

# SOFTWARE ENERGY CONSUMPTION OF MOBILE DEVICES



Gabriele Kotsis, Andreas Hannes Schuler

## **Reflecting the Energy Demand of ICT**

- Digitalization and energy consumption. Does ICT reduce energy demand?
- Evolution of IT Energy Demand
- Power Consumption of Mobile Devices

## **Characterizing Software Energy Consumption in Mobile Application Development to Support Third-Party-Library Selection**

- A systematic review on mobile software energy profiling
- A generic approach to profiling software energy consumption at a fine-granularity
- API utilization profiles (uapi) as proxy for the energy characteristics of Third Party Library (TPL) dependencies

## **Reflecting the Energy Demand of ICT**

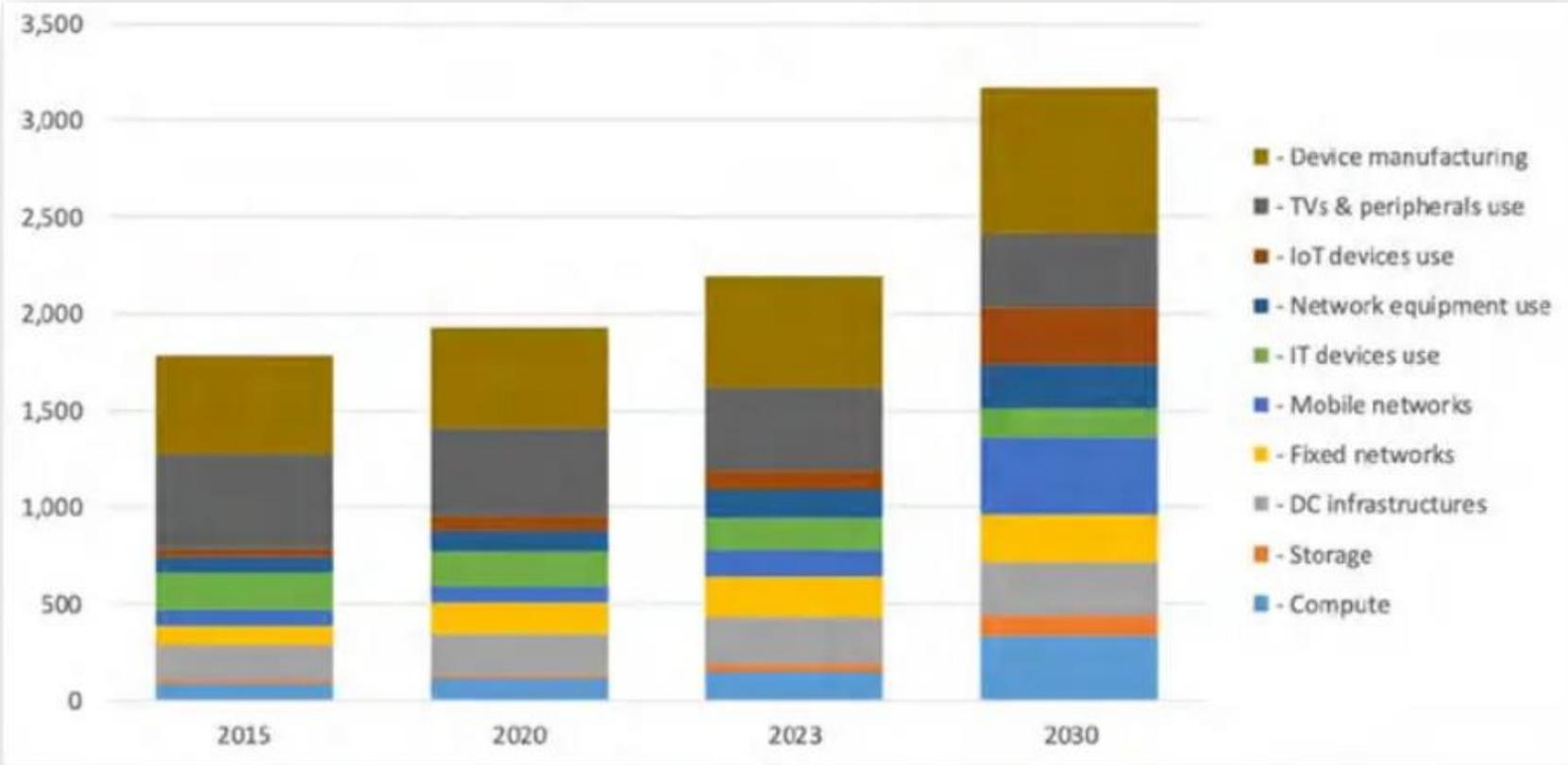
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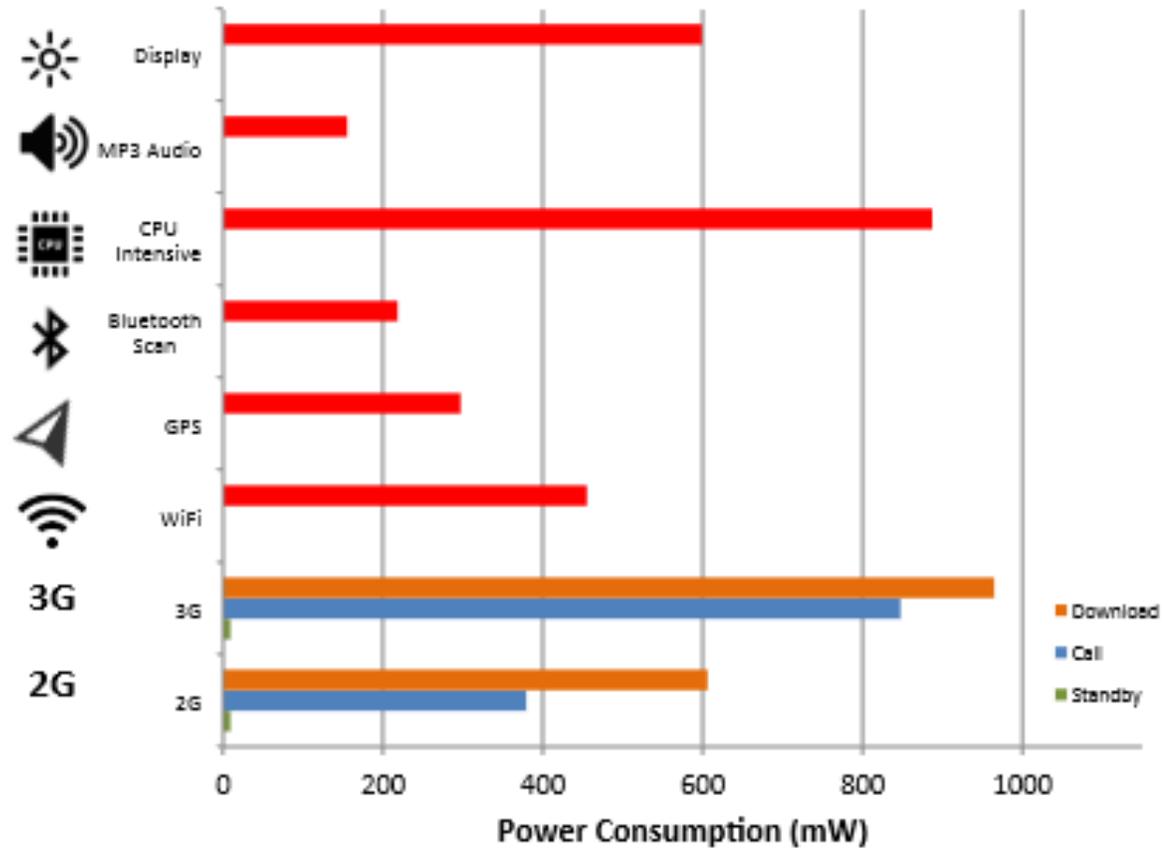
# Evolution of IT Energy Demand (TWh)



