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Energy Efficiency in High Throughput Computing

Tools, techniques and experiments

MOTIVATION: HTC, CERN & energy consumption: Higgs boson and the future

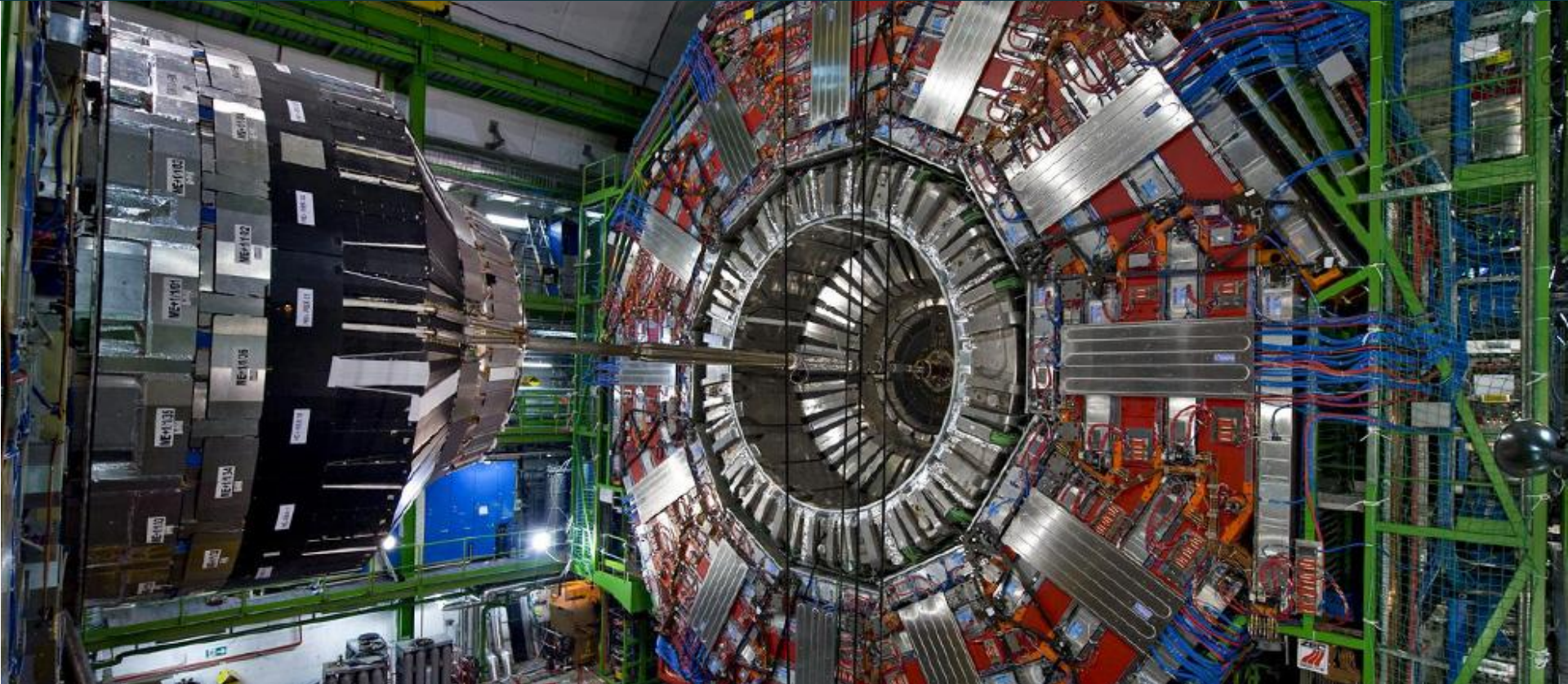
TOOLS: Measuring energy consumption

SOLUTION 1: ARM in HTC

SOLUTION 2: Task scheduling algorithm in dynamic pricing markets

ENERGY EFFICIENCY IN HIGH THROUGHPUT COMPUTING (HTC)

