-Nov-2	015 , Release date: 03-May-2016	, Update date: 03-May-2016 Hu   ■ Study status: Public
M • st	IS assay) Authors: Shi Jianxin , Share Study	Hu Chaoyang				🛗 Subr	mitted: 30-Nov-2	015 , Release date: 03-May-2016 Submitted by: Chaoyang View Metabolites Assa	, Update date: <b>03-May-2016</b> Hu   ■ Study status: Public
M St He ide me and See s	IS assay) Authors: Shi Jianxin , Share Study audy Description re we investigated the ntified 214 metabolites tabolic kinetics corres d tomato, while others tudy MTBLS286 and N	Hu Chaoyang dynamic metabolic c s. Principal componer ponded well to the ph show rice specific pa	hanges along the rice it and clustering analy ysiological status of the tterns. C-MS pos and neg as	grain developmen sis revealed both ne developing gra	nt of two japonica cultivar and dev ins, and some of for this study.	a and two indica cult elopmental stage de f metabolic changes	ivars using non-ta pendent metaboli in developing gra	015 , Release date: 03-May-2016 Submitted by: Chaoyang View Metabolites Assa argeted metabolomics approach, i ic changes in rice grains. Generally in of monocot rice are common w	, Update date: 03-May-2016 Hu   R Study status: Public y Download Study files h which we successfully t, the stage specific ith those of dicot Arabidopsis

# **Repository Entry**

#### ≯ Metabolites

Show 10 ‡ e	10 \$ entries Search:						
Metabolite identification	Chemical formula	Species 1	Smiles 11	InChi It			
5-Oxoproline (Pyroglutamate) (CHEBI:16010)	C5H7NO3	Oryza sativa	OC(=0)C1CCC(=0)N1	InChI=1S/C5H7NO3/c7-4-2-1-3(6-4)5(8)9/h3H,1- 2H2,(H,6,7)(H,8,9)			
Adenine (CHEBI:16708)	C5H5N5	Oryza sativa	C1=NC2=C(N1)C(=NC=N2)N	InChI=1S/C5H5N5/c6-4-3-5(9-1-7-3)10-2-8-4/h1-2H, (H3,6,7,8,9,10)			
Alanine (CHEBI:16449)	C3H7NO2	Oryza sativa	CCOC(=O)N	InChI=1S/C3H7NO2/c1-2-6-3(4)5/h2H2,1H3,(H2,4,5)			
Arginine (CHEBI:29016)	C6H14N4O2	Oryza sativa	C(CC(C(=O)O)N)CN=C(N)N	InChI=1S/C6H14N4O2/c7-4(5(11)12)2-1-3-10- 6(8)9/h4H,1-3,7H2,(H,11,12)(H4,8,9,10)			
Benzoate (CHEBI:30746)	C7H6O2	Oryza sativa	OC(=O)c1ccccc1	InChI=1S/C7H6O2/c8-7(9)6-4-2-1-3-5-6/h1-5H, (H,8,9)			
Beta-Alanine (CHEBI:16958)	C3H7NO2	Oryza sativa	C(CN)C(=O)O	InChI=1S/C3H7NO2/c4-2-1-3(5)6/h1-2,4H2,(H,5,6)			
Dehydroascorbate (CHEBI:17242)	C6H6O6	Oryza sativa	OCC(0)C1OC(=0)C(=0)C1=0	InChI=1S/C6H6O6/c7-1-2(8)5-3(9)4(10)6(11)12- 5/h2,5,7-8H,1H2			
Fructose (CHEBI:28757)	C6H12O6	Oryza sativa					
Fumarate	C4H4O4	Oryza sativa	OC(=0)C=CC(0)=0	InChl=1S/C4H4O4/c5-3(6)1-2-4(7)8/h1-2H,(H,5,6)			

# Reference Layer

EMBL-EBI		Services Research	Training About us
MetaboLights		Examples: alanine, human, urine, MTBLS1	Search
Home Browse Studies Browse Compounds Browse Species Downlo	oad Help Give us feedback About	1 Submit	Study 🎤 Login
MetaboLights > Species search			
Species selection page			
See below for some direct links to some common model organisms and a wider	r list of all the organisms we have information about	t.	
Model organisms	Taxonomy Search		
<ul> <li>Homo sapiens (Human)</li> <li>Mus musculus (Mouse)</li> <li>Arabidopsis thaliana (thale cress)</li> <li>E. coli</li> <li>Saccharomyces cerevisiae (Baker's yeast)</li> <li>Caenorhabditis elegans</li> </ul>	Start typing the first 3 letters of the species name		
Taxonomy Browser (1593 species)			
Animals • Bacteria • Chromista • Fungi • Others • Plants •	Ascomycota • Basidiomycota •	<ul> <li>Farrowia seminuda</li> <li>Fusarium solani</li> <li>Geotrichum</li> <li>Gliocladium</li> <li>Gliocladium virens</li> <li>Halorosellinia oceanica</li> <li>Hirsutella kobayasii</li> <li>Hypocrella species</li> <li>Hypoxylon truncatum</li> <li>Isaria farinosa</li> </ul>	
		O Isaria sinclairii	
		O Isaria tenuipes	

