

Telling the Whole Tale via Reproducible Data Data NE Reuse

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Data Reuse for Reproduci

ucible Synthesis	
 Fiorenza Micheli, Benjamin Halpern, Shaun Walbridge, Sa Francesco Ferretti, et al. Cumulative Human Impacts or Mediterranean and Black Sea Marine Ecosystems, 201 Network for Biocomplexity. doi:10.5063/F15M63Z8. Sea Sea Sea Sea Sea Sea Sea Sea Sea Sea	aul Ciriaco, 1 13. Knowledge
 Benjamin Halpern, Shaun Walbridge, Kimberly Selkoe, Carrier Fiorenza Micheli, et al. A Global Map of Human Impact Ecosystems, 2008. Knowledge Network for Biocomplexit doi:10.5063/F19C6VN5. Image: Selection of the selec	arrie Kappel, on Marine .y.
 Benjamin Halpern, Shaun Walbridge, Kimberly Selkoe, Carrier Fiorenza Micheli, et al. Transformed Stressor Data: A Generation Marine Ecosystems, 2008. Knowledge Biocomplexity. doi:10.5063/F1F47MCW. Image: Participation of the second stress of the second stresecond stress of the second stress of the second stress of the	arrie Kappel, I obal Map of ge Network for





Theoretical and Applied Climatology

November 2016, Volume 126, <u>Issue 3–4</u>, pp 699–703 | <u>Cite as</u>

Learning from mistakes in climate research

Authors

Authors and affiliations

Rasmus E. Benestad 🖂 , Dana Nuccitelli, Stephan Lewandowsky, Katharine Hayhoe, Hans Olav Hygen, Rob van Dorland,

John Cook

Open Access | Original Paper First Online: 20 August 2015





replicationDemos

help

Meta

🛅 demo

html

🖿 data

INDEX

NAMESPACE

DESCRIPTION

replicationDemos.rdb

replicationDemos.rdx

replicationDemos

Rdata.rdx

Rdata.rdb

Rdata.rds

R



Follow

Ships with an R package



Edzer Pebesma @edzerpebesma

Replying to @jhollist @metamattj

It is on CRAN, but in Archived; I could install it after installing a bunch of other Archived packages from source, and could run a number of examples. Another number depended on web resources no longer available.

5:04 AM - 14 Jul 2019

4



Parsing Reproducibility

• Empirical Reproducibility:

• traditional empirical experiments, e.g. at the bench/lab

• Statistical Reproducibility:

• statistical methodology used permits generalizability of data inferences

• **Computational Reproducibility:**

• transparency of computational steps that produce scientific findings

Simplifying Computational Reproducibility in Whole Tale



- Researchers can **easily package** and **share** *tales*:
 - Data, Code, and Compute Environment
 - to **re-create the computational results** from a scientific study
 - achieving computational reproducibility
 - thus "setting the default to reproducible."
- Also empowers users to verify and extend results with different data, methods, and environments.

V. Stodden, D. H. Bailey, J. Borwein, R. J. LeVeque, W. Rider, and W. Stein. (2013). Setting the Default to Reproducible: Reproducibility in *Computational and Experimental Mathematics*, ICERM workshop (2013)



What exactly is (in) a Tale?

- Tale = executable research object, i.e.
 - data (references)
 - + code (computational methods)
 - + narrative (traditional science story)
 - + compute environment (e.g. RStudio, Jupyter)
- Captured in a standards-based tale format complete with metadata





Ancient farmers experienced climate change

determining where, when, and how changes

at the local level through variations in the

yields of their staple crops. However,

archaeologists have had difficulty in

in climate affected ancient farmers. We

This project produces all of the data from the Anharmonic vibrational structure of the carbon dioxide dimer with a many-body potential energy surface journal article. The project solves the vibrational Schrodinger equation for the CO2 monomer and dimer

Applicatio...

Replication package for: L2-Boosting for Economic Applications

The authors present the L2--Boosting algorithm and two variants, namely post-Boosting and orthogonal Boosting. Building and searching the Manager of Ore to all and (OD4 O), the average of the second se

© WholeTale (Build: {commit}) GReport a problem

This material is based upon work supported by the National Science Foundation under Grant No. OAC-1541450.

