
Quality Characteristics for Software in HPC Environments: A Systematic Literature Review

deRSE25

Camilla Lummerzheim and Marius Politze

February 27th, 2025



IT Center



Motivation

Why quality characteristics?

- ▶ FAIR criteria for research software translate to qualities

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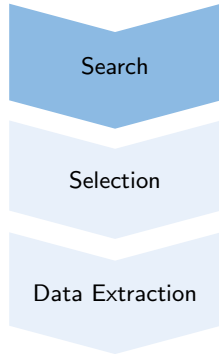
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- ▶ HPC system capabilities are needed by scientists across all domains
- ▶ Quality is important because of expensive runs
- ▶ Unique challenges like hardware heterogeneity

Goals

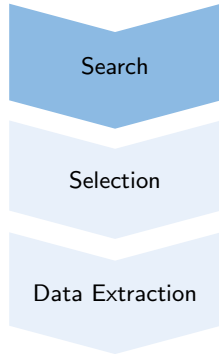
1. Investigate existing research on the topic
2. Find out which quality characteristics are important
3. Compare to quality characteristics from software in general

Systematic Literature Review - Search



[Kitchenham and Charters 2007]

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$\left(\begin{array}{c} \text{"software quality"} \\ \text{or} \\ \text{"code quality"} \\ \text{or} \\ \text{"software sustainability"} \\ \text{or} \\ \text{"software engineering" and ("quality" or "sustainability")} \end{array} \right) \text{ and } \left(\begin{array}{c} \text{"hpc"} \\ \text{or} \\ \text{"high performance comput*"} \\ \text{or} \\ \text{"high-performance comput*"} \end{array} \right)$

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► Applied to different indices

- Scopus
- BASE (Bielefeld Academic Search Engine)
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Systematic Literature Review - Search

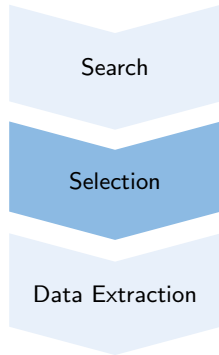


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- ▶ Applied to different indices
 - ▶ Scopus
 - ▶ BASE (Bielefeld Academic Search Engine)
 - ▶ dblp computer science bibliography
- ▶ Executed in August, 2024

[Kitchenham and Charters 2007]

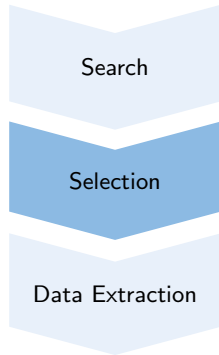
Systematic Literature Review - Selection



Inclusion criteria	Exclusion criteria
<ol style="list-style-type: none">1. Quality refers to an application software2. Software is intended to be executed in an HPC environment3. Characteristics of software quality are defined and analyzed	<ol style="list-style-type: none">1. Not in English language2. Duplicate3. Pre-print of an included publication4. Not in continuous full-text format5. Primarily about teaching the topics

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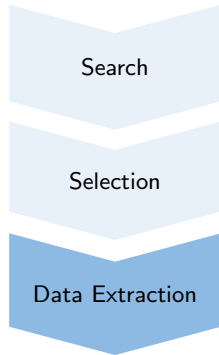


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► 29 included publications

[Kitchenham and Charters 2007]

Systematic Literature Review - Data Extraction



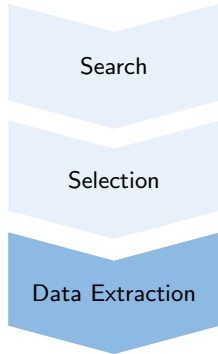
► General data

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[Kitchenham and Charters 2007]

[Lummerzheim 2025b]

Systematic Literature Review - Data Extraction

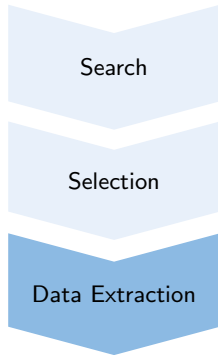


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[Kitchenham and Charters 2007]

[Lummerzheim 2025b]

