

Exploring the Energy Consumption of Highly Parallel Software on Windows

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Abstract

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1 Introduction

Research questions:

- What is the best measuring instrument for Windows?
- How does parallelism affect the energy consumption
- How does P-cores and E-cores affect the execution of parallelism in a process, versus only P-Cores?

2 Related Work

2.1 Previous Work

This paper builds upon the knowledge gathered in our previous work "*A Comparison Study of Measuring Instruments*" [1] where different measuring instruments were compared to explore whether a viable software-based measuring instrument was available for Windows. It was found that Intel Power Gadget (IPG) and Libre Hardware Monitor (LHM) on Windows have similar correlation to hardware-based measuring instruments as Intel's Running Average Power

Limit (RAPL) has on Linux. This chapter builds upon the related work chapter of the previous work and as such will not be repeated, however, it will be expanded upon.

2.2 Parallel Software

Amdahl's law describes the maximum potential speedup that can be achieved through the parallelization of an algorithm based on the proportion of the algorithm that can be parallelized and the number of cores used.[2] In [3] Amdahl's law, was extended to also estimate the energy consumption. Then three different many-core designs were compared with different amounts of cores using the extended Amdahl's law. It showed that a CPU can lose its energy efficiency as the number of cores rises and it was argued that knowing how parallelizable a program is before execution allows for calculating the optimal number of active cores for maximizing performance and energy consumption. It was however based on an analytical model and not real-life measurements.[3]

The paper [4] presented a program that solves Laplace equations and compares the observed speed up for computing the Laplace equations with one, two, and four cores, with estimates given by Amdahl's law and Gustafson's law. Gustafson's law evaluates the speedup of a parallel program based on the size of the problem and the number of cores. Unlike Amdahl's law which assumes a fixed problem size and a fixed proportion of the program that can be parallelized, Gustafson's law takes into account that larger problems can be solved when more cores are available and that the parallelization of a program can scale with the problem size. Comparing the observed speed-up and the estimates it was adamant that Gustafson's law is more optimistic than Amdahl's law, however, both estimate smaller speed-ups than the observed speed-up on two and four cores. [4]

In [5], three different thread management constructs from Java are explored and analyzed regarding

energy consumption. It found that as the number of threads increased, the energy consumption would do the same. This was however only to a certain point, where from this point the energy consumption would start to decrease as the number of threads started to approach the number of cores in the CPU. However, the peak of this energy consumption was application dependent. It also found that in eight out of nine benchmarks, there was a decrease in execution time going from sequential execution on one thread to using multiple threads. However, it should be noted that four of their benchmarks are embarrassingly parallel whereas only one was embarrassingly serial. It should also be noted that decreased execution time does not necessarily mean a decreased energy consumption, because in six out of nine benchmarks the lowest energy consumption was found in the sequential version using one thread. Furthermore, it investigated the energy-performance trade-off using the Energy-Delay-Product (EDP), which was the product between energy consumption and execution time. Using EDP it generally found parallel execution to be more favorable however depending on the benchmark increasing the number of threads may not be aligned with an improvement of EDP.[5]

In [6], the energy consumption for sequential and parallel genetic algorithms was explored, where one research question aimed to explore the impact on energy consumption when using different numbers of cores. It found that a larger number of cores in the execution pool results in a lower running time and energy consumption, and conclude that parallelism can help reduce energy consumption. Parallelism's ability to reduce energy consumption was argued to be due to the large number of cores working to solve the problem simultaneously, where the combination of more cores, and more parallel operations per time unit will require less energy. When considering parallel software, it also found asynchronous implementations to use less energy, because there are no idle cores waiting for data in asynchronous implementations, while in synchronous implementations cores can be blocked during runtime, while waiting for responses from other cores.

In [7], the behavior of parallel applications and the relationship between execution time and energy consumption are explored. It tests four different language constructs which can be used to implement parallelism in C#. Furthermore, it uses varying amounts of threads and a sample of micro- and macro-benchmarks. It found that workload size has a large influence on running time and energy efficiency and that a certain limit must be reached before improvements can be observed when changing a sequential program into a parallel one. Additionally, it was found that execution time and energy consumption of parallel benchmarks do not always correlate. Com-

paring micro- and macro-benchmarks the findings remain consistent, although the impact becomes low for the macrobenchmarks due to an overall larger energy consumption. Furthermore, it has included some recommendations, which should be considered:[7]

