



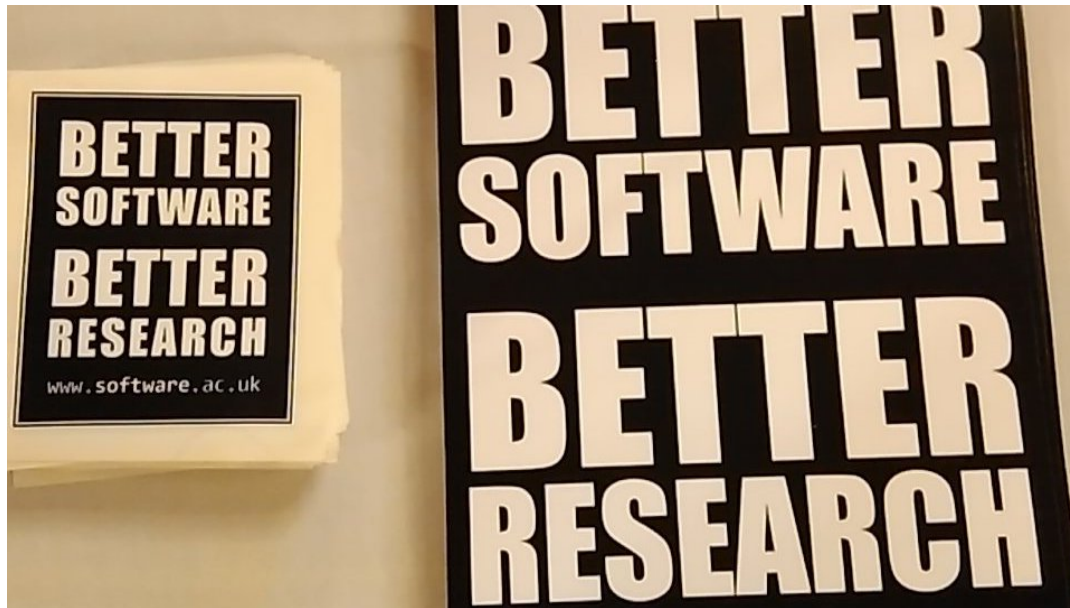
## Data skills and software training to enable data-driven-discovery