Schneider Electric estimates that IT sector electricity demand will grow by 50 percent by 2030, reaching 3,200TWh, equivalent to 5 percent Compound Annual Growth Rate (CAGR) over the next decade – evolution of IT energy demand in TWh

<https://www.i-scoop.eu/sustainability-sustainable-development/it-sector-electricity-demand/>

# Power Consumption of Mobile Devices based on Usage Scenarios



Ardito et.al 2015

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## Characterizing Software Energy Consumption in Mobile Application Development to Support Third-Party-Library Selection

- A systematic review on mobile software energy profiling [1]
- A generic approach to profiling software energy consumption at a fine-granularity [2,3]
- API utilization profiles ( $u_{api}$ ) as proxy for the energy characteristics of Third Party Library (TPL) dependencies [4,5]

- [1] A. Schuler, G. Kotsis, A Systematic Review on Techniques and Approaches to Estimate Mobile Software Energy Consumption, 2022, submitted to Sustainable Computing: Informatics Systems Journal, 2022, [currently being processed after minor revisions]
- [2] Examining the energy impact of sorting algorithms on android: an empirical study, A. Schuler, G. Kotsis, Proceedings of the 16th EAI International Conference on Mobile and Ubiquitous Systems, 2019.
- [3] Towards a framework for detecting energy drain in mobile applications: an architecture overview, A. Schuler, G. Kotsis, ISSTA '18: Companion Proceedings for the ISSTA/ECOOP 2018 Workshops, 2018
- [4] Mining API Interactions to Analyze Software Revisions for the Evolution of Energy Consumption, A. Schuler, G. Kotsis, MSR '21: Proceedings of the 18th International Conference on Mining Software Repositories, 2021
- [5] Characterizing Energy Consumption of Third-Party API Libraries using API Utilization Profiles – A. Schuler, G. Kotsis, Proceedings of the 14th ACM/IEEE International Symposium on Empirical Software Engineering, 2020.

# Systematic Literature Review

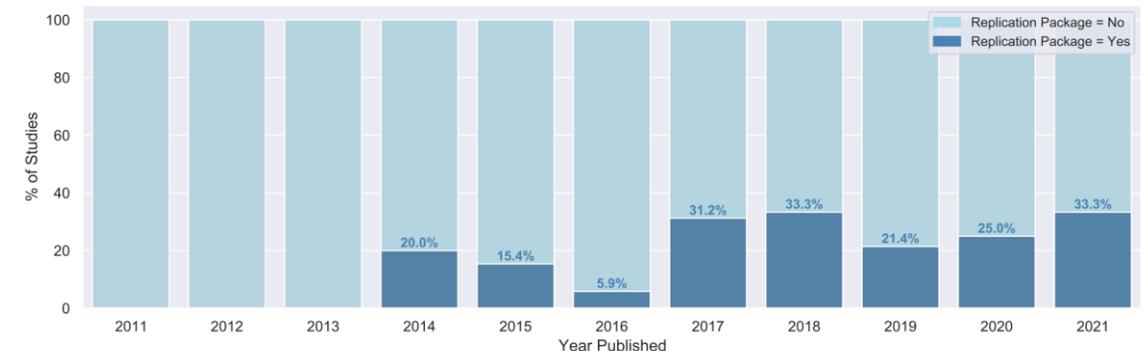
„What types of contributions are provided by the selected research?“

## ■ Key Insights

- Since **2014 increase** in availability of **replication packages**
- Only **5** of the tools are actively maintained and **publicly available**
- Potential for **future research** regarding energy efficiency **guidelines**, **patterns** and **metrics**



