



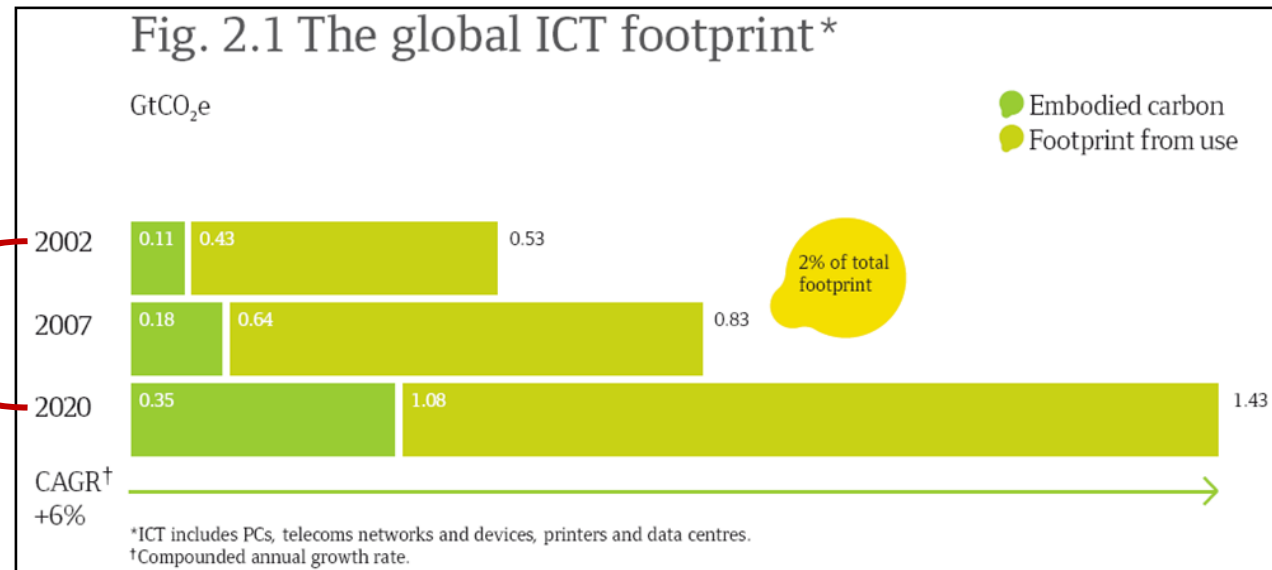
# Vision Paper: Towards Model-Based Energy Testing

Claas Wilke, Sebastian Götz, Jan Reimann, Uwe Aßmann



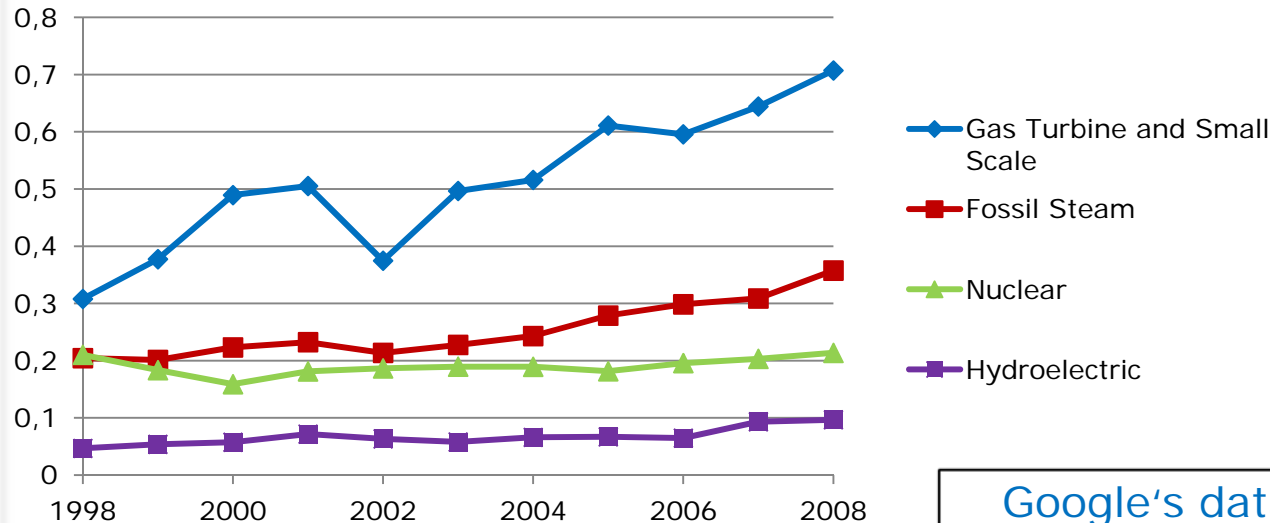
***Today, energy consumption  
is an important issue  
for software development!***