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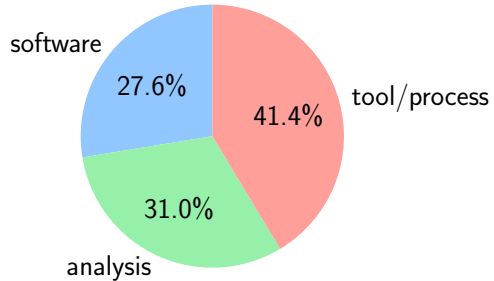


- ▶ General data
title, authors, publication venue, publication year, DOI, references,
application domain
- ▶ Quality characteristics and trade-offs between them
- ▶ Category
 - ▶ Tool and/or process
to measure or improve software quality aspects
 - ▶ Software
including a description of how software quality is approached
 - ▶ Analysis
of software quality, for example, the current state

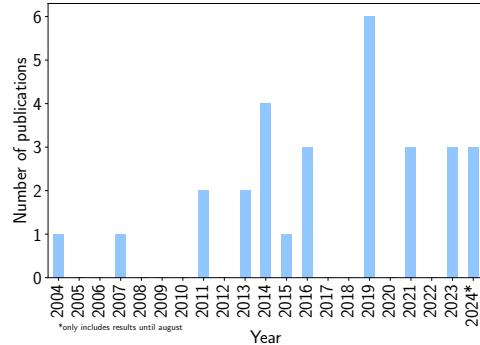
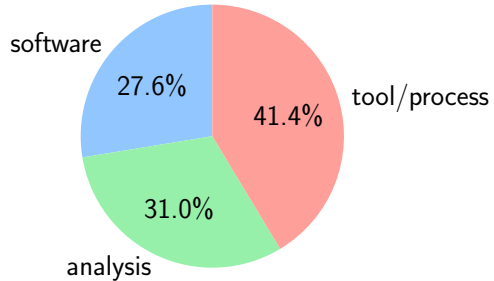
[Kitchenham and Charters 2007]

[Lummerzheim 2025b]

General Results



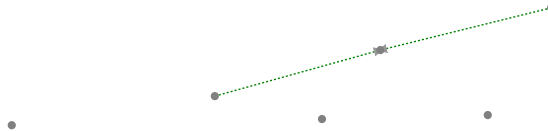
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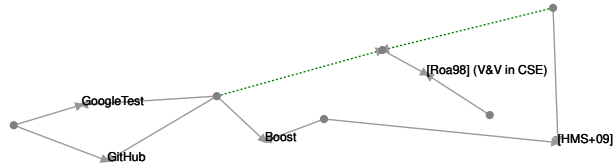
Connections



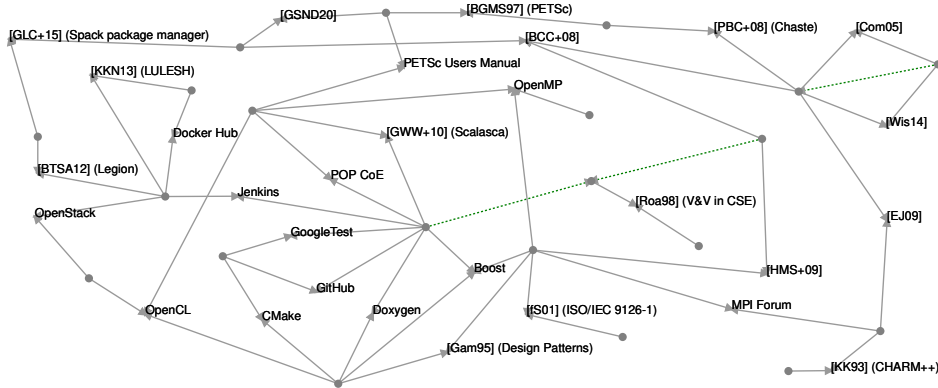
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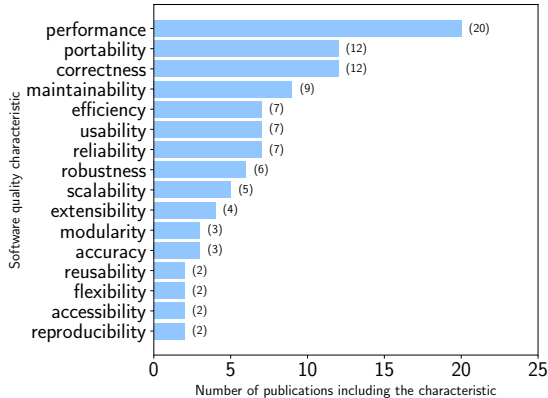