#### Filter your results

#### 15 results, showing 1 to 10

« < Page 1 of 2 >





EMBL-8	ві 🌒									Services	Research	Training	About us
	Metak	ooLights							Examples: alanine, Homo saple	ns, urine, MTBI	.81	Sear	ch
Home	Browse Studies	Browse Compounds	Browse Species	Analysis	Download	Help	Give us feedba	ack About			± Submit	Study	🔎 Login
Metabo	Lights > Compound	page											
	Tyrosine										MTBL	C1818	86
	2D 3D		Chemistry	Biology	NMR spec	tra	MS spectra	Literature					
			DEFINITION An alpha-amino Chemical Proper	acid that i	s phenylalanine Chemical Prop	bearing perties	a hydroxy substi	tuent at positio	on 4 on the phenyl ring.				
		NH <sub>2</sub> OH	Synonyms External links		Property		Value						
	HO				InChlKey		OUYCCCASQSF	EME-UHFFFA	OYSA-N				
					InChl		InChl=1S/C9H11	NO3/c10-8(9(	12)13)5-6-1-3-7(11)4-2-6/h	1-4,8,11H,5,	10H2,(H,12,	13)	
					Formula		C9H11NO3						
	tyrosine - (CHEBI:1	8186)			Molecular Weight	r	181.18889						
	1 Upload Reference	ce Spectra			Exact Ma	SS	181.07389						

EMBL-EBI





# 7 most annotated metabolomes in MetaboLights



# 30 most annotated metabolomes in MetaboLights



# 1600 metabolome sizes in MetaboLights on a log scale

**Histogram of Metabolome Size** 



Metabolome Size



# Number of Studies in MetaboLights per Species





#### SCIENTIFIC DATA

Home Archive About V For Authors V For Referees Data Policies V Collections V

Home 
Data Descriptors 
Data Descriptor

SCIENTIFIC DATA | DATA DESCRIPTOR OPEN

#### Metabolic differences in ripening of Solanum lycopersicum 'Ailsa Craig' and three monogenic mutants

Stephan Beisken, Mark Earll, Charles Baxter, David Portwood, Zsuzsanna Ament, Aniko Kende, Charlie Hodgman, Graham Seymour, Rebecca Smith, Paul Fraser, Mark Seymour, Reza M. Salek & Christoph Steinbeck

Affiliations | Contributions | Corresponding authors

Scientific Data 1, Article number: 140029 | doi:10.1038/sdata.2014.29 Received 10 April 2014 | Accepted 06 August 2014 | Published online 16 September 2014



Citation Reprints

Rights & permissions Article metrics

#### Abstract

Abstract • Background & Summary • Methods • Data Records • Technical Validation • Usage Notes • Additional information • References • Data Citations • Acknowledgements • Author information

Application of mass spectrometry enables the detection of metabolic differences between groups of related organisms. Differences in the metabolic fingerprints of wild-type *Solanum lycopersicum* and three monogenic mutants ripening inhibitor (rin), non-ripening (nor) and Colourless non-ripening.

Advanced search

Go

About Scientific Data Scientific Data is an open-access, peer-reviewed publication for descriptions of scientifically valuable datasets. Our primary article-type, the Data Descriptor, is designed to make your data more discoverable, interpretable and reusable.

Search

![](_page_51_Picture_17.jpeg)

#### Associated Links

Mol. Inf. | Article

 $\boxtimes \square$ 

MassCascade: Visual Programming for LC-MS Data Processing in Metabolomics by Stephan Beisken *et al* 

Bioinformatics | Article

ProteoWizard: open source software for rapid proteomics tools development by D. Kessner *et al* 

![](_page_51_Picture_23.jpeg)

npj Systems Biology and Applications

![](_page_51_Picture_25.jpeg)

![](_page_52_Figure_0.jpeg)

![](_page_52_Picture_1.jpeg)

# Multi-Omics Data Handling

![](_page_53_Picture_1.jpeg)

![](_page_54_Picture_0.jpeg)

#### BioSamples - database of sample descriptions

The BioSamples database aggregates sample information for reference samples (e.g. Coriell Cell lines) and samples for which data exist in one of the EBI's assay databases such as <u>ArrayExpress</u>, the <u>European Nucleotide Archive</u> or <u>PRIDE</u>. It provides links to assays an specific samples, and accepts direct submissions of sample information.