- **ICT's energy consumption is a global concern**
  - Gartner, Inc., 2007: 2% of world-wide CO<sub>2</sub> emissions [1]
  - SMART2020, 2008: 2% growing with 6% until 2020 [2]:



- [1] Gartner, Inc.: Gartner Estimates ICT Industry Accounts for 2 Percent of Global CO<sub>2</sub> Emissions. Gartner Press Release, April 2007.
- [2] The Climate Group: SMART 2020: Enabling the low carbon economy in the information age. Report on behalf of the Global eSustainability Initiative (GeSI), 2008.

Avg. Power Plant Expenses for Major US Electric Utilities (US-Cents/kWh)



[3]

**+86.9%**

**+97.9%**

**+3.2%**

**+79.4%**

Google's data centers in 2010 [4]:

**2 260 000 000 kWh**

[3] U.S. Energy Information Administration: Average Power Plant Operating Expenses for Major U.S. Investor-Owned Electric Utilities, April 2011.  
<http://www.eia.gov/electricity/data.cfm#sales>

[4] 2,26 Terrawattstunden – Google legt Energiebedarf offen. Article @ Golem.de, September 2011. <http://www.golem.de/1109/86335.html>

- **SW consumes energy indirectly**

- CPU utilization
- Read/write on HDD
- Network traffic
- ...

- **HW works (partly) energy-efficient**

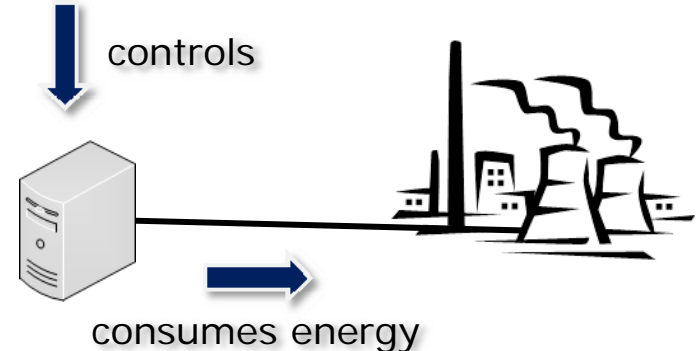
- Power saving modes  
busy, idle, sleep, ...

- **But: SW influences HW's state and energy consumption**

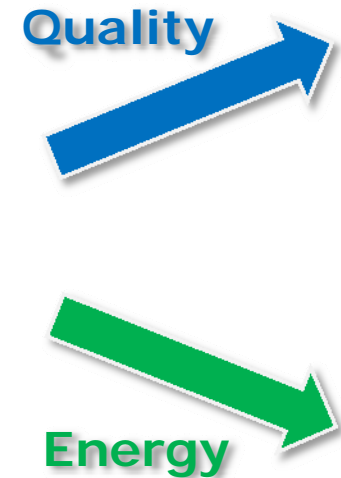
- Polling
- Continuous read/write

→ *Hardware optimization is not enough*

```
public class Main {  
    public static void  
    main(String args[]) {  
        for (int i = 0; i <  
            Math.round(Math.random()  
                * 5); i++) {  
            System.out.println(i);  
        }  
    }  
}
```