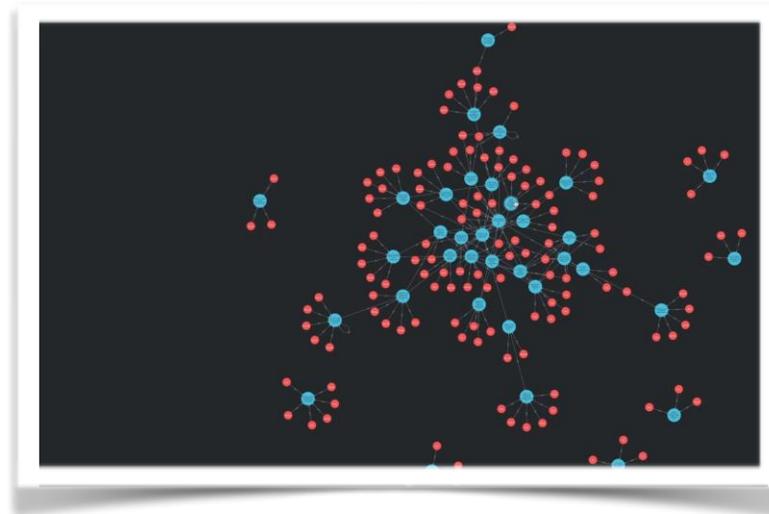
Systematic mapping of contribution types over power modelling approaches.



Availability of replication packages in relation to selected studies per year.

# Systematic Literature Review – Replication Package

- Search-and-Queryable graph database containing the studies covered by the review [1]



Explore the articles, authors and their relations in mobile software energy research.

[1] A. Schuler, G. Kotsis, A Systematic Review on Techniques and Approaches to Estimate Mobile Software Energy Consumption (*SUSCOM Dataset*), Submitted to the Sustainable Computing Journal, 2022.

