What if removing software features to make programs smaller doesn't save energy... but sometimes actually uses more?

On the Effect of Feature Reduction on Energy Consumption: An Exploratory Study

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Context

- Software powers everything in our digital society. But ICT also consume a significant amount of energy, raising environmental concerns
- Configurable systems let developers enable or disable features, but over time they become bloated and complex
- Traditionally, 'debloating' is meant to:
 - Shrink binaries
 - Reduce attack surfaces
 - Improve performance
- But our starting point was:
 - Does feature reduction = energy reduction?

Research gap

- Prior work has explored energy in configurable systems (e.g., feature interactions, static analysis, execution time)
- Feature reduction for e.g., reducing attack surface is studied
- But to our knowledge, no previous work has studied their combined effect on energy consumption

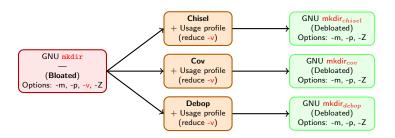
Two types of feature reduction

Built-in reduction: Developers intentionally create alternative implementations with fewer features



Two types of feature reduction

On-demand reduction: Developers (build tools, and) debloat software to remove unnecessary features



Research questions

I. For built-in reduction, we ask how three factors:

 $RQ_{1.1}$: binary size

 $RQ_{1.2}$: # configuration options

 $RQ_{1.3}$: execution time

impact 🖭 energy consumption

II. For on-demand, we asked the same with two factors:

 $RQ_{2.1}$: binary size

-: # configuration options

 $RQ_{2.2}$: execution time

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■ Then, we wondered about their % correlations

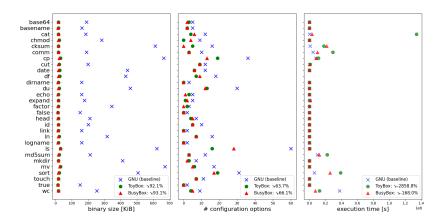
Methodology for built-in reduction

- Q 28/75 programs (e.g., mv, 1s, mkdir) compared their alternative implementations across GNU, ToyBox, and BusyBox
- **Q** For each program: 2 common valid configurations + input
 - Measured: binary size, # configuration options, execution time, and energy consumption
 - Energy consumption is measured using the Jouleit¹, which leverages Intel's RAPL counters
 - Each measurement was repeated 10 times (1,680, in total) on a controlled hardware and OS setup, following best practices to minimize noise

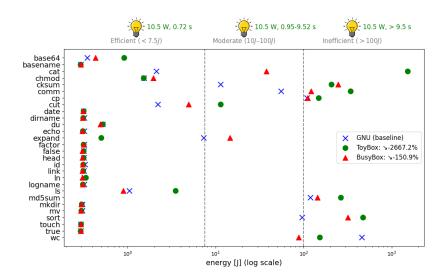
 $^{^{}f l}$ https://github.com/powerapi-ng/jouleit

Built-in: Binary size, options, and runtime reduction

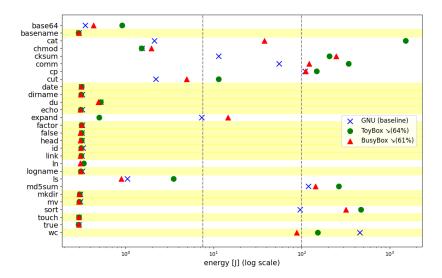
- Drastically smaller binaries: all, 92.1% and 93.1%
- Far fewer configuration options: all, 63.7% and 66.1%
- Execution time varied per program: (few outliers)



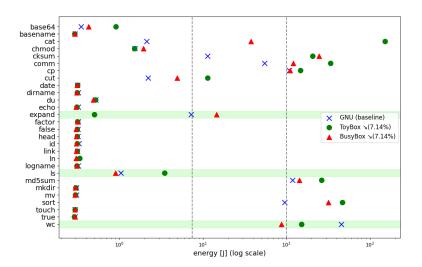
Built-in: Energy consumption per program



Built-in: Comparative analysis (lower consumption)

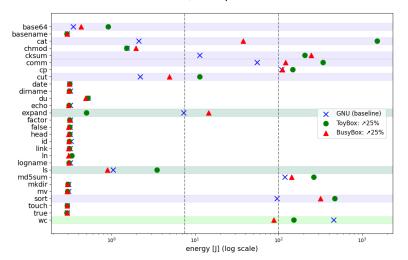


Built-in: Comparative analysis (lower and significant)

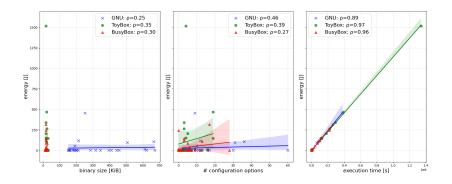


Built-in: Comparative analysis (higher and significant)

■ 36% of ToyBox and 39% of BusyBox programs use more energy than GNU versions. Whereas, with p>0.05 are:



Built-in: Energy correlates with execution time



Key insight: Energy consumption is much more strongly tied to execution time $(RQ_{1.3})$ than to binary size $(RQ_{1.1})$ or number of options $(RQ_{1.2})$.