- Shield cores: Avoid unintended threads running on the cores used in the benchmarking
- PowerUp: Can be used to ensure that benchmark is not optimized away during compilation
- Static clock: Make the clock rate of the CPU as static as possible
- Interrupt request: Avoid interrupt requests being sent to cores used in the benchmarking
- Turn off CPU turbo boost
- Turn off hyperthreading

2.3 Compilers

In [8] the language C++ and different compilers are explored and compared to find the impact of using different coding styles and compilers, where the goal is to find a balance between performance and energy efficiency. The different coding styles introduced explore the impact of splitting CPU and IO operations and interrupting the CPU-intensive instructions with sleep statements. The C++ compilers used in [8] include MinGW GCC, Cygwin GCC, Borland C++, and Visual C++, and the energy measurements are performed using Windows Performance Analyses (WPA). All compilers are used with default settings, and no optimizations were chosen. This decision was made based on works like [9], where it was found how mainstream compilers will apply multiple optimizations to the final code, where these optimizations in the worst case will result in worse performance and increased energy consumption. The issue of optimizations being very machine dependent was also shown in [10], where analysis and optimizations were done on a Texas Instruments C6200 DSP CPU. In [10] it was found that a large portion of the energy is used by fetching instructions which was addressed by introducing a fetch packet mechanism, and also find loop-unrolling to reduce energy consumption. While these optimizations decrease the energy consumption for the Texas Instruments C6200 DSP CPU, they note that for other CPUs varying results are expected. A similar conclusion is also found in [8], where they find that when choosing a compiler and coding style the energy reduction depends on the nature of the target machine and application. Based on the test case used, this being an election sort algorithm, they find the best performance with the Borland compiler, and the lowest energy with the Visual C++ compiler. When

considering the coding styles, they find that both separating IO and CPU operations and interrupting the CPU-intensive instructions with sleep statements also decrease the energy consumption.

3 Background

3.1 CPU States

This section provides an overview of CPU-states, which are a crucial aspect of energy management in computer systems. The information presented in this section draws from Intel [11] and HardwareSecrets [12]. The concept of CPU-states is concerned with how a system manages its energy consumption during different operational conditions.

The C-states are a crucial aspect of CPU-states, as they dictate the extent to which a system shuts down various components of the CPU to conserve energy. The C0 state represents the normal operation of a computer under load. As the system moves from C0 to C10 [1], progressively more components of the CPU are shut down until, in C10, the CPU is almost entirely inactive. It is important to note that the number of C-states supported may vary depending on the CPU and motherboard in use, in [1] the workstation used supported from C0 to C10 states.

In this study the C-states can have a large impact on the energy consumption of the test cases, especially the idle case as was found in [1].

3.2 CPU Affinity

Affinity is a feature in operating systems(OSs) that enables processes to be bound to specific cores in a multi-core processor. In OSs, jobs and threads are constantly rescheduled for optimal system performance, which means that the same process can be assigned to different cores of the CPU. Processor affinity allows applications to bind or unbind a process to a specific set of cores or range of cores/CPU(s). When a process is pinned to a core, the OS ensures it only executes on the assigned core(s) or CPU(s) each time it is scheduled.[13]

```
1 void ExecuteWithAffinity(string path)
2 {
3     var process = new Process();
4     process.StartInfo.FileName = path
5     process.Start();
6
7     // Set affinity for the process
8     process.ProcessorAffinity =
9         new IntPtr(0b0000_0011)
10 }
11
```

Listing 1: An example of how to set affinity for a process in C#

Processor affinity is particularly useful for scaling performance on multi-core processor architectures that share the same global memory and have local caches referred to as the Uniform memory access architecture. Processor affinity is also useful for our study, as this allows the framework to assign a single or a set of cores and threads to a process.[13]

When setting the affinity for a process in C#, it is done through a bitmask, where each bit represents a CPU core. An example of how it is done in C# can be seen in Listing 1, where the process is allowed to execute on core #0 and #1.