Open Source Data <https://zenodo.org/record/7140240>

# Motivation

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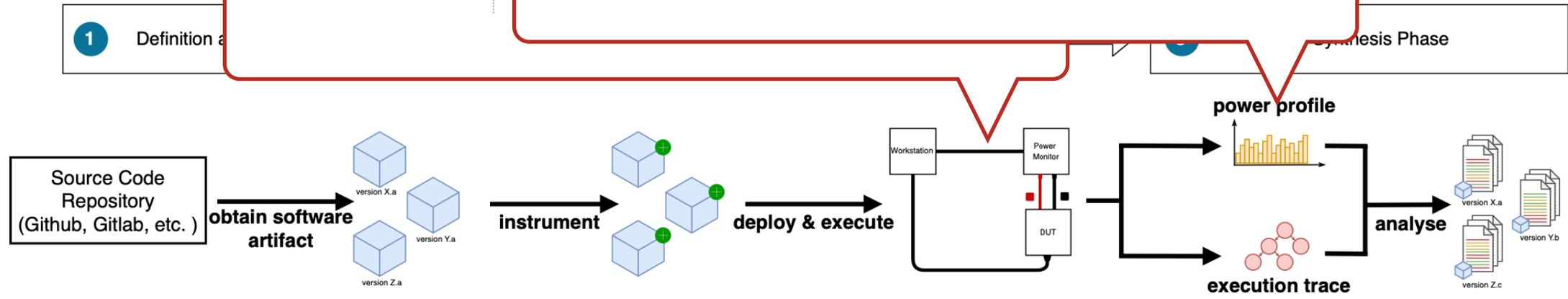
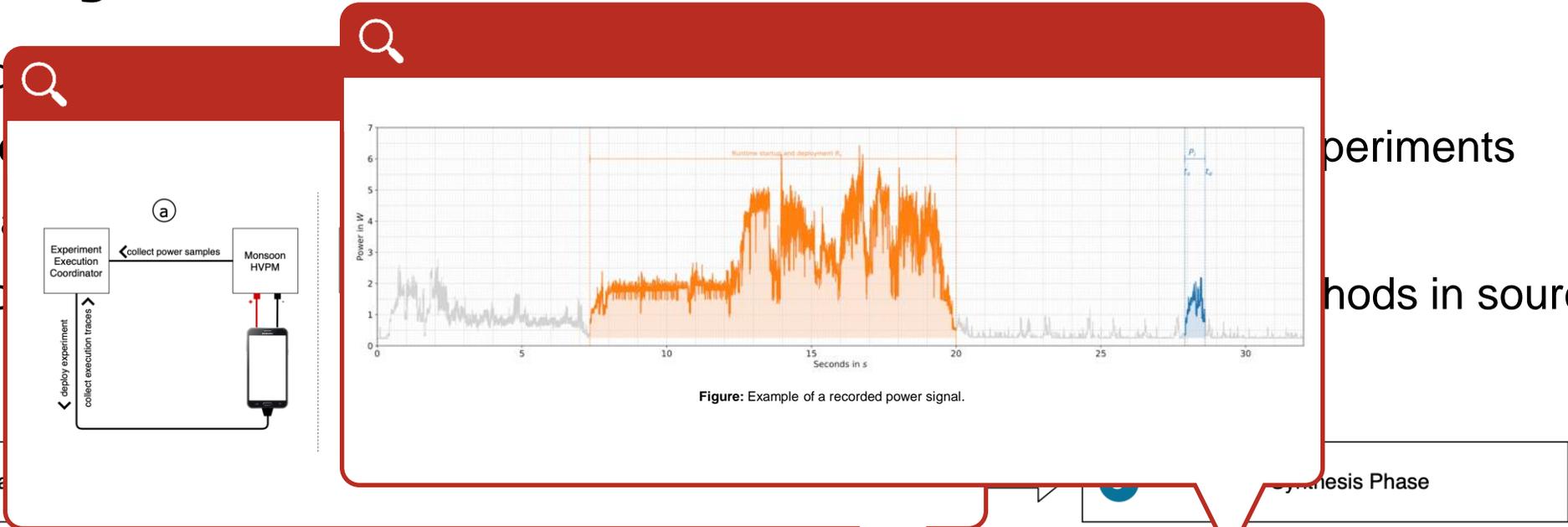
 60 Joule

```
public void testFileReader() throws Exception {  
    try (FileReader fileReader = new FileReader( FILE )) {  
        int data = fileReader.read();  
        StringBuilder builder = new StringBuilder((char) data);  
        while (data != -1) {  
            data = fileReader.read();  
            builder.append((char) data);  
        }  
    }  
}
```