- **Energy consumption should be optimized**
    - Target: quality improvement, energy decrease
  - **Optimization includes testing**
    - E.g., regression testing to ensure decreasing energy consumption during optimization
- ***Need for systematic facilities***
1. Testing at the code level
  2. Static energy analysis
  3. Automated (model-based) testing



# ***Challenge #1***

## ***Energy Testing***

- **Testing of energy requirements at the code level**
- **Similar to functional unit and regression testing**
  - Initialize objects
  - Invoke operations
  - Compare results
  - ***Check energy consumption of test runs (workloads)***
- **Energy testing is**
  1. Workload execution
  2. Profiling
  3. Energy assertions



## Software under Test

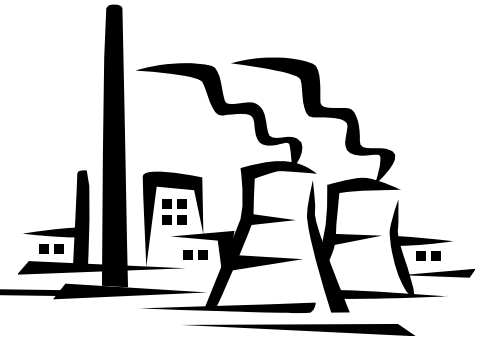
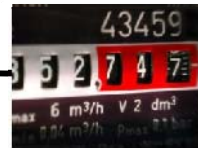
```
public class Main {
    public static void
    main(String args[]) {
        for (int i = 0; i <
            Math.round(Math.random()
                * 5); i++) {
            System.out.println(i);
        }
    }
}
```

## Energy Test Case

```
@Test
public void testMain01() {
    /* Execute and profile main()
    1000 times. */
    List<EProfile> result =
        profileNTimes("main",1000);
    assertConsumedMin(result,3);
    assertConsumedMax(result,29);
    assertConsumedAvg(result,14.5);
}
```



power meter



- **Workload execution**
  - Test runners already exist (e.g., JUnit)
- **Profiling energy consumption**
  - Granularity
    - Complete devices
    - Single hardware elements
  - Reusability
    - PCs, Laptops
    - Smart phones, Tablets
    - Robots and other embedded systems
  - Accuracy
    - Probe frequency
    - Noise of operating system
    - Noise of applications running in parallel
    - Probe effects

- **Assertions**
  - Energy unit tests
  - Energy regression tests
  - Device-independent design of assertions?

- **Energy testing framework for Java**
  - Workload execution: JUnit
  - Profiling: battery sensors and external power meters
  - Energy assertions for unit and regression testing

```
JouleProfiler profiler = new JouleProfiler();
profiler.startProfiling();

/* Run the workload here. */

EnergyProfile profile = profiler.endProfiling();

assertMaxJoules(profile, 30000);
assertMaxWatts(profile, 40000);
assertBestEver("test01", profile);
```

- **More information:** <http://www.jouleunit.org/>

## ***Challenge #2***

# ***Static Energy Consumption Analysis***

- **Predict an application's energy consumption**
  - Do not execute the application
  - But predict its energy behavior
  - *Early design decisions*
- **Estimation of bounds**
  - Lower, upper bounds (best/worst case)
  - Average consumption
- **Use of static analysis**
  1. Evaluate energy consumption for individual statements / building blocks
  2. Execute / interpret the application abstractly
  3. Evaluate the predictions w.r.t. Accuracy / Probability

```
public class Main {  
    public static void  
    main(String args[]) {  
        for (int i = 0; i <  
            Math.round(Math.random()  
                * 5); i++) {  
            System.out.println(i);  
        }  
    }  
}
```



Best: 3J  
Worst: 29J  
Avg.: 14.75J

- Static analysis of code → *Abstract interpretation* [5]

```
public class Main {
    public static void main(String args[]) {
        int i;
        {i = null}           {E >= 1J, E <= 1J}
        for (i = 0; i < Math.round(Math.random() * 5); i++) {
            {i >= 0, i <= 5}   {E >= 2J, E <= 26J}
            System.out.println(i);
        }
        {i >= 0, i <= 5}   {E >= 3J, E <= 29J}
    }
}
```