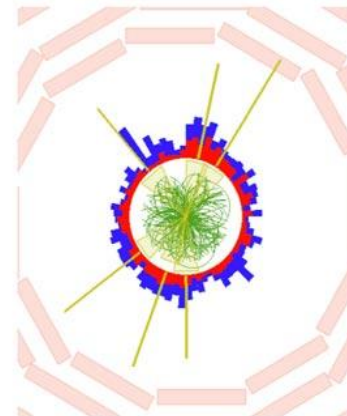
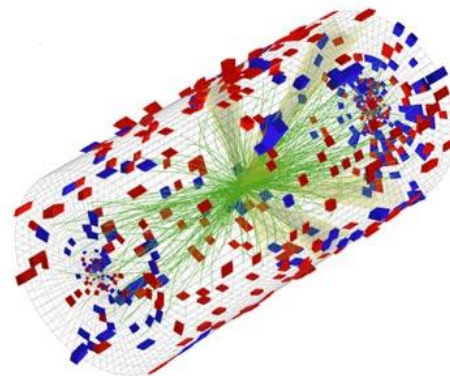
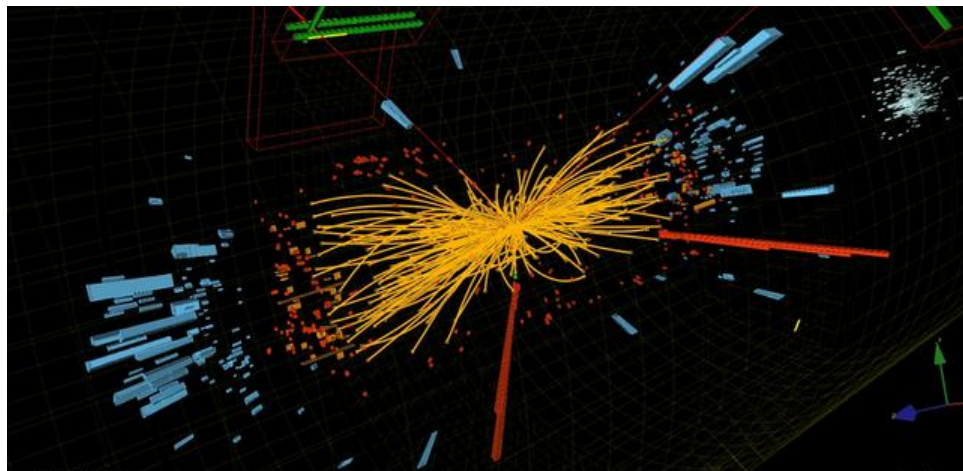
MOTIVATION: HTC, CERN & ENERGY CONSUMPTION



MOTIVATION: HTC, CERN & ENERGY CONSUMPTION

Lots of data

(1 Petabyte/s \rightarrow 200 MB/s)



MOTIVATION: HTC, CERN & ENERGY CONSUMPTION

In 2012, the Worldwide LHC computing grid *equivalent capacity* of

80,000 to 100,000 x86-64 cores

result: Higgs Boson tracked down

Future

data will increase **2 - 3** orders of magnitude
processing power in proportion

Expectable to happen throughout all HTC industry

MOTIVATION: HTC, CERN & ENERGY CONSUMPTION

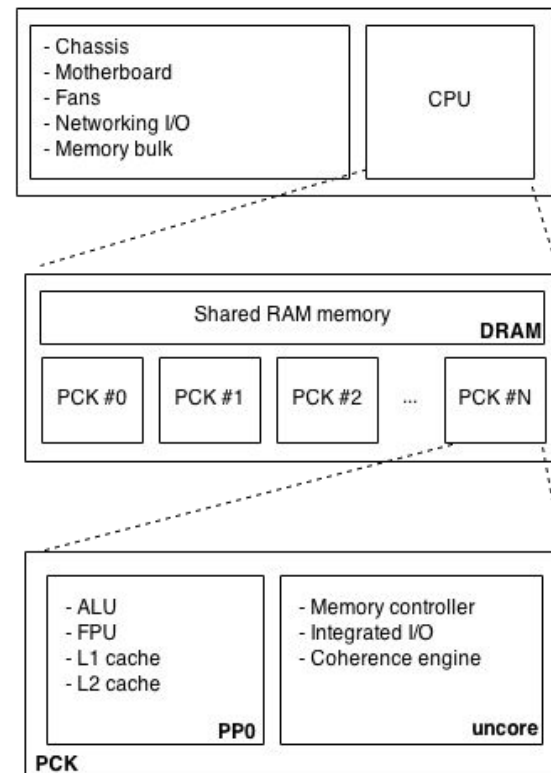
How to decrease electricity bill ?