Tracy K. Teal, PhD

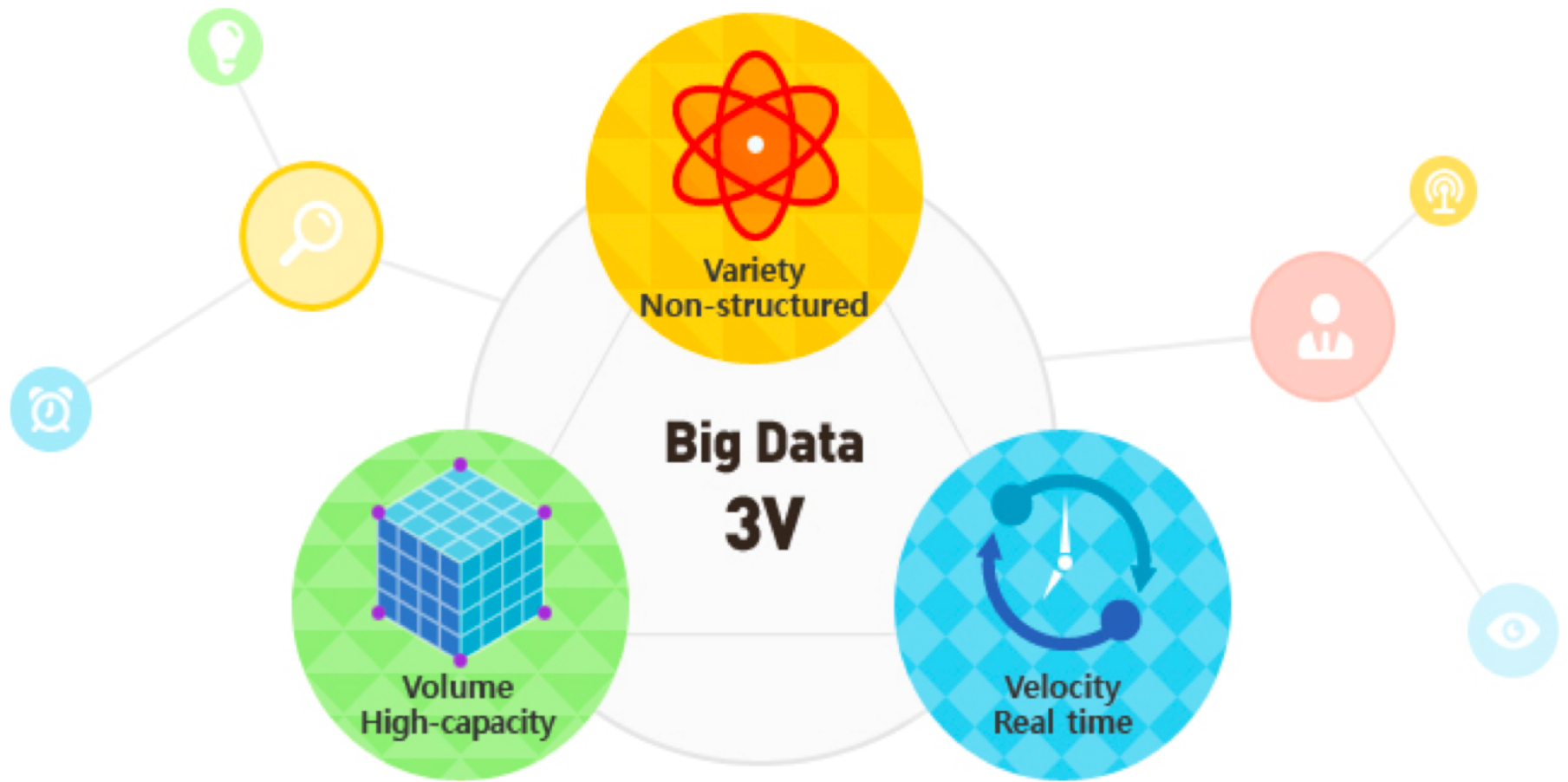
Data Carpentry, Executive Director

@tracykteal, @datacarpentry

Find these slides on GitHub: <https://github.com/tracykteal/msdse-presentation/>



**Happy Coder. Better Research.**



Software and tools allow us to turn data into information.

People turn information into knowledge.

By making data accessible and putting the data skills and the perspectives in the hands of all researchers, we allow them to answer their own questions and capture their passion and expert knowledge.

How do we scale data and software skills and literacy along with data production?



Training

# Researchers want training

Most useful thing Bioinformatics Resource Australia can do



[BRAEMBL community survey report](#)

# How do we provide training?

- Training in the gaps
- Scaling curriculum and instructors
- Friendly learning environment

# Training in the Gaps

# Training active researchers

Active researchers and employees are learning these skills "on the job".

Need to develop and deliver training that fits their time and needs.

- Training that is immediate, accessible, appropriate for their level and relevant to their domain.
- Include not only technical skills, but also ways of thinking about data and knowing what's possible
- Opportunity for deliberate practice, hands-on training with feedback during learning
- Researchers need to build confidence and the belief that they are capable of computational work, self-efficacy

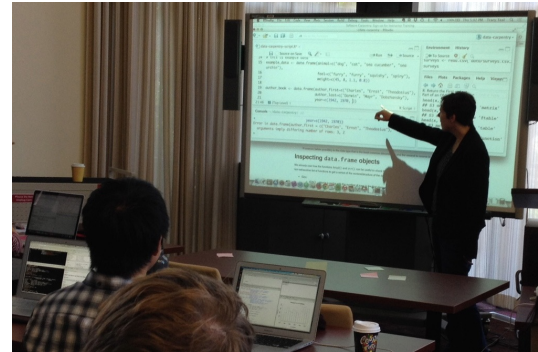
# Software Carpentry and Data Carpentry

Community organizations training researchers in best practices for data analysis and software development to make research more effective and reproducible.

- Core skills for effective research computing
- Two-day hands-on workshops
- Collaboratively developed, openly licensed lesson materials
- Over 700 trained volunteer instructors on 6 continents

# How we teach: Hands on intensive workshops

- Short: Two days
- Impactful: Focused time
- Convenient: Held at the university or organization
- Interactive: Hands-on teaching and exercises
- Immediate feedback: sticky notes & minute cards
- Qualified instructors
- Shared learning and a friendly learning environment

































# What we teach

Foundational skills needed to effectively conduct computational research.
















**Software Carpentry** Domain-agnostic and focused on better coding practices.

## Data Carpentry

Domain specific and focused on how to work effectively with data.

