



The Abdus Salam
International Centre
for Theoretical Physics



Measuring Hardware Performance

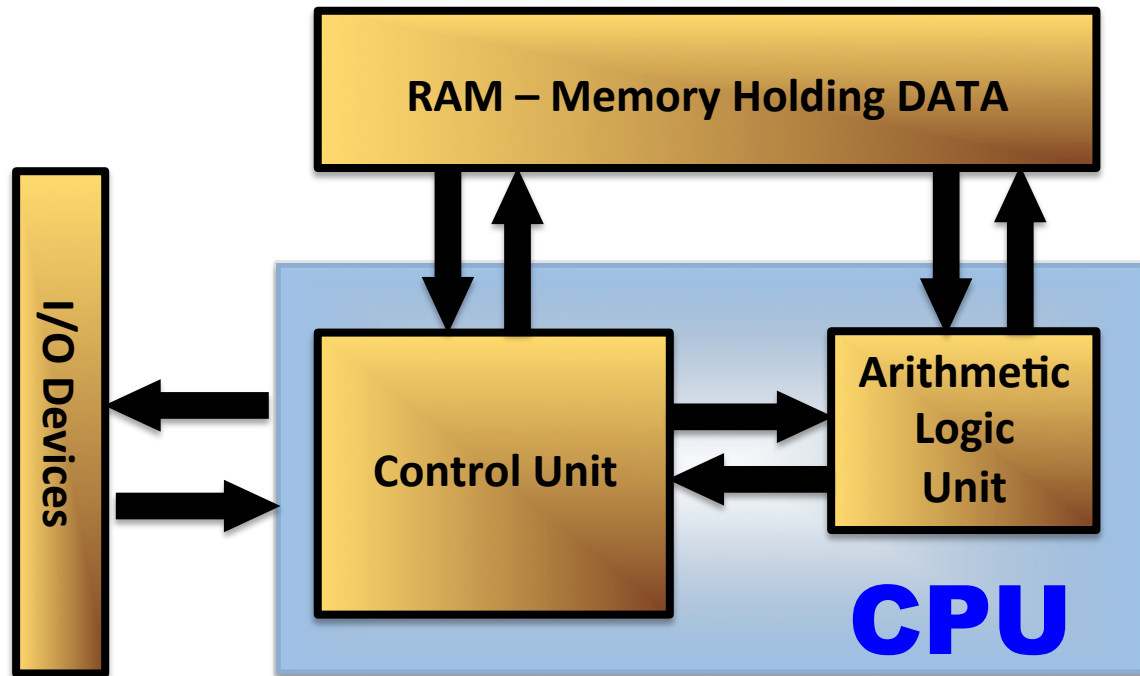
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International Centre for Theoretical Physics (ICTP)