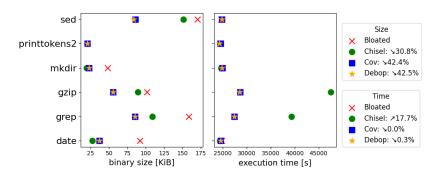
Methodology for on-demand reduction

- \odot 6 GNU programs debloated with Chisel, Debop, and Cov 2
- \gg Source level debloating of a program, regarding runtime features + 2 usage profiles \rightarrow controlled, on-demand reduction
 - The selected programs are the same as in the first experiment
 - Measured: binary size, execution time, and energy consumption
 - Energy consumption is measured using the **Jouleit**
 - Each measurement was repeated 10 times (480, in total), following the same methodology as in the first experiments

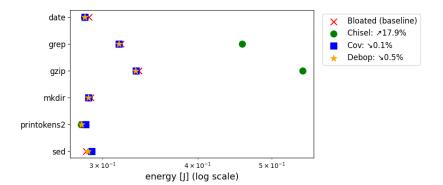
²Qi Xin, et.al. Studying and Understanding the Tradeoffs Between Generality and Reduction in Software Debloating. ASE'22. https://doi.org/10.1145/3551349.3556970 ← □ ▶ ← ⑤ ▶ ← 意 ▶

On-demand: Binary size and execution time reduction

- Smaller binaries: all, 30.8%, 42.4%, and 42.5%
- Execution time varied per program: 17.7% slower, 0%, 0.3% faster

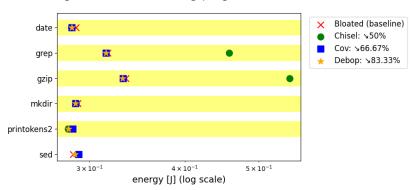


On-demand: Energy consumption per program

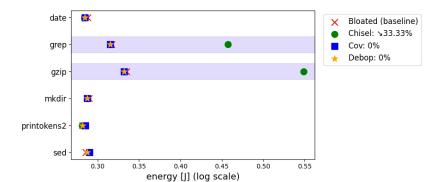


Comparative analysis (lower and significant)

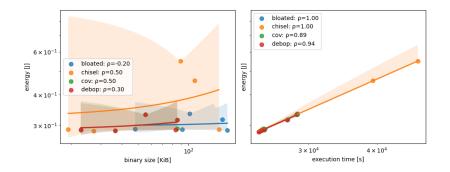
No significant cases among programs that consumed less



Comparative analysis (higher and significant)



On-demand: Energy correlates with execution time



Key insight: Energy consumption $(RQ_{2.2})$ is strongly tied to execution time, while reducing binary size through debloating $(RQ_{2.1})$ does not consistently lower energy use and can even increase it.

Unintended energy impacts of feature reduction

- The impact of feature reduction on energy consumption can be counterintuitive
- In-depth analysis: debloating removed optimizing code, leading to higher energy consumption despite fewer executed lines

■ Mono-objective debloating (e.g., reducing binary size or attack surface) can harm other properties, including energy consumption

ecv: Energy Consumption Visualizer

- Measures and visualizes software energy usage
- Progress bars with real-world device equivalents (e.g., LED bulb)
- Helps developers track energy over time and end-users compare alternatives
- ecv is open source and part of our replimkdirion package

```
======== ls | GNU ========
==> Config all == Max (μJ): 1609188.0 | Min (μJ): 549376
  Mean (x20) config (µJ): 1048413.0
0.197814 seconds of HDD use (5.3W)
0.099849 seconds of LED light bulb use (10.5W)
0.003276 seconds of GPU use (320W)
======== ls | TovBox ========
==> Config all == Max (μJ): 4840930.0 | Min (μJ): 229278
   Mean (x20) config (μJ): 3487467.0
 .658013 seconds of HDD use (5.3W)
0.33214 seconds of LED light bulb use (10.5W)
0.010898 seconds of GPU use (320W)
======== ls | BusyBox ========
==> Config all == Max (µJ): 1183041.0 | Min (µJ): 629576
  Mean (x20) config (uJ): 898063.0
```

Energy Consumption Insights from Feature Reduction

- First exploratory study on the impact of feature reduction on energy consumption
- We distinguished built-in vs. on-demand reduction
- Does removing features always save energy?
- Not necessarily, but smarter, energy-aware debloating can
- Replication package:
 - swh:1:rev:85286751845d59e9d032ffc0b91b92b2220954df