

# Developing Research Software Skills Pathways to Support the Future of High Performance and Exascale Computing

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# Overview

- **Background**
  - Research is changing!
  - The "skills gap"
- **Learning Pathways**
  - Why do we need them?
  - Challenges in developing learning pathways
- **UNIVERSE-HPC**
  - Brief overview of the UNIVERSE-HPC project
- **Future work and next steps**



# Research is changing!

- **We are seeing an accelerating shift towards “digital research”**
  - Technical elements now part of research across almost all domains
  - Work is increasingly computationally intensive – bigger data, larger simulations, novel architectures, etc.
  - Greater complexity, more specialist skills, things change quickly
- **Who provides the necessary technical skills?**
  - Traditionally, often (self taught?) researchers
  - Now, increasingly Research Software Engineers and other RTPs
  - Big changes in the software, data and infrastructure fields
  - Different drivers and aims when working in a research context
- **Why is this important?**
  - Greater focus on sustainability and management of software / data
  - REPRODUCIBILITY!



# The “skills gap”

- There is now extensive, easily accessible beginner-level training material
  - Carpentries, CodeRefinery, university modules, online tutorials, etc.
- Intermediate and advanced material much harder to find
- How do we bridge the “skills gap” between beginner knowledge and expert professionals?

Advanced/expert-level

The skills gap

Beginner-level



# The “skills gap”: Basic-level Skills

- Many different training and skills providers supporting the research community – some open source examples:
- **The Carpentries** (<https://carpentries.org/>)
  - Software Carpentry; Data Carpentry; Library Carpentry
  - Unix Shell; Introductory Python / R, Version Control (Git)
- **CodeRefinery** (<https://coderefinery.org/>) – Basic to intermediate
  - Version Control (Git), Jupyter notebooks, testing, reproducible research, modular code development
- **HPC Carpentry\*** (<https://www.hpc-carpentry.org/>) – Basic to intermediate
  - Python for HPC, Chapel, Terminal, parallelization, Snakemake

\*HPC Carpentry is not part of the core Carpentries suite but is a related community project.



# The “skills gap”: Advanced Skills

- **Limited scope for general training**
  - Courses run by groups including ARCHER2, PRACE, Pawsey, ...
  - Courses can be focused around specific infrastructure.
- **Much skill development the result of on-the-job training and experience**
  - Takes a long time to build the necessary experience and skills.
- **Infrastructure, hardware, software all changing rapidly**
  - At the advanced level, in particular, need ongoing development of new skills.
- **Proper pathways and structures around training are key**



Photo by Ali Shah, Ekhami on Unsplash

# Learning and skills pathways (I)

## • Why do we need them?

- Research Software Engineering is a cross-cutting discipline.
- Practitioners come from a range of research or industry backgrounds.
- Need to provide routes that highlight how to gain necessary competencies from a range of starting points.

## • Support more effective and structured skill development

- Self-taught developers frequently learn only the skills they need , when they need them.
- Easy to miss key related skills and best practices that support, e.g. quality, efficiency, ...
- Possible to progress a long way on limited foundational knowledge – this can lead to long-term future challenges.



# Learning and skills pathways (II)

- **Huge increase in the need for computational skills in research**
  - Software, data and computation now a core part of research lifecycle in almost all domains.
  - Demand is growing but there is a skills shortage.
  - Time to develop specialist skills too great for the speed of growth of their use in research.
- **Clear and structured pathways should**
  - Stimulate growth of training material development in required areas.
  - Reduce the time for RSEs/researchers to develop key skills.
  - Provide a clearer idea of where to go next for practitioners wanting to expand their learning.