John Von Neumann

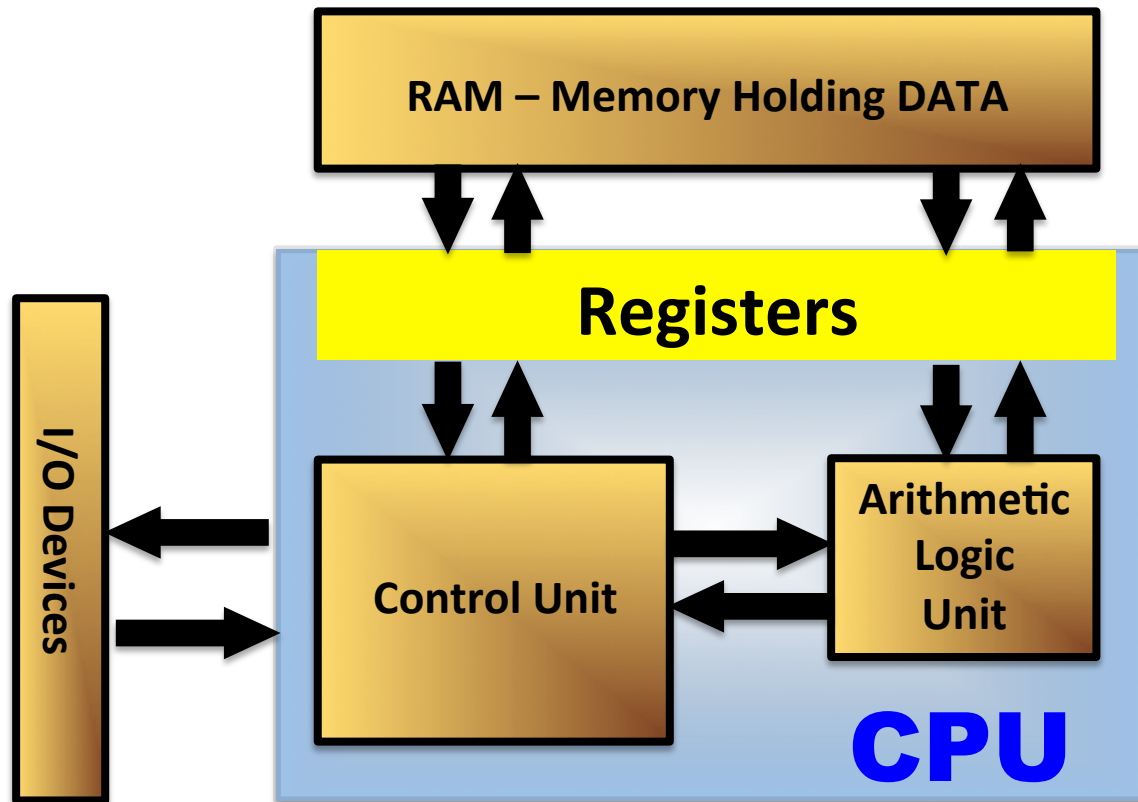
The Classical Model





John Von Neumann

The Classical Model





Performance Metrics

- When all CPU component work at maximum speed that referred *peak of performance*
 - Tech-spec normally describe the theoretical peak
 - Benchmarks measure the real peak
 - Applications show the real performance value
- CPU performance is measured as:
 - Floating point operations per seconds GFLOP/s
- But the real performance is in many cases mostly related to the memory bandwidth (GBytes/s)

How fast is my CPU?!

- CPU power is measured in FLOPS
 - number of floating point operations x second
 - $\text{FLOPS} = \# \text{cores} \times \text{clock} \times \frac{\text{FLOP}}{\text{cycle}}$
- FLOP/cycle is the number of multiply-add (FMA) performed per cycle
 - architectural limit
 - depend also by the instruction set supported

The CPU Memory Hierarchy



The diagram illustrates the CPU memory hierarchy as a pyramid with three levels. The top level is a teal triangle labeled 'CPU Registers'. The middle level is a red trapezoid labeled 'CACHE'. The bottom level is a dark blue trapezoid labeled 'MAIN MEMORY'. To the right of the pyramid, there is a teal horizontal bar labeled 'COMPUTATION' at the top and a yellow horizontal bar labeled 'APPLICATION DATA' at the bottom. A large red double-headed arrow with a diagonal hatching pattern connects the 'COMPUTATION' bar to the 'APPLICATION DATA' bar, indicating the flow of data between these two stages.