3.3 Scheduling Priority

Scheduling threads on Windows, is done based on each thread's scheduling priority level and the priority class of the process. For the priority the value can be either IDLE, BELOW NORMAL, NORMAL, ABOVE NORMAL, HIGH or REALTIME, where the default is NORMAL. It is noted that HIGH priority should be used with care, as other threads in the system will not get any processor time while that process is running. If a process needs HIGH priority, it is recommended to raise the priority class temporarily. The REALTIME priority class should only be used for applications that "talk" to hardware directly, as this class will interrupt threads managing mouse input, keyboard inputs, etc.[14]

For the priority level, the levels can be either IDLE, LOWEST, BELOW NORMAL, NORMAL, ABOVE NORMAL, HIGHEST and TIME CRITICAL, where the default is NORMAL. A typical strategy is to increase the level of the input threads for applications to ensure they are responsive, and to decrease the level for background processes, meaning they can be interrupted as needed.[14]

The scheduling priority is assigned to each thread as a value from zero to 31, where this value is called the base priority. The base priority is decided using both the thread priority level and the priority class, where a table showing the scheduling priority given these two parameters can be found in [14]. When assigning a base priority where both the priority class and thread priority are the default values, e.i. NORMAL, the base priority is 8.[14]

The idea of having different priorities is to treat threads with the same priority equally, by assigning time slices to each thread in a round-robin fashion, starting with the highest priority. In the case of none of the highest priority threads being ready to run, the lower priority threads will be assigned time slices. The lower-priority threads will then execute until a higher-priority thread is available, in which case the system will assign a full time slice to the thread, and stop executing the lower-priority threads, without time to

finish using its time slice.[14]

```
1 void ExecuteWithPriority(string path)
2 {
3     var process = new Process();
4     process.StartInfo.FileName = path
5     process.Start();
6
7     // Set priority class for process
8     process.PriorityClass =
9         ProcessPriorityClass.High;
10
11     // Set priority level for threads
12     foreach (var t in process.Threads)
13     {
14         thread.PriorityLevel =
15             ThreadPriorityLevel.Highest;
16     }
17 }
```

Listing 2: An example of how to set priorities for a process in C#

Note when setting priority class and priority level for a process through C#, the priority class is supported for both Windows and Linux, while the priority level is only supported for Windows. An example of how both the priority class and priority level can be set for a process and its threads can be seen in Listing 2.

3.4 OpenMP

OpenMP (Open Multi-Processing) is a parallel programming API consisting of a set of compiler directives and runtime library routines, with support for multiple platforms like Linux, macOS, and Windows as well as multiple compilers like GCC, LLVM/Clan, and Intel’s OpenApi. OpenMP allows programmers to write parallel code for multi-core CPUs and GPUs.[15]

The directives provide a way to specify parallelism among multiple threads of execution within a single program, while the library provides mechanisms for managing threads and data synchronization. When using OpenMP programmers can write parallel codes and take advantage of multiple processors without having to deal with low-level details.[15]

When executing using OpenMP, the parallel mode used is called the Fork-Join Execution Model. This model works by first executing the program with a single thread, called the master thread. This thread is executed serially until parallel regions are encountered, in which case a thread group is created, consisting of the master thread, and additional worker threads. This process is called a fork. After splitting up, each thread will execute until an implicit barrier at the end of the parallel region. When all threads have reached this barrier, only the master thread continues.[15]

```
1 #pragma omp directive-name [
2     clause[ [,] clause]...
3 ]
```

Listing 3: The basic format of OpenMP directive in C/C++

When using OpenMP, the parallel regions are identified using a series of directives and clauses, where the basic format can be seen in Listing 3. By default, the parallel regions are executed using the number of present threads in the system, but this can also be specified using `num_threads(x)`, where `x` represents the number of threads.[15]

4 Cpu cores

Traditional CPU architecture used for workstations and servers, such as x86, typically have uniform cores throughout the processor. However this began to change when Intel released a hybrid architecture that included two distinct types of cpu cores, performance cores (P-cores) and efficiency cores (E-cores).

As their names suggest, these are optimized for different tasks. P-cores function as standard cpu cores, which focus on maximizing performance. In contrast, the E-cores are designed to maximize performance per watt. These cores are intended to handle smaller non-time critical jobs, such as background services[16].

This hybrid architecture offers greater flexibility based on the need for the user, as the P-core can be used for demanding workload, while the E-cores is better for smaller repetitive tasks.

5 Method

5.1 Measuring Instruments

This section presents the different measuring instruments utilized in our work. The measuring instruments utilized in our previous work will only be briefly introduced, however more detail can be found in [1]. In this paper, four software-based measuring instruments and one hardware-based measuring instrument is used, where the hardware-based measuring instrument represents the ground truth.