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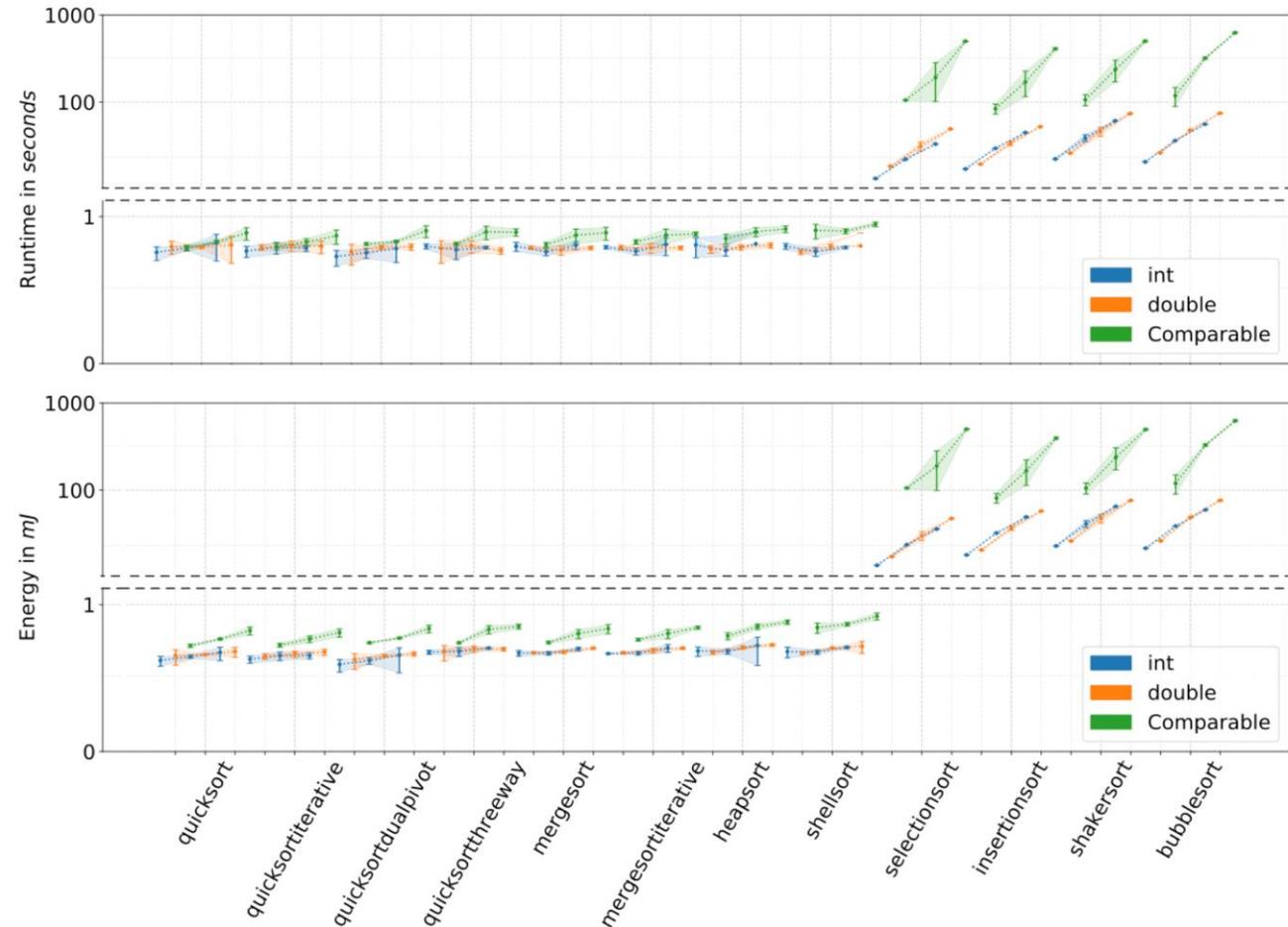
# Profiling software energy consumption at a fine-granularity

- A generic app
  - Series of steps
  - Comprises
  - Algorithm to (code)