Lesson	Site	Repository	Reference	Maintainer(s)
The Unix Shell				<a href="#">Gabriel Devenyi</a> , <a href="#">Ashwin Srinath</a>
Version Control with Git				<a href="#">Ivan Gonzalez</a> , <a href="#">Daisie Huang</a>
Version Control with Mercurial				<a href="#">Doug Latornell</a>
Using Databases and SQL				<a href="#">Abigail Cabunoc Mayes</a> , <a href="#">Sheldon McKay</a>
Programming with Python				<a href="#">Trevor Bekolay</a> , <a href="#">Valentina Staneva</a>
Programming with R				<a href="#">Daniel Chen</a> , <a href="#">Harriet Dashnow</a>
R for Reproducible Scientific Analysis				<a href="#">Thomas Wright</a> , <a href="#">Naupaka Zimmerman</a>
Programming with MATLAB				<a href="#">Isabell Kiral-Kornek</a> , <a href="#">Ashwin Srinath</a>
Automation and Make				<a href="#">Gerard Capes</a>
Instructor Training				<a href="#">Erin Becker</a> , <a href="#">Christina Koch</a>


### Lessons

Lesson	Site	Repository	Instructor Guide	Maintainer(s)
Data Organization in Spreadsheets				<a href="#">Christie Bahlai</a> , <a href="#">Tracy Teal</a>
Data Cleaning with OpenRefine				<a href="#">Deborah Paul</a> , <a href="#">Cam Macdonell</a>
Data Management with SQL				<a href="#">Paula Andrea Martinez</a> , <a href="#">Timothée Poisot</a>
Data Analysis and Visualization in R				<a href="#">François Michonneau</a> , <a href="#">Auriel Fournier</a>
Data Analysis and Visualization in Python				<a href="#">John Gosset</a> , <a href="#">April Wright</a> , <a href="#">Mateusz Kuzak</a>



# People are learning the skills

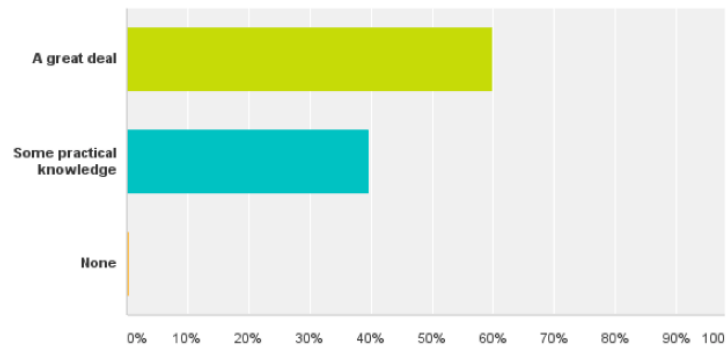
**Table 8:** Compared to before the workshop I have a better understanding of how to...

Item	n	Mean	Mode
Effectively organize data in spreadsheets	381	4.18	4
Use OpenRefine for data cleaning	311	4.61	5
Import a file into Python and work with the data	143	4.92	4
Import a file into R and work with the data	374	4.49	5
<b>Do initial visualizations in Python</b> 	<b>145</b>	<b>4.90</b>	<b>3</b>
Do initial visualizations in R	369	4.47	5
Construct a SQL query statement	273	4.61	5
Use the command line	326	4.47	5

# Skills are practical & workshops worth their time

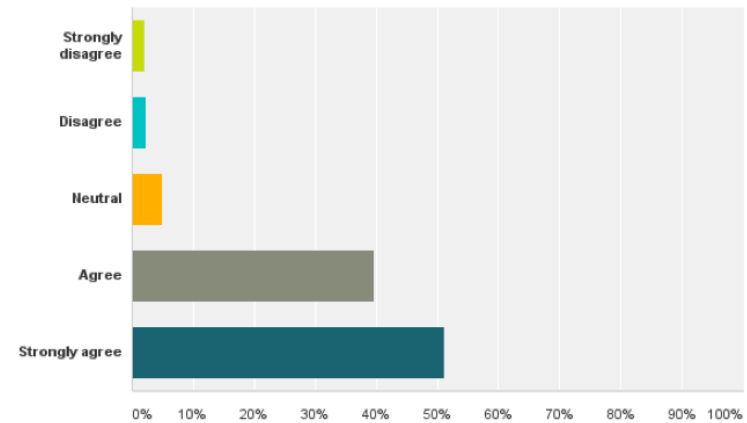
**Q9 How much practical knowledge have you gained from this workshop?**

Answered: 625 Skipped: 52



**Q15 This workshop was worth my time.**

Answered: 591 Skipped: 86



Scaling curriculum and instructors

# Sharing curriculum and creating instructors

- Collaboratively developed, openly accessible lessons
- <http://www.software-carpentry.org/lessons>
- <http://www.datacarpentry.org/lessons>
- Instructor training program