Running Average Power Limit Intel’s RAPL is a commonly used software-based measuring instrument seen in the literature.[1] It uses model-specific registers (MSRs) and Hardware performance counters to calculate how much energy the processor uses. The MSRs RAPL uses include `MSR_PKG_ENERGY_STATUS`, `MSR_DRAM_ENERGY_STATUS`, `MSR_PP0_ENERGY_STATUS` and `MSR_PP1_ENERGY_STATUS`. Which corresponds to the power domains, PKG, DRAM, PP0, and PP1 which are explained in [1]. RAPL has previously only been directly accessible on Linux and Mac. In [1] we found that RAPL had a high correlation of 0.81 with our ground truth on Linux.[1]

Intel Power Gadget IPG is a software tool created by Intel, which can estimate the power of Intel processors. It contains a command line version called Powerlog which allows accessing the energy consumption using callable APIs. It uses the same hardware counters and MSRs as RAPL[17], therefore it is expected to observe similar measurements to that of RAPL. Which is also shown in [1] where we found that IPG had a high correlation of 0.78 with our ground truth on Windows. We also found that IPG had a high correlation of 0.83 with RAPL, although the measurements is on different operating systems.[1]

Libre Hardware Monitor LHM[18] is a fork of Open Hardware Monitor, where the difference is that LHM does not have a UI. Both projects are open source. LHM can use the same hardware counters and MSRs as RAPL and IPG and as such can measure the power domains PKG, DRAM, PP0, and PP1. Since it uses the methods to read energy consumption, a similar measurement is expected between LHM and IPG. We found that LHM correlated 0.76 with our ground truth on Windows. LHM was also found to have a high correlation of 0.85 with IPG.[1]

AC Current Clamp Serving as our ground truth measurement is our hardware-based measuring setup which is comprised of an MN60 AC clamp that is connected to the phase of the wire that goes into the PSU. It is also connected to an Analog Discovery 2 which is used as an oscilloscope which in turn is then connected to a Raspberry Pi 4. This setup allows us to continuously measure and log our data. For more detail see [1].

Scaphandre One measuring instrument not used in our previous work is Scaphandre[19]. Scaphandre is described as a monitoring agent which can measure energy consumption and is made for Linux where it can use Powercap RAPL which is a Linux kernel subsystem where data can be read from RAPL. It also has the functionality of measuring the energy consumption of some virtual machines, specifically Qemu and KVM hypervisors. A driver also exists which allows for installing RAPL on Windows.[20] Doing so allows using Scaphandre on a Windows computer where the sensor is RAPL which is utilizing the MSRs to update its counters. The Windows version of Scaphandre has some limitations but is able to report the energy consumption of the power domain PKG, using the MSR `MSR_PKG_ENERGY_STATUS`. Furthermore, it can also give an estimation of the energy consumption for individual processes. It does so by storing CPU usage statistics alongside the values of the energy counters. Then it is able to calculate the ratio of the CPU time for each Process ID (PID). With the calculated ratio a new calculation is made to get the subset of the energy

consumption which is estimated to belong to a specific PID. A Linux exclusive feature is that the monitoring system Prometheus can be used with Scaphandre to get the energy consumption of an application which consist of several PIDs.

5.2 Energy Consumption Analysis

Dynamic Energy Consumption In [1] dynamic energy consumption (dec) was utilized to enable comparison between the software based measuring instruments and the hardware based measuring instruments. dec is also used in this work. A brief explanation of dec based on [1] is given: The equation for dec is shown in Equation (1).

$$E_D = E_T - (P_S * T_E) \quad (1)$$

Where E_D is the dynamic energy consumption, E_T is the total energy consumption of the system, P_S is the energy consumption when the system is idle and T_E is the duration of the program execution.[1] With this equation the energy consumption of the test case is isolated. Using dec requires also measuring the energy consumption on an idle case.

6 Experiments

7 Results

8 Discussion

9 Conclusion

Acknowledgements

10 Future Works

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A The Framework

B The Database

In [1], a MySQL database was used to store the measurements made by the different measuring instruments. In this work, a similar database will be used, with some modifications made because the focus of this work is different to [1]. In the middle, the `MeasurementCollection` table defines under what circumstances the measurements were made under. This includes what measuring instrument was used, what test case was running, what DUT the measurements were made on and whether or not there was a burn-in period ect. Compared to [1], a few extra columns has been added to `TestCase`, as more focus is on the test cases used in this work, compared to [1]. This includes metadata like compiler, optimizations, and parameters used.

In the `MeasurementCollection` table, more options has been added to make each row unique. This includes a `Name` and `CollectionNumber`, where the number represents what experiment the measurement is from, and the name is the name of the experiment. A column found in both `MeasurementCollection`, `Measurement` and `Sample` is `AdditionalMetadata`. This column can be used to set values unique for specific rows, where an example could be how some metrics are unique for only one measuring instrument.