CPU
Registers

CACHE

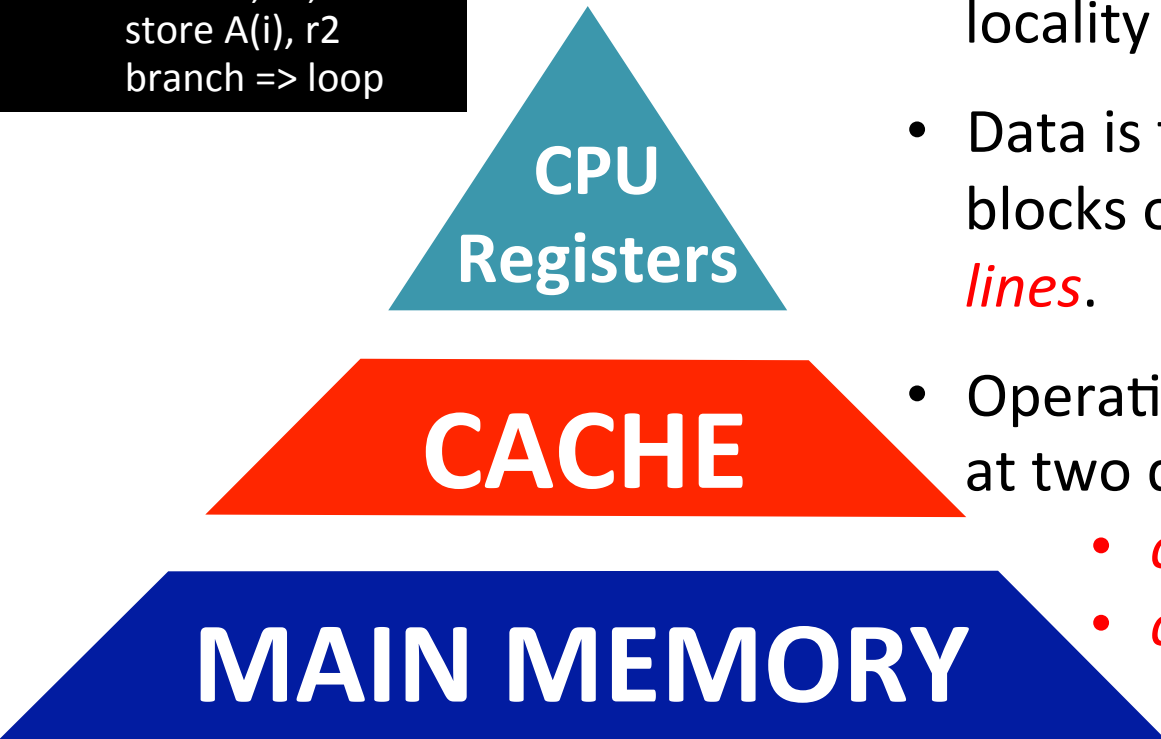
MAIN MEMORY

COMPUTATION

APPLICATION DATA

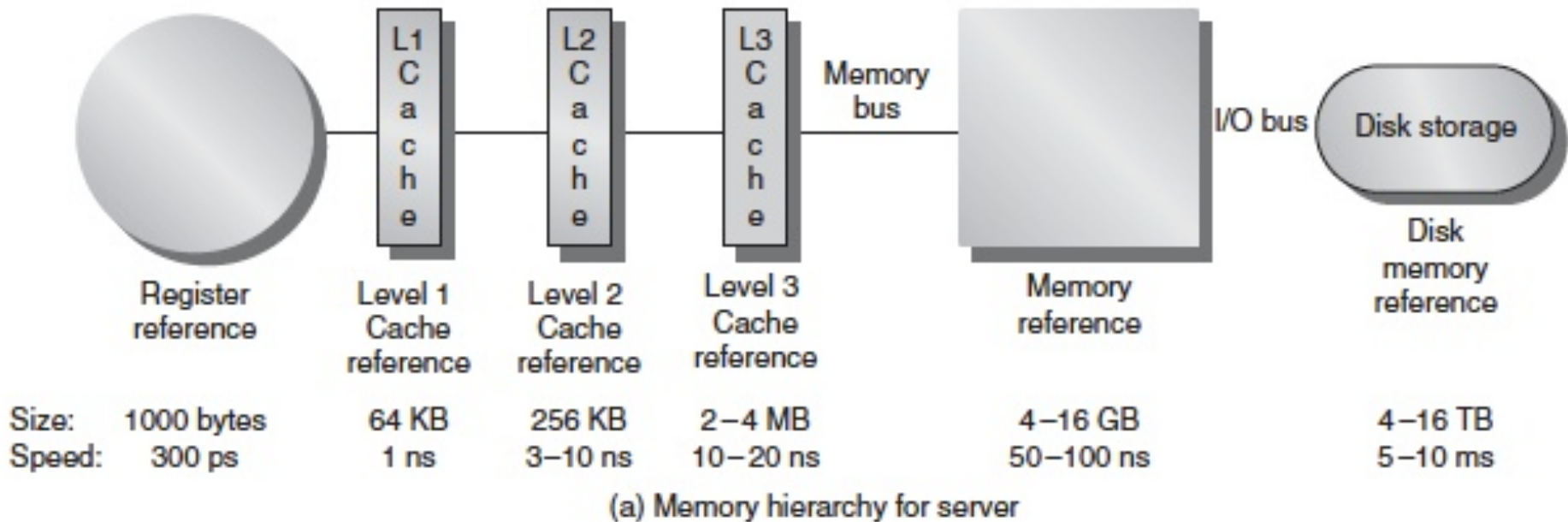
Cache Memory

```
Loop: load r1, A(i)
      load r2, s
      mult r3, r2, r1
      store A(i), r2
      branch => loop
```