**Classical:**

**$i = [0, 5]$**

**Energy:**

**$E = [3J, 29J]$**

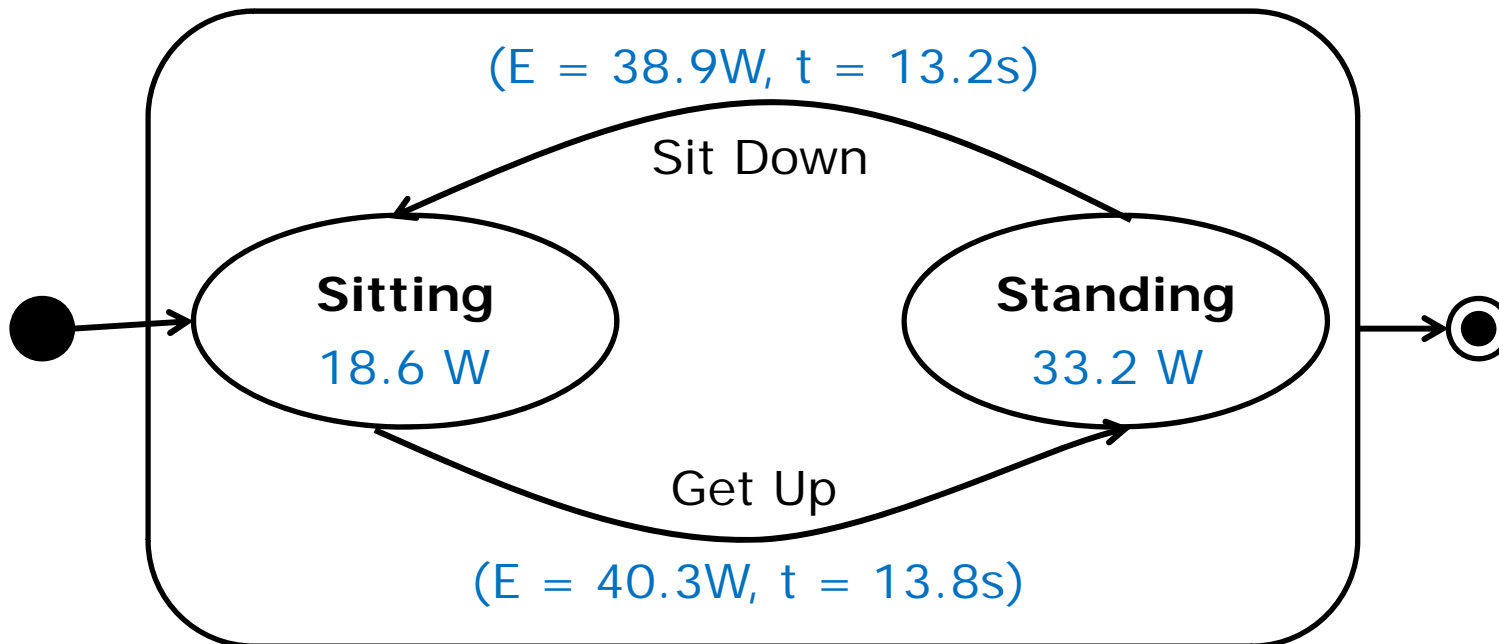
[5] Cousot, P., Cousot, R.: Abstract interpretation: a unified lattice model for static analysis of programs by construction or approximation of fixpoints. In: Proceedings of the 4th ACM SIGACT-SIGPLAN symposium on Principles of programming languages, ACM, 1977, p. 238-252.