#### S Info

- Help pages about how to search BioSamples, how to submit data, and FAQ.
- Programmatic access to query and download data using web services.
- Latest news about BioSamples database.
- The BioSamples database now offers access to RDF, and a supporting SPARQL endpoint as part of the EBI's RDF platform.
- Contact us by emailing biosamples@ebi.ac.uk

#### Sexternal links

- Experimental Factor Ontology
- Human Induced Pluripotent Stem Cells Initiative (HipSci)
- 1000 Genomes
- Encyclopedia of DNA Elements (ENCODE)
- Catalogue Of Somatic Mutations In Cancer (COSMIC)

#### Jata Content

- 4,733,993 Samples
- 57,274 Groups

```
HipSei
```

EMBL-EBI	Services	Research	Training	Industry	About us
News	By topic	Overview	Overview	Overview	Overview
Brochures	By name (A-Z)	Publications	Train at EBI	Members Area	Leadership
Contact us	Help & Support	Research groups	Train outside EBI	Workshops	Funding
s://www.ebi.ac.uk		Postdocs & PhDs	Train online	SME Forum	Background

![](_page_54_Picture_20.jpeg)

![](_page_55_Picture_0.jpeg)

#### BioStudies - database of biological studies

The BioStudies database holds descriptions of biological studies, links to data from these studies in other databases at EMBL-EBI or outside, as well as data that do not fit in the structured archives at EMBL-EBI. The database can accept a wide range of types of studies described via a simple format. It also enables manuscript authors to submit supplementary information and link to it from the publication.

![](_page_55_Picture_3.jpeg)

Latest

![](_page_55_Figure_4.jpeg)

- Drosophila lilliputian is required for proneural gene expression in retinal development [S-EPMC4946344]
- Early pediatric atopic dermatitis shows only a cutaneous lymphocyte antigen (CLA)(+) TH2/TH1 cell imbalance, whereas adults acquire CLA(+) TH22/TC22 cell subsets [S-EPMC4946641]
- A population-based study of hospital care costs during 5 years after transient ischemic attack and stroke [S-EPMC4946629]
- Population-based study of disability and institutionalization after transient ischemic attack and stroke: 10-year results of the Oxford Vascular Study [S-EPMC4946627]

EMBL-EBI

Proteome wide purification and identification of O-GlcNAc-modified proteins using click chemistry and mass

# A Case for Deep Metabolome Annotation

Kingdom	Latin Name	Common Name
Bacteria	Escherichia coli	-
Fungi	Saccharomyces cerevisiae	yeast
Animal (invertebrate)	Caenorhabditis elegans Danhnia magna	nematode water flea
Alumai (invertebrate)	Drosophila melanogaster *	fruit fly
Animal (vertebrate)	Danio rerio Mus musculus	zebrafish mouse
Plant	Arabidopsis thaliana ** Medicago truncatula Oryza sativa Solanum lycopersicum	thale cress barrel medic, model legume rice tomato

\* International Drosophila Metabolomics Curation Consortium [30]; \*\* Metabolomics subcommittee (chaired by Kazuki Saito) within the Multinational Arabidopsis Steering Committee [31].

# A Case for Deep Matchelome American

### Help building species metabolomes

- Submit your metabolomics study to MetaboLights
- Submit data publications (e.g. to NATURE Scientific Data)
- Be highly cited :)

Solanum lycopersicum

tomato

\* International Drosophila Metabolomics Curation Consortium [30]; \*\* Metabolomics subcommittee (chaired by Kazuki Saito) within the Multinational Arabidopsis Steering Committee [31].

# Slides at https://www.slideshare.net/csteinbeck

# Funding

![](_page_58_Picture_2.jpeg)

![](_page_58_Picture_3.jpeg)

bioscience for the future

![](_page_58_Picture_4.jpeg)

![](_page_58_Picture_5.jpeg)

European Commission

# Thanks for your attention

![](_page_59_Picture_1.jpeg)

### Thank you!

Metabolights-help@ebi.ac.uk EMBL-EBI

![](_page_61_Picture_0.jpeg)