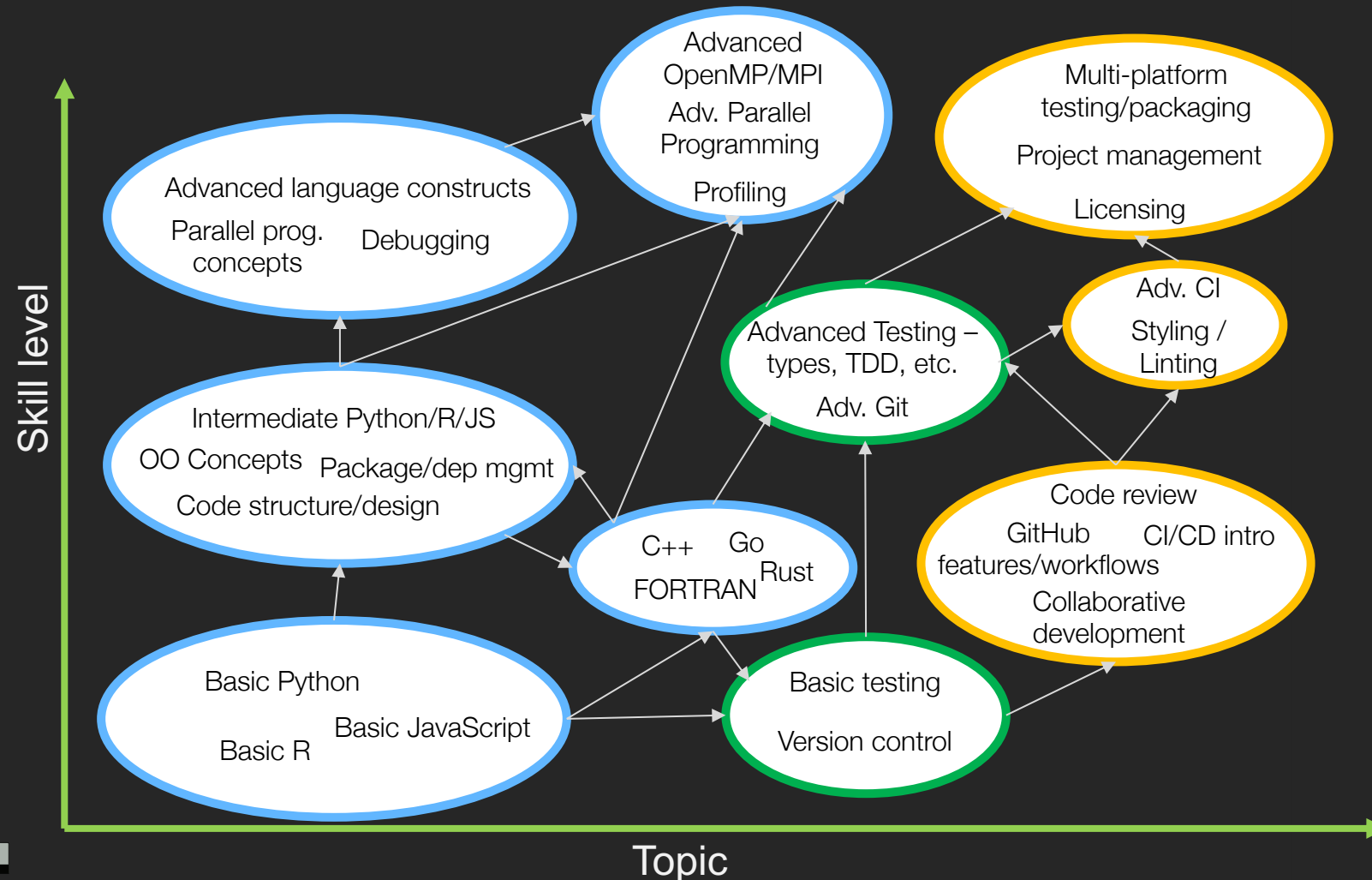


# Challenges in developing learning pathways

- **Domain-based or skills-based structure?**
  - e.g. “I currently know basic Python development and how to use Git/GitHub, what should I be looking to know next?”
  - e.g. “I am a computational chemist with three years of experience including developing software, what skills should I be looking to learn to make me a more effective researcher?”
- **Skills-based structures are easier to develop but may not map directly onto researchers expertise – likely to be better for RSEs**
- **Many different domains, different views on what’s important**



# Developing learning pathways: An example



# UNIVERSE-HPC:

Understanding and Nurturing an Integrated  
Vision for Education in RSE and HPC

<https://www.universe-hpc.ac.uk>

## Competencies and Skills

Identify the competencies and skills required by RSEs as they progress through their careers.  
Understand where these competencies are already being taught.

## Learning Pathways

Define different curriculum, learning pathways, and delivery mechanisms for providing training in RSE competencies, including as taught programmes, online/self-paced learning and professional development.

## Course Development + Delivery

Development of missing modules.  
Packaging of existing and new modules into different formats. Pilot delivery of courses.

## Community Support + Contributions

Facilitate professional networking and peer support for RSEs.  
Develop a community of maintainers for open materials.

Equity, Diversity and Inclusion

# Future work and next steps

- **Understand more about what the community wants**
  - What skills do people want/need to learn?
  - What do *you* think is missing?
- **Build on great examples**
  - Have you seen particular examples of structured training content that you think are great?
  - What do we need to see more of?
  - Maintain awareness of available content
- **Test emerging pathways within the community**
  - Test workshops / approaches / structures
  - Get feedback!



Thank you

Questions?