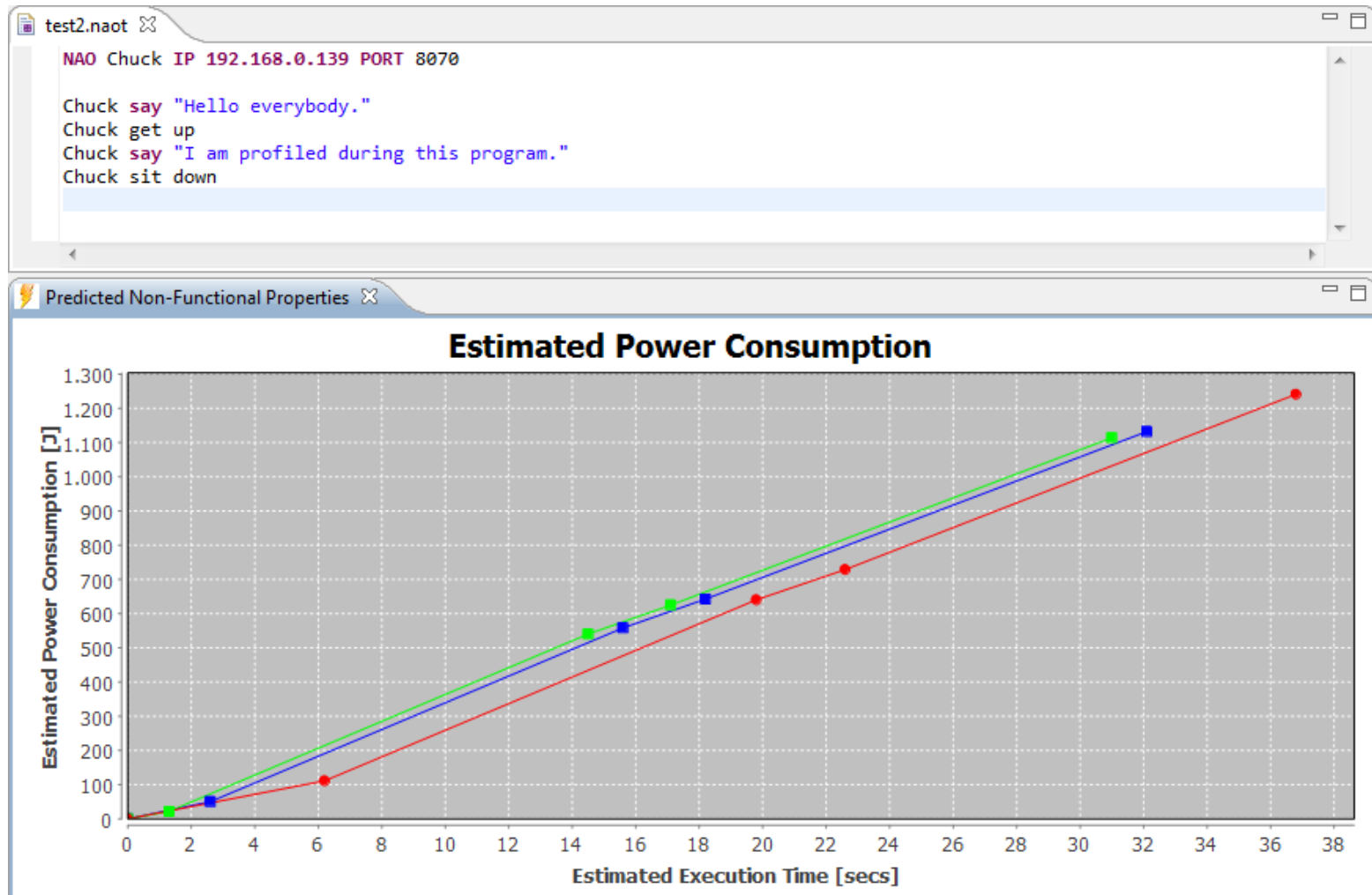
- **Possible for individual program instructions?**
  - Possible for Java byte code subsets [6]
    - Only for specific hardware
    - How to do this hardware independently / configurable?
  - What about non-deterministic behavior?
    - External inputs
    - Database access
    - External configuration  
e.g., `System.out.println()`;
- **Possible for larger instruction blocks or services?**
  - Energy consumption of a method call?
  - What about parameters and non deterministic behaviors?

[6] Lafond, S., Lilius, J.: An Energy Consumption Model for an Embedded Java Virtual Machine. In: Architecture of Computing Systems - ARCS 2006. Volume 3894 of LNCS. Springer Berlin / Heidelberg, 2006, p. 311-325.