Techniques and **tools** for measuring power consumption are important ...

TOOLS: MEASURING ENERGY EFFICIENCY

... and systems are **complex**

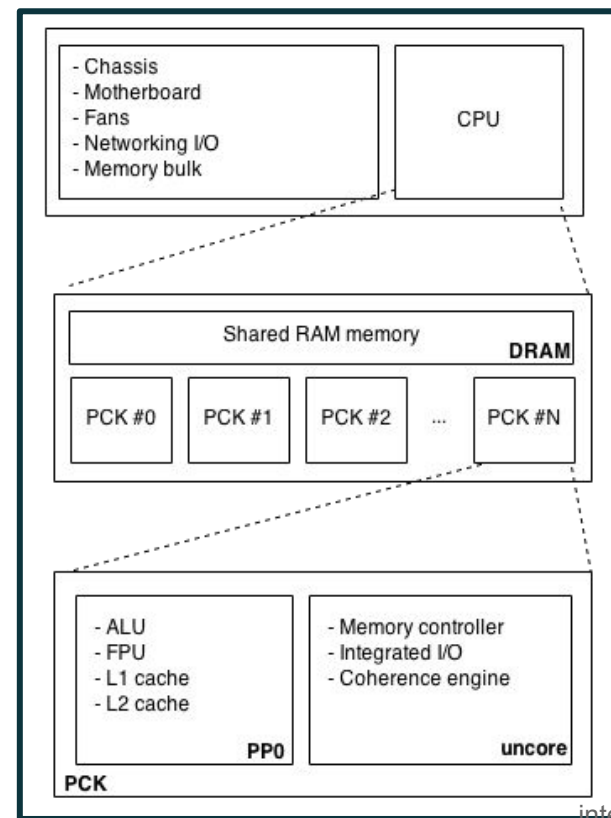
several layers and granularities



TOOLS: MEASURING ENERGY EFFICIENCY

External measurements

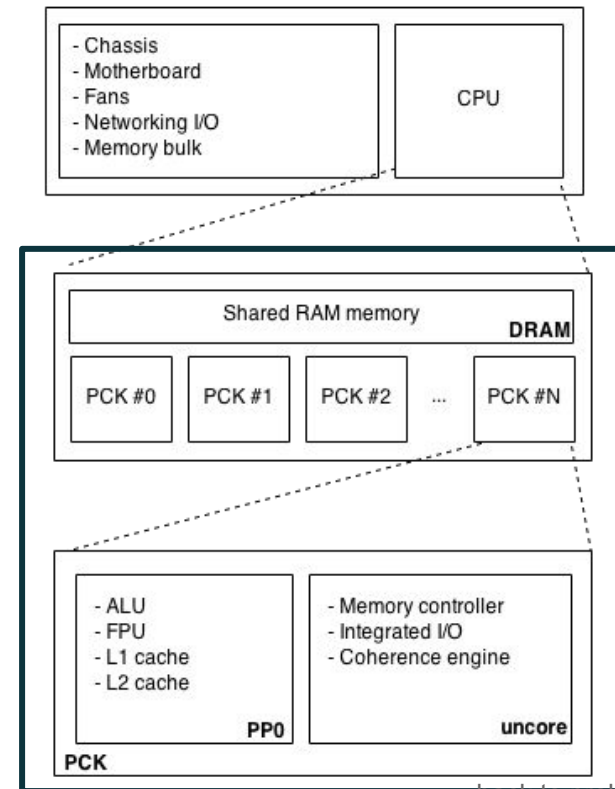
Power consumed without breaking down the system
into components



TOOLS: MEASURING ENERGY EFFICIENCY

On-chip measurements

Power consumed by different components of the CPU



back to our main problem:

How to decrease electricity bill ?

SOLUTION 1: ARM IN HTC?



