Chapter 2

Performance Measures: Part I

Time Measurement and Operation Counts

The Single Processor Case

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That means the time we have to wait for a response of the program includes the waiting times besides the CPU time.

Time Measurement and Operation Counts

Instructions: Timings and Counts

clock rate and cycle time

The clock rate of a processor tells us how often it can switch instructions per second. Closely related is the (clock) cycle time, i.e., the time elapsed between two subsequent clock ticks.

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Example

A CPU with a clock rate of 3.5 GHz $= 3.5\,10^9$ 1/s executes $3.5\,10^9$ clock ticks per second. The length of a clock cycle thus is

$$1/(3.5\,10^9)\,\mathrm{s} = 1/3.5\,10^{-9}\,\mathrm{s} \approx 0.29\,\mathrm{ns}$$

Time Measurement and Operation Counts

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This number determines the total user CPU time together with the number of instructions and cycle time via

$$T_{U\_CPU}(A) = n_{instr}(A) \cdot CPI(A) \cdot t_{cycle}$$

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Clever choices of the instructions can influence the values of $n_{instr}(A)$ and $CPI(A)$. $\rightsquigarrow$ compiler optimization.

Time Measurement and Operation Counts

MIPS versus FLOPS

A common performance measure of CPU manufacturers is the Million instructions per second (MIPS) rate.

It can be expressed as

$$MIPS(A) = \frac{n_{instr}(A)}{T_{U\_CPU}(A) \cdot 10^6} = \frac{r_{cycle}}{CPI(A) \cdot 10^6},$$

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This measure can be misleading in high performance computing, since higher instruction throughput does not necessarily mean shorter execution time.

Time Measurement and Operation Counts

MIPS versus FLOPS

More common for the comparison in Scientific computing is the rate of floating point operations (FLOPS) executed. The MFLOPS rate of a program A can be expressed as

$$MFLOPS(A) = \frac{n_{FLOPS}(A)}{T_{U\_CPU}(A) \cdot 10^6} \, [1/\text{s}],$$

with $n_{FLOPS}(A)$ the total number of FLOPS issued by the program A.

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Note that not all FLOPS (see also Chapter 4 winter term) take the same time to execute. Usually divisions and square roots are much slower. The MFLOPS rate, however, does not take this into account.

Time Measurement and Operation Counts

CPU_Time versus Execution Time

Example (A simple MATLAB® test)

Input:

```
ct0=0;
A=randn(1500);

tic
ct0=cputime;
pause(2)
toc
cputime-ct0

tic
ct0=cputime;
[Q,R]=qr(A);
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Output:

```
Elapsed time is 2.000208 seconds.

ans =

    0.0300

Elapsed time is 0.733860 seconds.

ans =

   21.6800
```

Executed on a 4x8core Xeon® system.

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Obviously, in a parallel environment the CPU time can be much higher than the actual execution time elapsed between start and end of the process.

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The first result is easily explained by the splitting of the execution time into user/system CPU time and waiting time. The process is mainly waiting for the `sleep` system call to return whilst basically accumulating no active CPU time.

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The second result is due to the fact that the activity is distributed to several cores. Each activity accumulates its own CPU time and these are summed up to the total CPU time of the process.

Parallel Cost and Optimality

Definition (Parallel cost and cost-optimality)

The cost of a parallel program with data size n is defined as

$$C_p(n) = p * T_p(n).$$

Here $T_p(n)$ is the parallel runtime of the process, i.e., its execution time on p processors.

The parallel program is called cost-optimal if

$$C_p = T^*(n).$$

Here, $T^*(n)$ represents the execution time of the fastest sequential program solving the same problem.

In practice $T^*(n)$ is often approximated by $T_1(n)$.

Speedup

The speedup of parallel program

$$S_p(n) = \frac{T^*(n)}{T_p(n)},$$

is a measure for the acceleration, in terms of execution time, we can expect from a parallel program.

The speedup is strictly limited from above by p Since otherwise the parallel program would motivate a faster sequential algorithm. See [Rauber/Rünger '10] for details.

In practice often the speedup is computed with respect to the sequential version of the code, i.e.,

$$S_p(n) \approx \frac{T_1(n)}{T_p(n)}.$$

Parallel Efficiency

Usually, the parallel execution of the work a program has to perform comes at the cost of certain management of subtasks. Their distribution, organization and interdependence leads to a fraction of the total execution, that has to be done extra.

Definition

The fraction of work that has to be performed by a sequential algorithm as well is described by the parallel efficiency of a program. It is described by

$$E_p(n) = \frac{T^*(n)}{C_p(n)} = \frac{S_p(n)}{p} = \frac{T^*}{p \cdot T_p(n)}.$$

The parallel efficiency obviously is limited from above by $E_p(n) = 1$ representing the perfect speedup of p.

Amdahl's Law

In many situations it is impossible to parallelize the entire program. Certain fractions remain that need to be performed sequentially. When a (constant) fraction f of the program needs to be executed sequentially Amdahl's law describes the attainable speedup.

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- $f \cdot T^*(n)$ the time for the sequential fraction and
- $(1-f)/p \cdot T^*(n)$ the time for the fully parallel part.

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The best attainable speedup can thus be expressed as

$$S_p(n) = \frac{T^*(n)}{f \cdot T^*(n) + \frac{1-f}{p} T^*(n)} = \frac{1}{f + \frac{1-f}{p}} \leq \frac{1}{f}.$$

Scalability of Parallel Programs

Question

Is the parallel efficiency of a parallel program independent of the number of processors p used?

The question is answered by the concept of parallel scalability. Scientific computing and HPC distinguish two forms of scalability:

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- **strong scalability**
  captures the dependence of the parallel runtime on the number of processors for a fixed total problem size.

- **weak scalability**
  captures the dependence of the parallel runtime on the number of processors for a fixed problem size per processor.