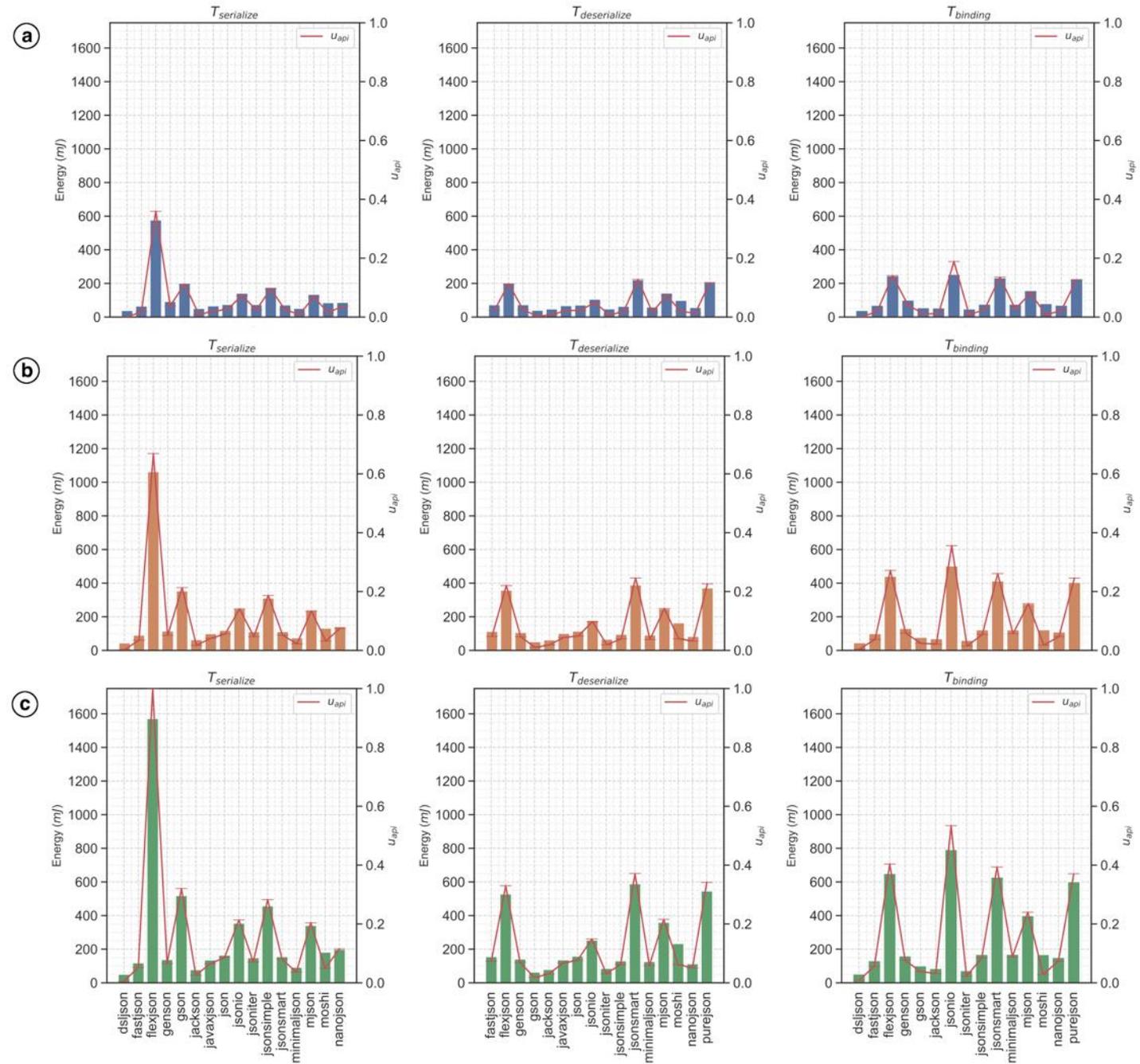
# Case Study: Sorting Algorithms

- Empirical study on the energy characteristics of sorting algorithms on Android [2]
  - Compared *12 sorting algorithms* for datatypes (int, double, Comparable) for problem sizes *50k*, *75k* and *100k*
  - Sampled each test 20 times, averaged results
  - Choice of *datatype* has *significant* impact on *energy characteristics*
    - Kruskal-Wallis,  $df = 2$ ,  $p < .001$ , Dunn's Post-Hoc Test



# U<sub>api</sub> profiles

- U<sub>api</sub> profile follows trend in energy consumption
- Accuracy of using U<sub>api</sub> as proxy
  - energy consumption - **94.8%**
  - average power - **56.9%**
- Selected candidates show non-uniform energy behavior
  - GSON worse energy performance in serializing scenario
  - Implementations should favor a TPL candidate performs equally well in all scenarios



# **u<sub>api</sub> profiles as proxy for the energy characteristics of Third Party Library (TPL) dependencies**



# Take Home Messages and Future Work

- Developing software under **sustainable design goals** plays crucial role in shaping our future

*Knowledge on „How to develop energy-efficient software solutions“ is limited*

- Tools and approaches required to support building awareness
- Facilitate access to software energy profiling for a broad audience  
(e.g. cs students, researchers and practitioners)
  - Provide tools and approaches seamlessly integrated in usual workflows
  - Increase the awareness how energy is dissipated in software



**JKU**

**JOHANNES KEPLER  
UNIVERSITY LINZ**