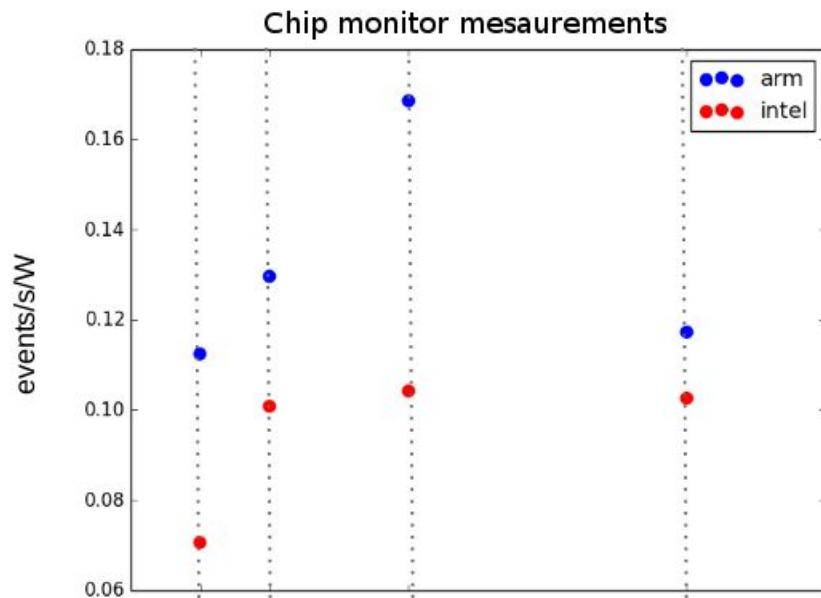
Are smartphones' CPUs
the future of High Throughput Processing ?

SOLUTION 1: ARM IN HTC?

Experiments

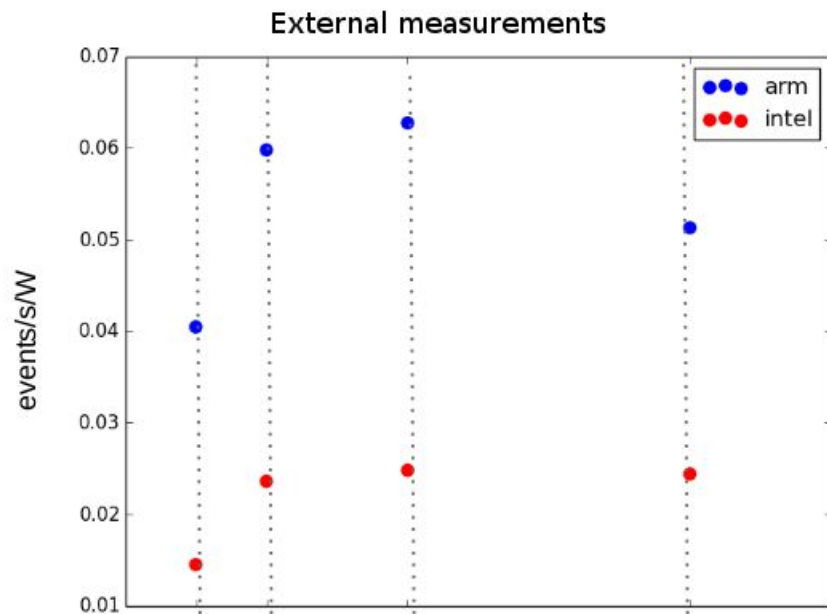
ARCHITECTURES:	ARM machine vs INTEL machine
WORKLOAD:	events (ratio nr. events/per core variable)
ENERGY PERF METRIC:	events/second/watts (e/s/W) → the higher the better
MEASUREMENTS:	external and internal

SOLUTION 1: ARM IN HTC?



Number events/core
ARM
Intel

1/4	1/2	1	2
1	2	4	8
8	16	32	64



Number events/core
ARM
Intel

1/4	1/2	1	2
1	2	4	8
8	16	32	64

SOLUTION 1: ARM IN HTC?

energy efficiency

VS

speed



back to our main problem:

How to decrease electricity bill ?

