

Genetic Improvement of Energy Usage is only as Reliable as the Measurements are Accurate

Saemundur Oskar Haraldsson

University of Stirling

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John R. Woodward Co-author
Edmund K. Burke Supervisor



Computational
Heuristics
Operational Research
Decision-Support

<http://daase.cs.ucl.ac.uk/>

Overview

- 1 Motivation
- 2 Genetic Improvement
- 3 Energy in Computation
- 4 Summary

Motivation

“If you can not measure it, you can not improve it.”

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Software energy conservation

Energy optimisation with Genetic Improvement (GI)

Measuring energy with intent on improving

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- Environmental
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- Hardware is only as efficient as the software driving it.

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- Unintuitive for manual improvements [4].
- Improving software is Multi-objective.

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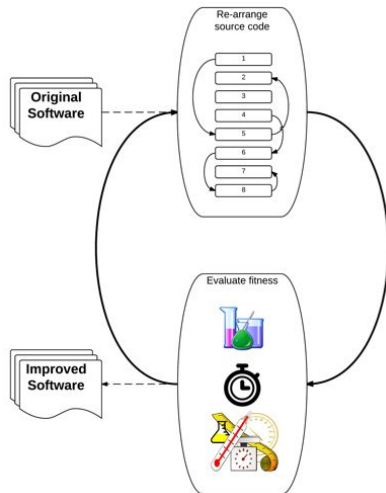
Measuring energy with intent on improving

- Energy measurements are complicated [2].
- Be wary of overly simple surrogates [3].

Genetic Improvement

Automatic software adjustment operating directly on the source code, treating it as the genetic material [1].

- Improving the software by readjusting the source code.
- Works well on multiple objectives [5].
- Improvements are based on fitness evaluations.



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¹ Image courtesy of foto76 at FreeDigitalPhotos.net

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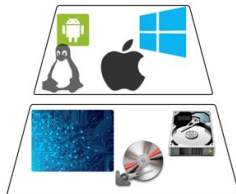
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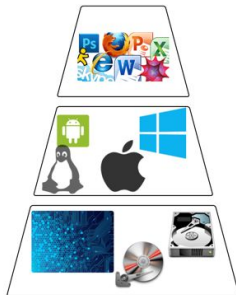
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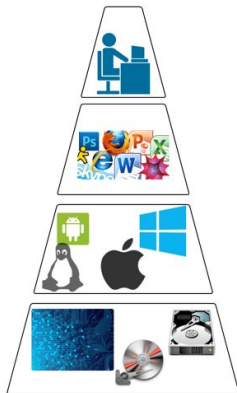
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- 4 End user specific energy conservations



Measuring energy in computation

Physical measurements

- The whole system.
- Each hardware component.

Alternatives.

- Simulation
- Timing, CPU counts, Memory access, etc.

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Things to consider

Genetic Improvement

Useful for “green” optimisation of software

Physical Measurements

Accurate if properly applied but **impractical**

Alternative Measurements

Have to be implemented on **case by case** basis.

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Conclusion

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If you can not measure it *accurately*, you can not improve it *reliably*

Thanks

Any questions?

References

- [1] W. B. Langdon and M. Harman. Optimising Existing Software with Genetic Programming. *IEEE Transactions on Evolutionary Computation*, PP(99):1–18, 2014.
- [2] Irene Manotas, Cagri Sahin, James Clause, Lori Pollock, and Kristina Winbladh. Investigating the impacts of web servers on web application energy usage. In *Green and Sustainable Software (GREENS), 2013 2nd International Workshop on*, pages 16–23. IEEE, 2013.
- [3] Cagri Sahin, Furkan Cayci, Irene Lizeth Manotas Gutiérrez, James Clause, Fouad Kiamilev, Lori Pollock, and Kristina Winbladh. Initial explorations on design pattern energy usage. In *2012 First International Workshop on Green and Sustainable Software (GREENS)*, pages 55–61. IEEE, 2012.
- [4] Cagri Sahin, Lori Pollock, and James Clause. How do code refactorings affect energy usage? In *Proceedings of the 8th ACM/IEEE International Symposium on Empirical Software Engineering and Measurement - ESEM '14*, pages 1–10. ACM, 2014.
- [5] White, R., Clark, J., Jacob, J. and Poulding, S. Searching for Resource-Efficient Programs : Low-Power Pseudorandom Number Generators. In Keijzer, M, editor, *GECCO'08, 10th annual conference on Genetic and evolutionary computation*, pages 1775-1782, Atlanta, GA, USA, 2008.