Launched Tales

L2-Boosting for Economic Applicatio...

Craig Willis 🚯 🗭

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Browse Existing Tales ...



L2-Boosting for Economic Applicatio... R Ye Luo and Martin Spindler



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rstudio 🕞 🛛 🕘

🙁 Project: (None) 🗸

🗏 List 🗸 🖂 🗸

Q

L2-Boosting for Economic Applicatio...

Craig Willis 🚯 🛟

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Run &

...

Interact with Tales

> load("/WholeTale/workspace/Sim_AER.RData")

R is a collaborative project with many contributors.

Type 'contributors()' for more information and

/WholeTale/workspace/ 🖄

Type 'q()' to quit R.

Console Terminal

1:1

© WholeTale (Build: {commit}) QReport a problem

This material is based upon work supported by the National Science Foundation under Grant No. OAC-1541450.

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... Integrate Data Repos with Whole Tale!

- Enables turnkey exploratory data analysis on existing published datasets
- DataONE and Dataverse networks cover > 90 major research repositories!



Publish Tale

Publishing will create an immutable copy of your Tale with a DOI. ()

This process will allow another user to easily rerun your published analysis using the WholeTale platform.

Please choose a target repository:*

DataONE-The Knowledge Network for Biocomplexity

More Details 🔻

Your published Tale will include everything that has been uploaded to its associated workspace.

The following required files will be generated and published along with the Tale itself:

- **Quantifying FAIR: metadata improvement and guidance in the DataONE repository network**
 - manifest.json ()
 environment.json ()
 LICENSE ()
 README.md ()
 metadata.xml ()

This process will allow another user to easily rerun your published analysis using the WholeTale platform.

For more information about publishing, please consult the Publishing Guide.



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... Publish Data, Code, and Environment

 Enables full circle reproducibility to DataONE

repositories that accept API deposits



Whole Tale Forecast Demo

Demonstration of a model to predict the movement paths of seals using satellite telemetry data.

Based on analysis and models by: Josh London and Devin Johnson NOAA Marine Mammal Laboratory

https://youtu.be/MI5d7r5OtCk









Whole Tale Collaboration (PI Team)

- **U Illinois** (NCSA) Bertram Ludäscher, Victoria Stodden, Matt Turk
 - overall lead (co-operative agreement)
 - reproducibility; provenance; open source software development; outreach
- U Chicago (Globus) Kyle Chard
 - data transfer & storage; compute; infrastructure
- UC Santa Barbara (NCEAS) Matt Jones
 - (meta-)data publishing; provenance; repositories
- U Texas, Austin (TACC) Niall Gaffney
 - compute; HTC; "big tale"; Science Gateways
- U Notre Dame (CRC) Jarek Nabrzyski
 - UX design; UI design





The Whole Team (members present in bold)

- Adam Brinckman (Notre Dame, Dev)
- Bertram Ludäscher (UIUC, PI)
- Bryce Mecum (UCSB, former Dev)
- **Craig** Willis (UIUC, Dev, tech project manager)
- Damian Perez (Notre Dame, former Dev)
- Ian Taylor (Notre Dame, SP, Dev)
- Jarek Nabrzyski (Notre Dame, co-PI)
- Joe Stubbs (U Texas, Dev)
- Kacper Kowalik (UIUC, Dev, Senior Architect)
- Kandace Turner (UIUC, former project mgr)
- Kristina Davis (Notre Dame, UI, UX)
- Kyle Chard (U Chicago, co-PI)

- MT Campbell (UIUC, project manager)
- Matt Jones (UCSB, co-PI)
- Matt Turk (UIUC, co-PI)
- Michael Lambert (UIUC, Dev)
- Mihael Hategan (U Chicago, Dev)
- Niall Gaffney (U Texas, co-PI)
- Rachel Volentine (UTK, UX)
- Sebastian Wyngaard (Notre Dame, Dev)
- Sivakumar Kulasekaran (U Texas, former Dev)
- Thomas Thelen (UCSB, Dev)
- Timothy McPhillips (UIUC, Dev)
- Victoria Stodden (UIUC, co-PI)

+ WT Summer Interns (7); WT/RDA Fellows (4+4); WG Leads (5); other collaborators



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