SOLUTION 2: DYNAMIC PRICING AND TASK SCHEDULING

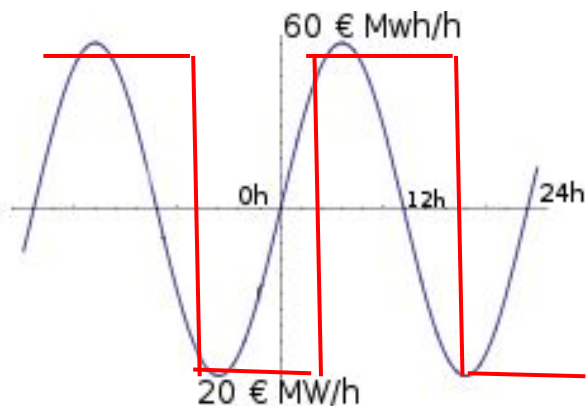
Algorithm to schedule tasks across different computing architectures in a dynamic pricing energy market

SOLUTION 2: DYNAMIC PRICING AND TASK SCHEDULING

Use expensive machines when energy is
cheaper

SOLUTION 2: DYNAMIC PRICING AND TASK SCHEDULING

Dynamic electricity price



Machines with different energy profiles

ARM more energy efficient, slower

INTEL less energy efficient, faster

SOLUTION 2: DYNAMIC PRICING AND TASK SCHEDULING

Idea *(simplified)*

Schedule tasks to **INTEL** when electricity is cheaper

Schedule tasks to **ARM** when electricity is more expensive

SOLUTION 2: DYNAMIC PRICING AND TASK SCHEDULING

How

Algorithm that computes which machines should compute data based on:

- **deadline** (how many tasks in how much time)
- **energy pricing dynamics**
- **energy profiling of the machines**

CONCLUSIONS

PROBLEM: Energy consumption is bottleneck in HTC

SOLUTION 1: ARM shows potential for HTC (but tradeoffs)

SOLUTION 2: Scheduling tasks based on energy pricing

How to measure energy consumption in complex systems ?



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Energy Efficiency in High Throughput Computing

Tools, techniques and experiments

Q & A

backup

IgProf

application profiler developed at CERN by the CMS software team

general purpose. open source. not experiment specific

measures performance (time spent in functions) and memory usage at *runtime*

allows developer to understand:

- bottlenecks

- where code needs to be optimised

cross platform: recently ported to 64-bit ARM, also supports 32-bit ARM, Intel x86 and x86-64

IgProf & energy profiling

Uses RAPL and PAPI to measure energy consumed.

Map functions and low level operations with **energy consumption**

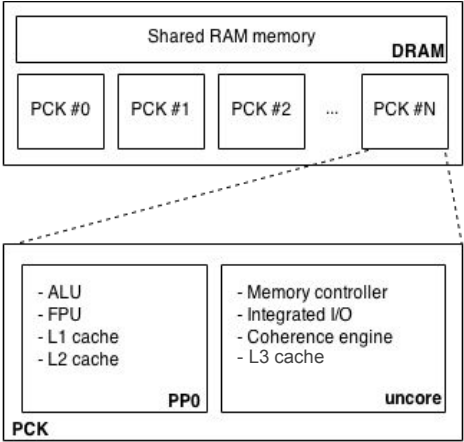
more info (strategies, results, examples)

paper and <http://igprof.org/>

Running Average Power Limiting (RAPL) by Intel

Provides a platform for power monitoring and power limiting of SoC.

Different sampling **domains**
package (*PKG*), DRAM, core



- Low level measurements** package, cores, dram
- Resolution** according to Intel, sampling frequency up to ~1 kHz
- Power capping** is also supported by RAPL
- Accuracy** high (according to *Intel*)