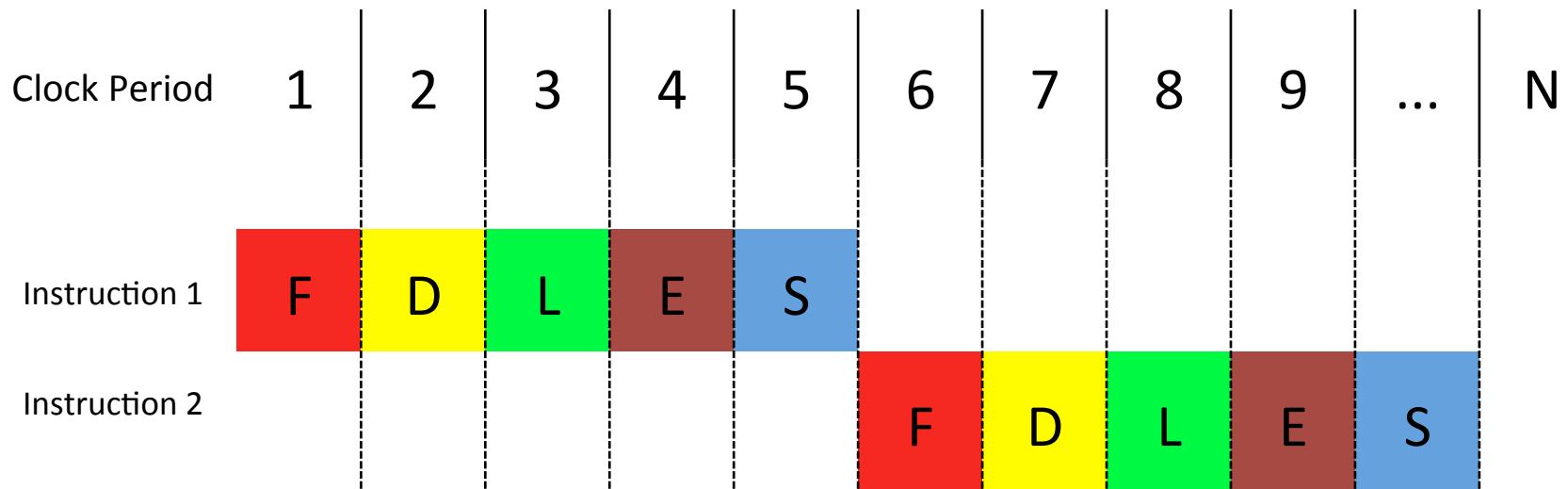


- Designed for temporal/spatial locality
- Data is transferred to cache in blocks of fixed size, called *cache lines*.
- Operation of LOAD/STORE can lead at two different scenario:
 - *cache hit*
 - *cache miss*