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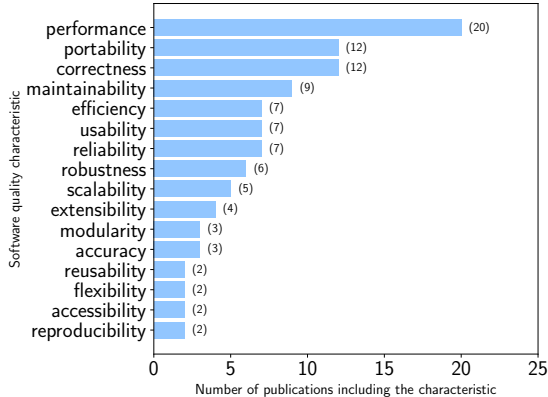
[Lummerzheim 2025a] interactive version: <https://slr-hpc-software-quality-794fea.pages.git.nrw/>

Quality Characteristics



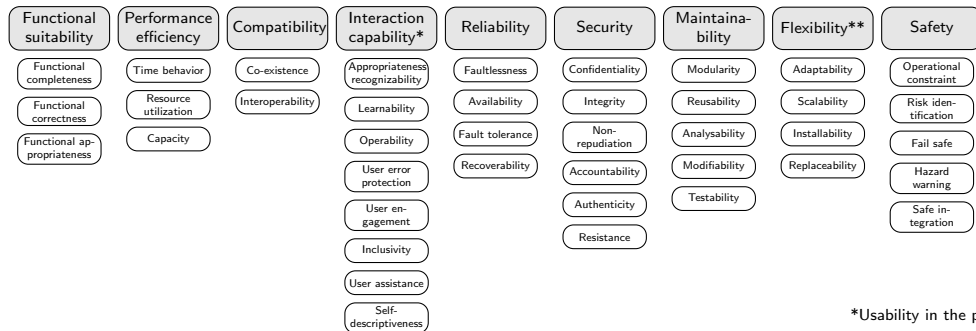
- Characteristics included once:
comprehensibility, traceability, simplicity,
transparency, functionality, sustainability,
quality consistency, stability, expandability,
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Quality Characteristics



- ▶ Trade-offs mainly between performance-related and other characteristics
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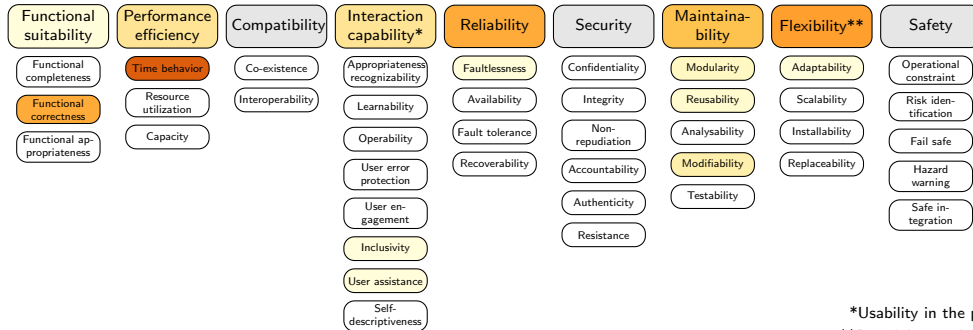
Comparison to SQuaRE (ISO/IEC 25010:2023)[International Organization for Standardization 2023]