Example of RAPL

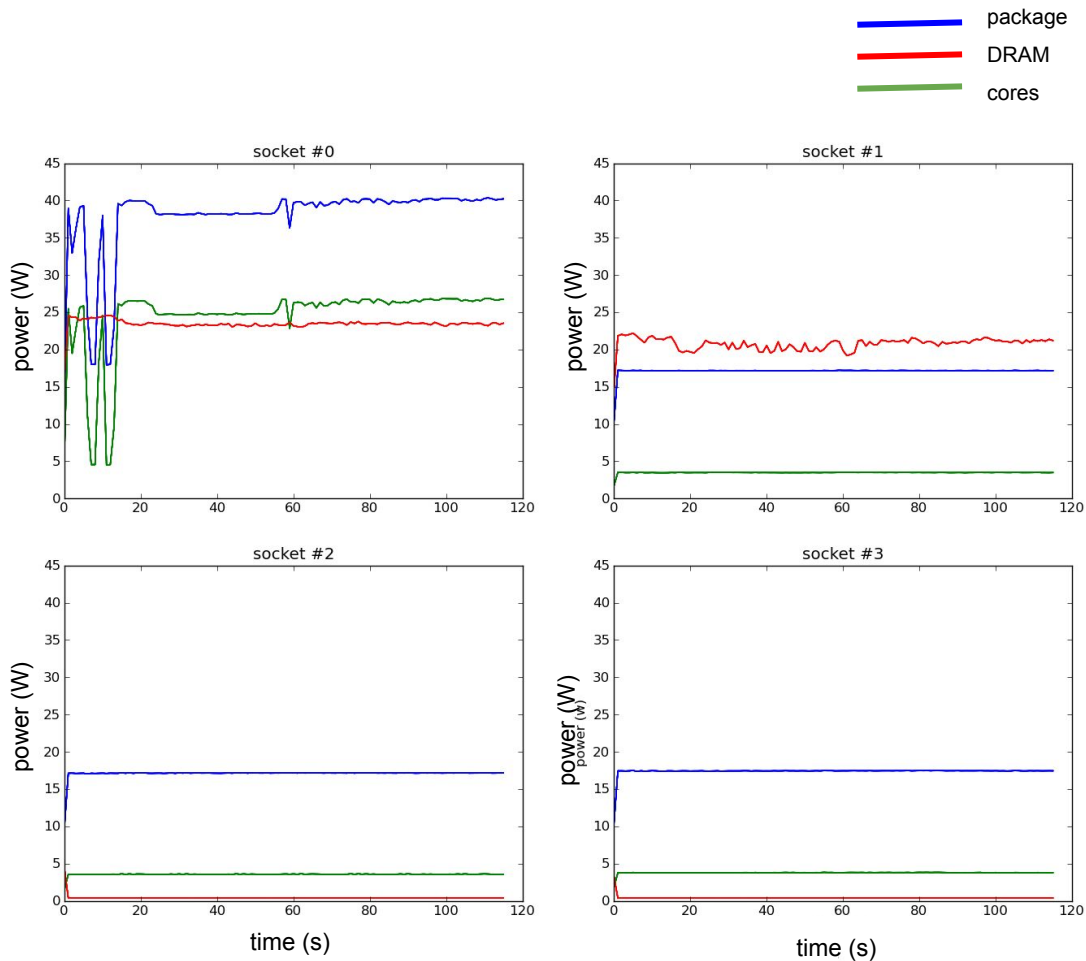
System with 4 sockets

Sockets #0 and #1 working

Sockets #2 and #3 idle

Possible to understand how

packages, cores & dram consume energy



Comparison ARM vs Intel

Comparison ARMv7 vs Intel XEON

32bit ARMv7 is used on smartphones. comparison with Intel XEON

measurements

Internal

RAPL for *Intel*

cross platform *chip monitor* integrated (TI INA 231) for ARMv7

External

workload

ParFullCMS

Multithreaded

Geant4 benchmark application

Uses the CMS geometry

ARMv7 Exynos5 Octa Cortex™
4x A15 @ 1.6Ghz and/or A7 cores (big.LITTLE technology)
2 GB RAM
ARMv7/32bit
development board

Intel **32x** Intel™ Xeon™ CPU E5-2650 @ 2.00GHz
252 GB RAM
system on a rack



Dynamic Pricing algorithm

Dynamic Pricing *(considering power in ev/s/W conversion)*

ARM

workload $0.063 \text{ ev/s/W} * 7.5 \text{ W} = 0.4725 \text{ ev/s} \text{ (40 824 ev/day)}$

price $0.0003 \text{ euros per hour per machine (0.0072 euros/day)}$
 $(0.0072 \text{ euros/day}) / (40\,824 \text{ ev/day}) = \mathbf{1.7*10^{-7} \text{ euros/ev}}$

INTEL

workload $0.023 \text{ ev/s/W} * 368 \text{ W} = 8.464 \text{ ev/s} \text{ (731 289 ev/day)}$

price $0.01472 \text{ euros per hour per machine (0.35328 euros/day)}$
 $(0.35328 \text{ euros/day}) / (731\,289 \text{ ev/day}) = \mathbf{4.8*10^{-7} \text{ euros/ev}}$

Using algorithm

Data needed:

	Price per event	Total events per day
bucket 1 (ARM low)	$8.8 \cdot 10^{-8} \text{ €}$	40 824/2
bucket 2 (ARM high)	$2.6 \cdot 10^{-7} \text{ €}$	40 824/2
bucket 3 (Intel low)	$2.4 \cdot 10^{-6} \text{ €}$	731 289/2
bucket 4 (Intel high)	$7.2 \cdot 10^{-6} \text{ €}$	731 289/2

Output:

Final price

		Events processed					
		1 day	2 days	10 days	30 days	75 days	100 days
ARM	bucket_1 (20€/Mwh)	<i>not possible</i>	40824	204120	612360	1200000	1200000
	bucket_2 (60€/Mwh)	<i>not possible</i>	40824	204120	587640	0	0
INTEL	bucket_3 (20€/Mwh)	<i>not possible</i>	731288	791760	0	0	0
	bucket_4 (60€/Mwh)	<i>not possible</i>	387064	0	0	0	0
Total Price		-	4.55€	1.97€	0.206€	0.106€	0.106€

Two machines. 120 000 events. variable deadline

Scheduling Algorithm

```
24 days = 10
25 nr_events = 1200000
26
27 bucket_1 = {
28     'price_ev': 8.8*10**-8,
29     'nr_ev_day': 40824/2,
30     'name': 'ARM_LOW'
31 }
32
33 bucket_2 = {
34     'price_ev': 2.6*10**-7,
35     'nr_ev_day': 40824/2,
36     'name': 'ARM_HIGH'
37 }
38
39 bucket_3 = {
40     'price_ev': 2.4*10**-6,
41     'nr_ev_day': 731289/2,
42     'name': 'INTEL_LOW'
43 }
44
45 bucket_4 = {
46     'price_ev': 7.2*10**-6,
47     'nr_ev_day': 731289/2,
48     'name': 'INTEL_HIGH'
49 }
50
51 result = scheduler([bucket_1, bucket_2, bucket_3, bucket_4], days, nr_events)
52 print result
```

Scheduling Algorithm

```
1  #!/usr/bin/python
2  def scheduler(buckets, days, nr_events):
3      nr_events_left = nr_events
4      final_prices = []
5      sorted(buckets) #sorts according to price per event, from lowest to highest
6
7      for bucket in buckets:
8          nr_possible_ev_process = bucket['nr_ev_day'] * days
9
10         #ensures that no more events than the needed are processed
11         nr_ev_process = nr_events_left if nr_possible_ev_process > nr_events_left \
12             else nr_possible_ev_process
13
14         price = bucket['price_ev'] * nr_ev_process
15         final_prices.append(price)
16         print bucket['name']+' processed '+ str(nr_ev_process)
17
18         nr_events_left -= nr_ev_process
19         if (nr_events_left <= 0):
20             return sum(final_prices)
21
22     return 'ERR: not enough machine processing power to process events before the deadline'
23
```

Scheduling Algorithm (comparison/ inspiration)

Jobshop algorithm

- limited set of tasks
- limited set of resources
- tries to schedule the tasks to the machines so that all tasks are completed the least amount of time possible

Differences:

- **limited set of time**
- **machines are not equal** (different energy profile)
- **Not online algorithm:** (*online: each job is presented and algorithm has to make decision before next job*)

In our algorithm, all the information the algorithm needs to schedule the tasks is given upfront (for a defined chunk of time);

Others

ARMv8 in HTC

40 Under the circumstances of the experiment, the overall results show that APM X-Gene
41 is 2.73 slower than Intel Xeon Phi. From the energy consumption performance (events
42 per second per watt), the Intel Xeon E-2650 is the most efficient, with APM X-Gene
43 presenting similar performance despite the **absence of platform specific**
44 **optimizations**. Therefore, \cite{ACAT14ARMDAVID} concludes by stating that the APM
45 X-Gene 1 Server-On-Chip ARMv8 64-bit solution is relevant and potentially
46 interesting platform for heterogeneous high-density computing.

source: Abdurachmanov, D., Bockelman, B., Elmer, P., Eulisse, G., Knight, R., and Muzaffar, S.
Heterogeneous high throughput scientific computing with APM x-gene and intel xeon phi. CoRR
abs/1410.3441 (2014).