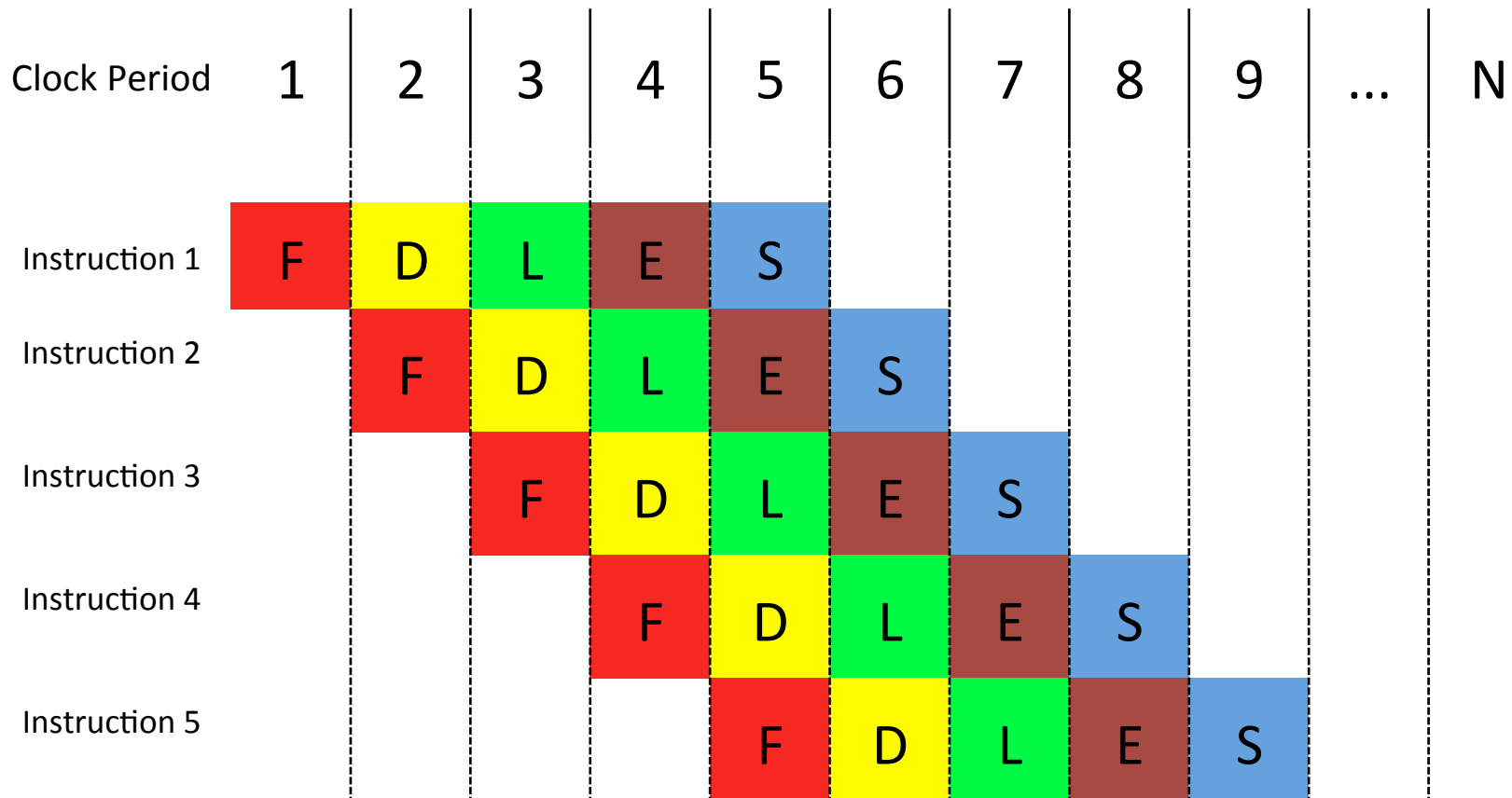
The CPU Memory Hierarchy



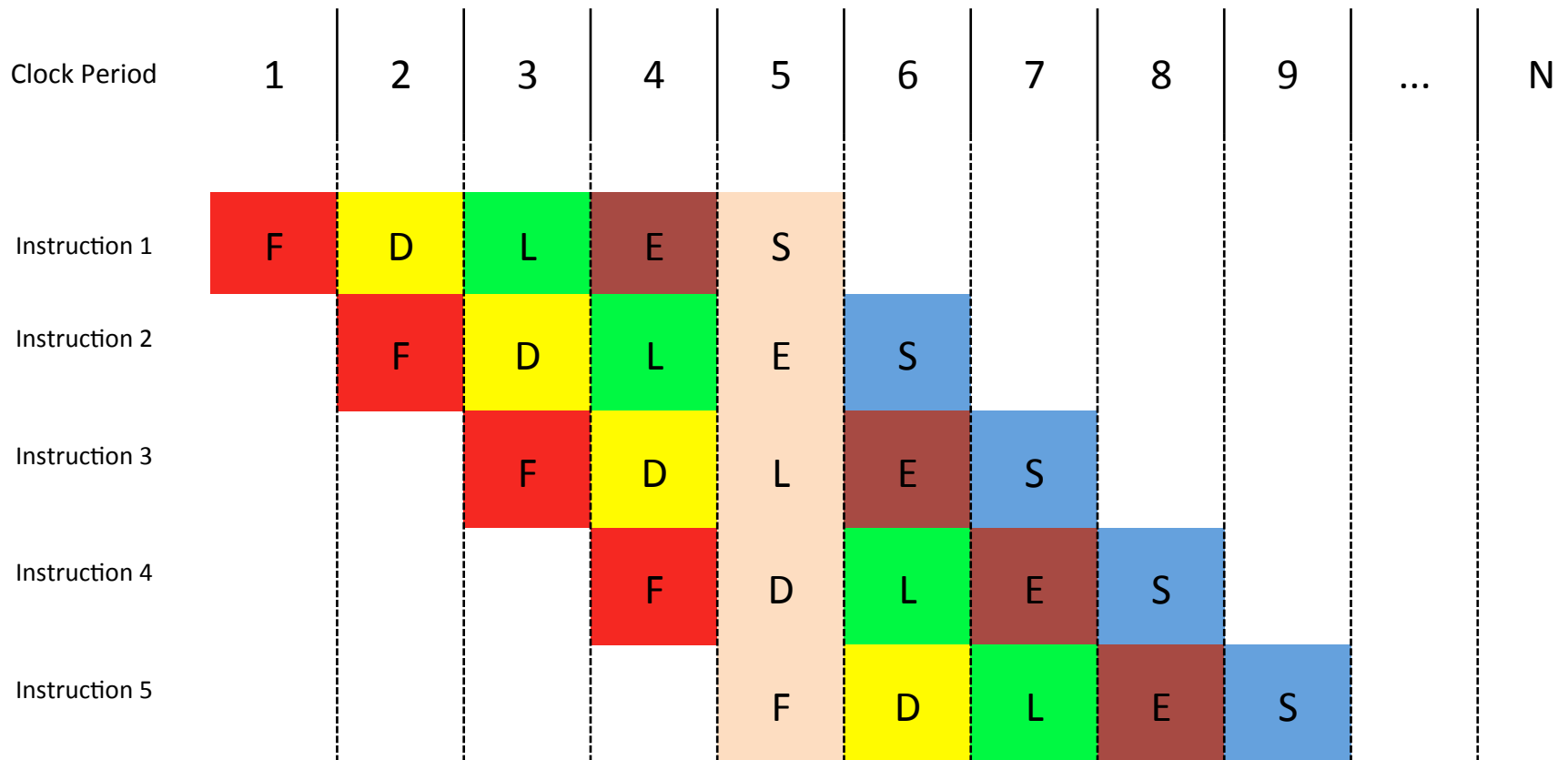
Sequential Processing