The `Measurement` contains values for the energy consumption during the entire execution time of one test case, while the `Sample` represents samples taken during the execution of the test case. This means for one row in the `MeasurementCollection` table, there can exists one to many rows in `Measurement`. For each row in `Measurement`, there will be many rows in `Sample`, where the samples will be a fine grained representation of the measurement.

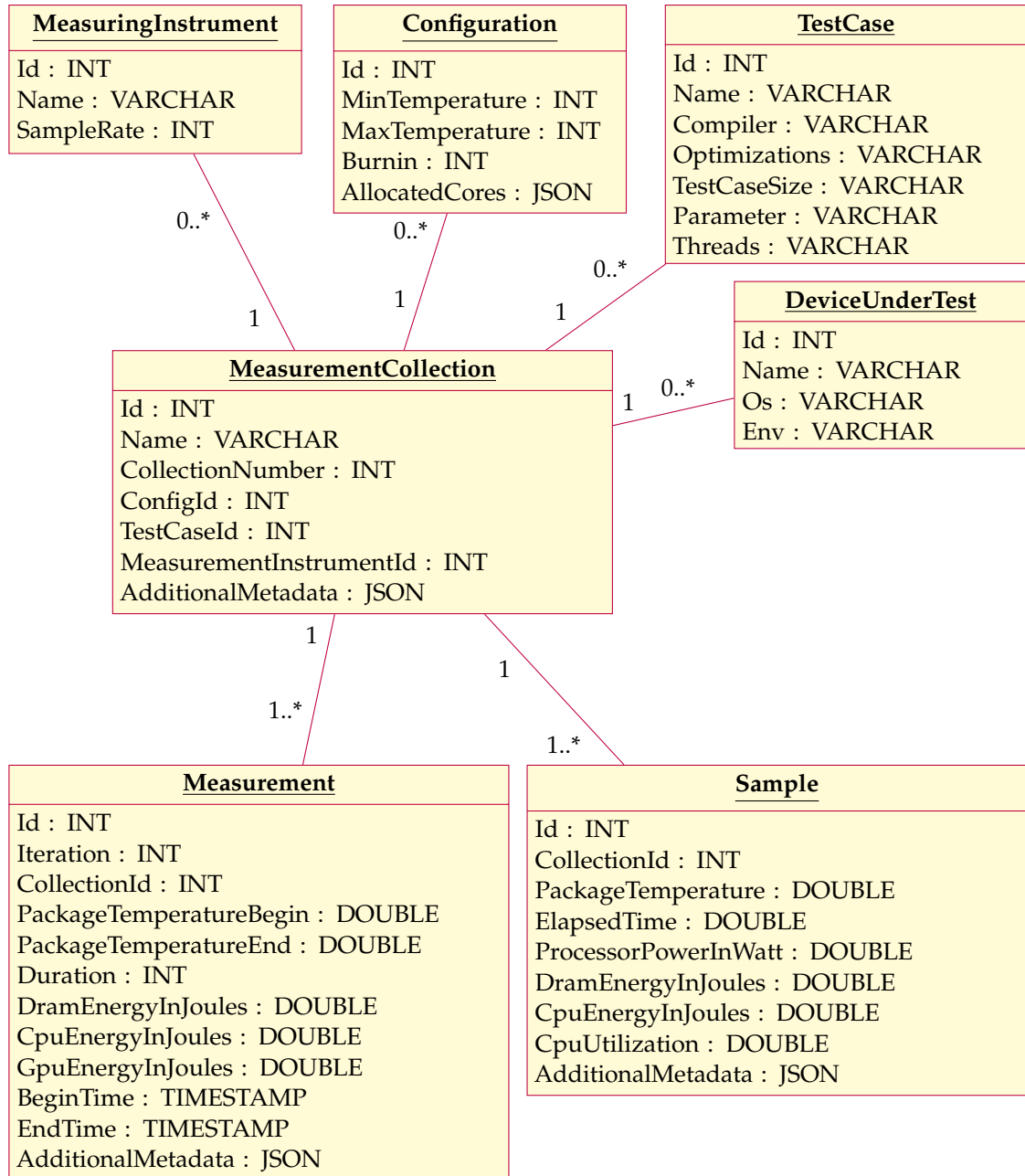


Figure 1: An UML diagram representing the tables in the SQL database