*Usability in the previous version

**Portability in the previous version

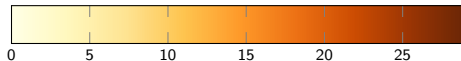
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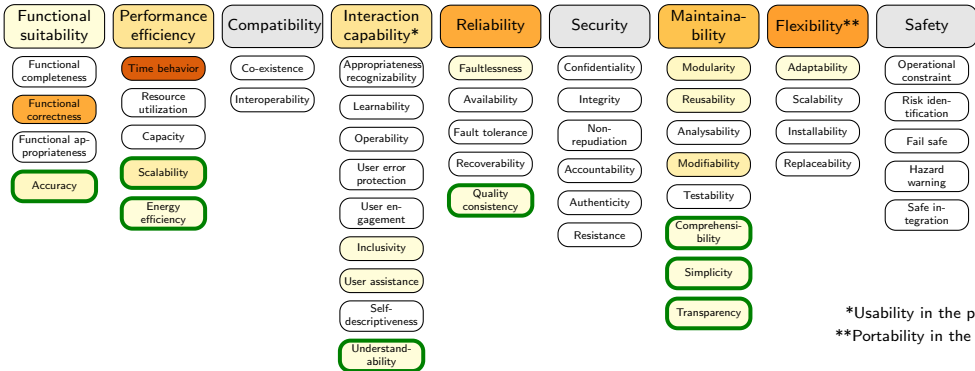
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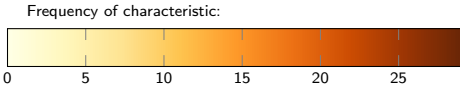
Frequency of characteristic:



Comparison to SQuaRE (ISO/IEC 25010:2023)[International Organization for Standardization 2023]

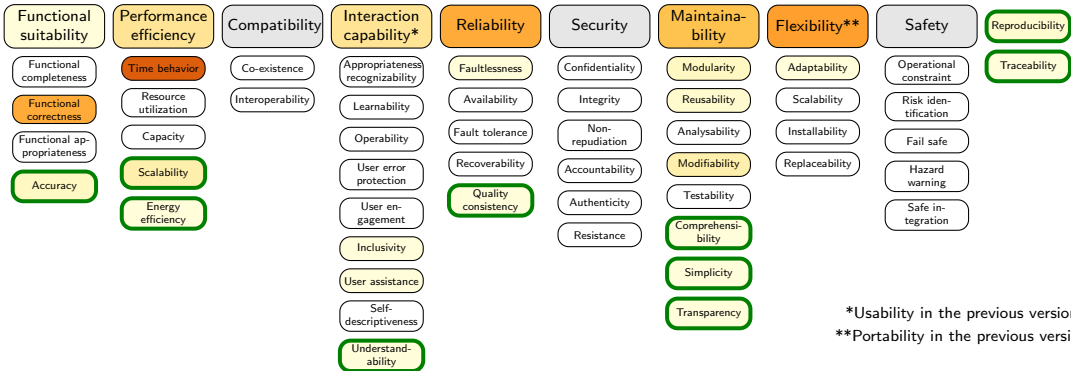


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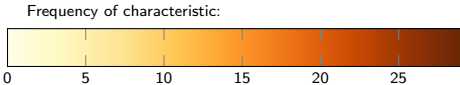


Newly added characteristic:

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Questions?

Contact

Camilla Lummerzheim 
lummerzheim@itc.rwth-aachen.de

Thank you for your attention.

References

-  Barker, Michelle et al. (Oct. 2022). "Introducing the FAIR Principles for research software". In: *Scientific Data* 9.1. DOI: 10.1038/s41597-022-01710-x.
-  International Organization for Standardization (2023). *Systems and software engineering — Systems and software Quality Requirements and Evaluation (SQuaRE) — Product quality model*. URL: <https://www.iso.org/standard/78176.html>.
-  Kitchenham, Barbara and Stuart M. Charters (2007). *Guidelines for performing Systematic Literature Reviews in Software Engineering*. Tech. rep. Evidence-Based Software Engineering (EBSE). URL: <https://www.researchgate.net/publication/302924724>.
-  Lummerzheim, Camilla (2025a). *Code for "Quality Characteristics for Software in HPC Environments: A Systematic Literature Review"*. DOI: 10.5281/ZENODO.14899735.
-  — (2025b). *Data for "Quality Characteristics for Software in HPC Environments: A Systematic Literature Review"*. en. DOI: 10.5281/ZENODO.14898873.