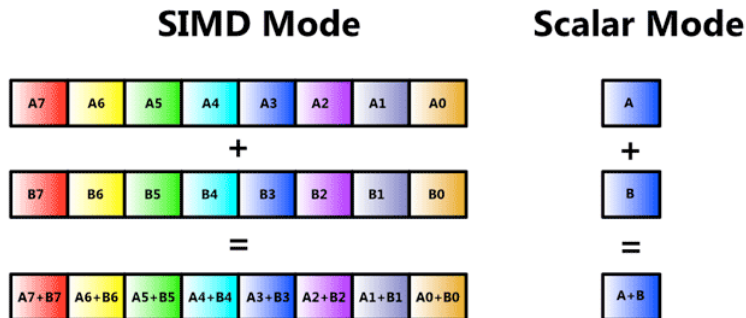
Pipelining



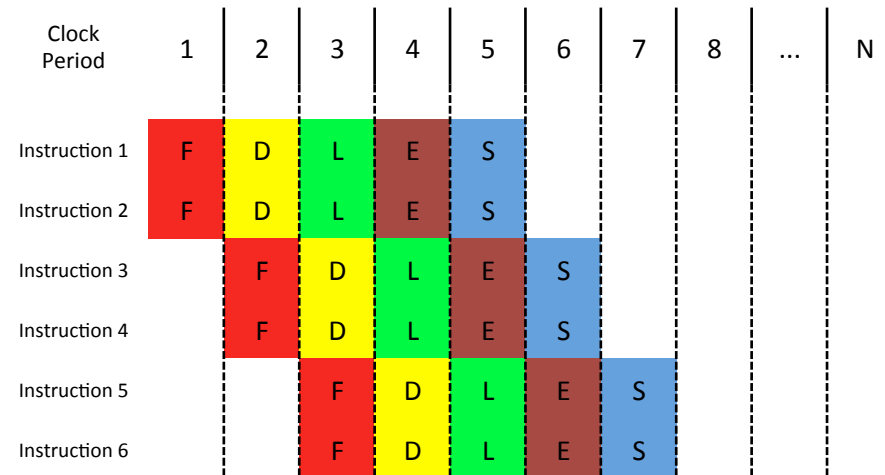
Pipelining