Since 2015

- 690 workshops
- 14,642 learners
- 6 continents

**Friendly learning environment**

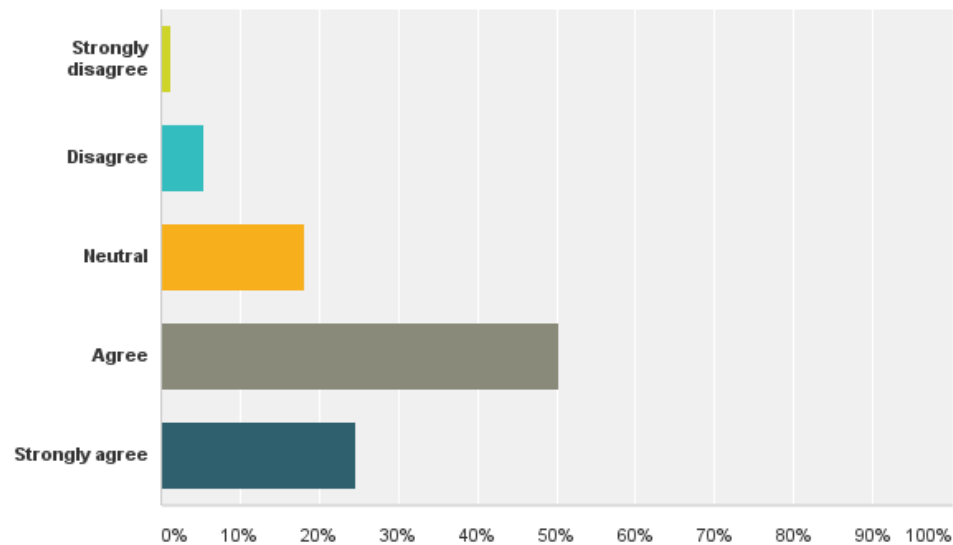
# Need confidence to continue learning

- Meeting learners where they are
- Code of conduct

# Learners feel they can apply what they learned

## Q14 I can immediately apply what I learned at this workshop.

Answered: 592 Skipped: 85

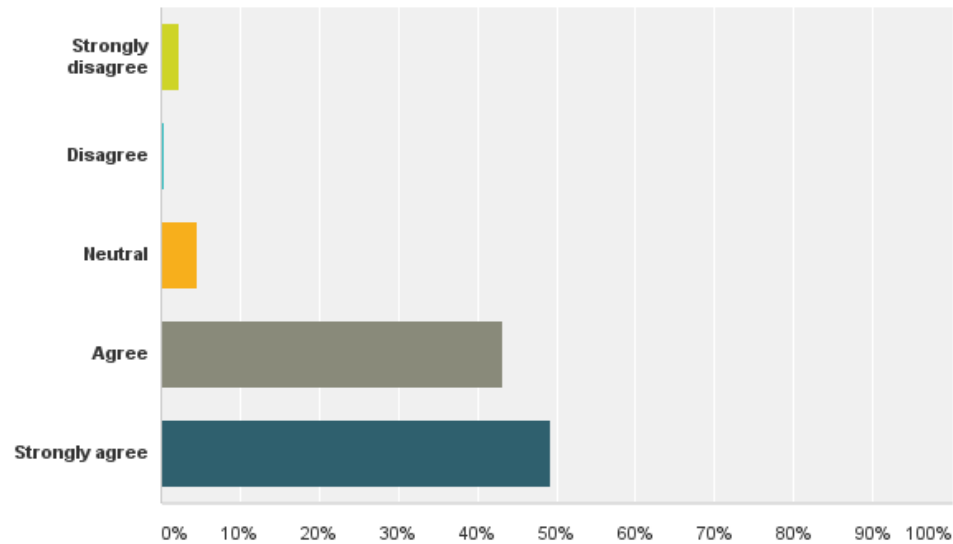




# Would recommend the workshop to a colleague or friend

**Q17 I would recommend this workshop to a friend or colleague.**

Answered: 217 Skipped: 460





# How can you or your organization be involved

- Request a workshop
- Become a Partner and build local training capacity
- Become an instructor or help at a workshop
- Contribute to lessons
- Join our 'announce' list to be a part of the community
- Be an advocate for training initiatives & opportunities

# Acknowledgements

- Over 700 volunteers worldwide that teach and develop lessons
- Greg Wilson, who founded Software Carpentry
- The Steering Committees of Software and Data Carpentry (Karthik Ram and Ethan White)
- Software and Data Carpentry staff: Jonah Duckles, Greg Wilson, Erin Becker, Maneesha Sane and Kari Jordan

# Acknowledgements

- Gordon and Betty Moore Foundation
- National Science Foundation BIO Centers: iDigBio, CyVerse, NESCent, SESYNC, BEACON, NEON

Happy Coders. Better Software.  
Better Research.





**DATA CARPENTRY**

BUILDING COMMUNITIES TEACHING UNIVERSAL DATA LITERACY