- **Possible for other abstraction layers as well**
  - E.g.: a state chart describing a robot's behavior
  - Program to analyze is a workload of events and wait intervals:  
wait 5s; get up; wait 2s; sit down;





- **What is the right abstraction layer?**
  - Individual programming language instructions
  - Larger units: components
- **How to handle different types of statements / blocks [7]:**
  - Constant consumption
  - Parameter/context-dependent consumption
  - Unpredictable consumption
- **Can we build static energy optimizers?**
  - Reordering of instructions
  - Proposition of energy-critical blocks

[7] Seo, C., Malek, S., Medvidovic, N.: An Energy Consumption Framework for Distributed Java-Based Systems. In: Proceedings of the 22nd IEEE/ACM Intl. Conference on Automated Software Engineering, Atlanta, Georgia, USA. ACM, New York (2007).

## ***Challenge #3***

# ***Towards Model-Based Energy Testing***

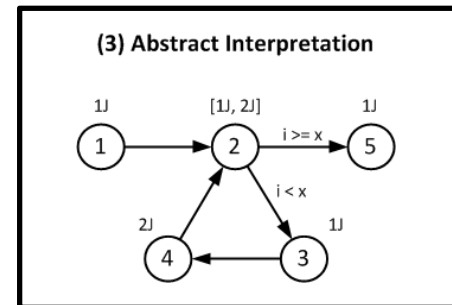
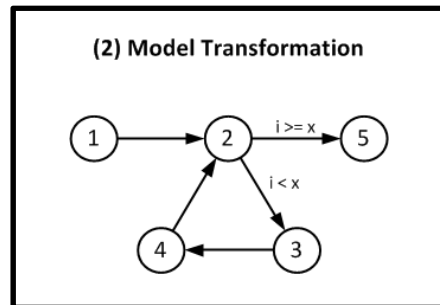
- **Model-Based Testing (MBT) [8]:**  
“The automatable derivation of concrete test cases from abstract formal models, and their execution.”
- **Model-Based Energy Testing (MBET):**  
Apply techniques from MBT to energy testing

[8] Utting, M., Pretschner, A., Legiard, B.: A Taxonomy of Model-Based Testing. Technical Report 04/2006, University of Waikato, Department of Computer Science, Hamilton, 2006.

- **Generating test cases from static analysis**
  - Static analysis predicts energy consumption for workloads
  - Predictions can be transformed into energy assertions:

(1) Modelling

```
public class Main {
    public static void
    main(String args[]) {
        for (int i = 0; i <
            Math.round(Math.random()
                * 5); i++) {
            System.out.println(i);
        }
    }
}
```



(4) Energy Consumption Prediction

$$E = 1J + [1J, 2J] * [1, 6]$$

$$+ (1J + 2J) * [0, 5] + 1J$$

$$E_{\min} = 1J + 1J * 1 + (1J + 2J) * 0 + 1J$$

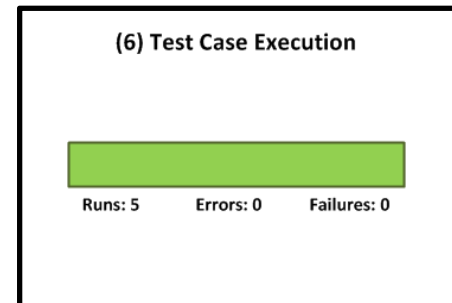
$$= 3J$$

$$E_{\max} = 1J + 2J * 6 + (1J + 2J) * 5 + 1J$$

$$= 29J$$

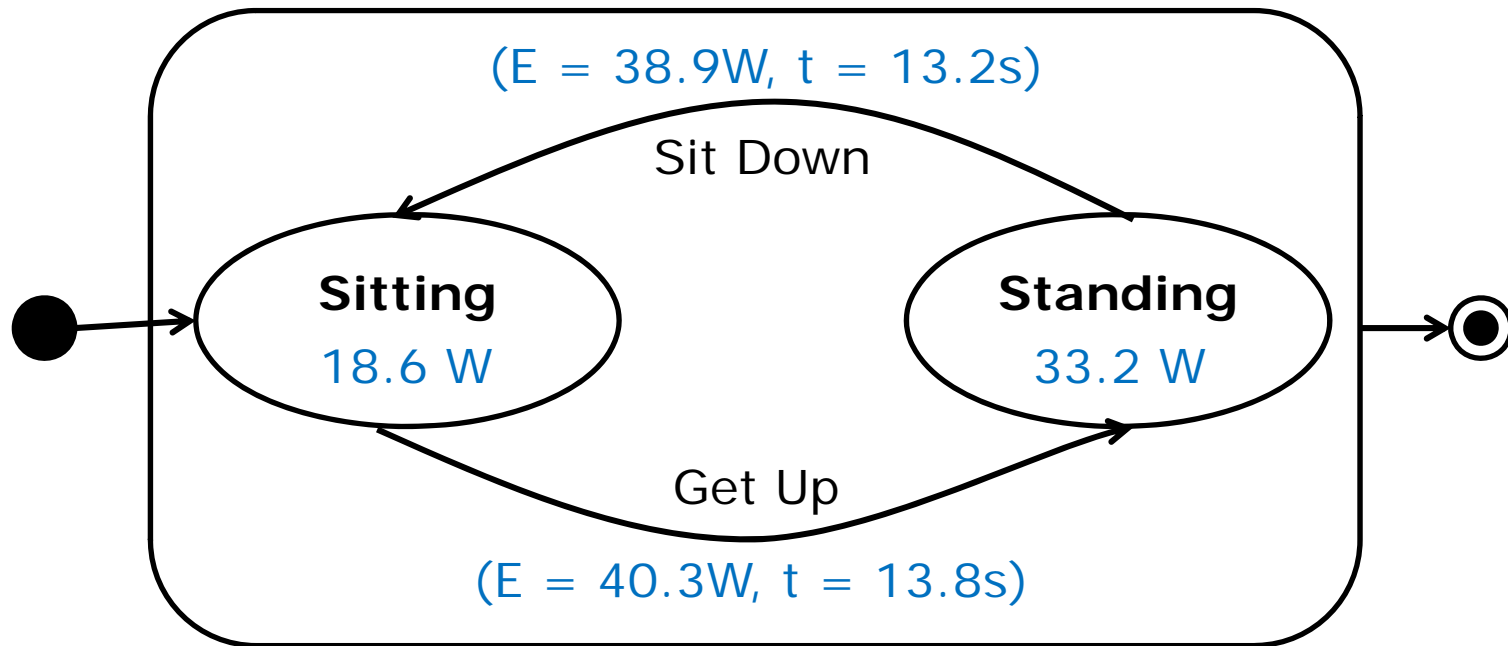
(5) Test Case Generation

```
@Test
testMain01() {
    /* Execute and profile main()
       1000 times. */
    profile(1000, main());
    assertConsumedMin(3);
    assertConsumedMax(29);
}
```



- **Test cases for static analysis or test case for SUT?**

- Derive sensible workloads from behavior models



- State coverage, transition coverage, path coverage, ...
- Does energy testing require new coverage criteria?

- **How does a MBET process looks like?**
  - Use of static analysis?
  - Workload generation?
  - Derive energy test cases from requirement models?
- **What is the optimal/right model for MBET?**
  - Behavior model
  - Energy consumption model
- **How different is MBET from classical MBT techniques?**



# *Summary*

- **Testing and optimization facilities for energy are necessary**
  - Ecological aspect
  - Economical aspect
- **Energy testing at the code level**
  - Workload execution
  - Profiling
  - Energy unit and regression testing
- **Static analysis for energy consumption**
  - Abstract interpretation of code
  - Abstract interpretation of models (state charts)
- **Model-Based approaches for Energy Testing**

## Contact



<http://st.inf.tu-dresden.de/>

<http://www.jouleunit.org/>

[claas.wilke@tu-dresden.de](mailto:claas.wilke@tu-dresden.de)