To the Extreme - Parallel Inside

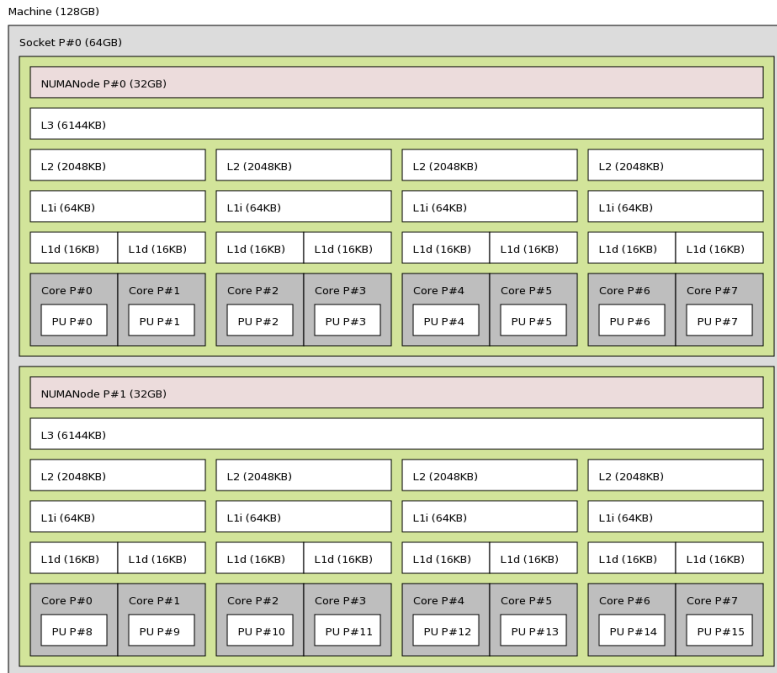


Vector Units for processing multiple data in //

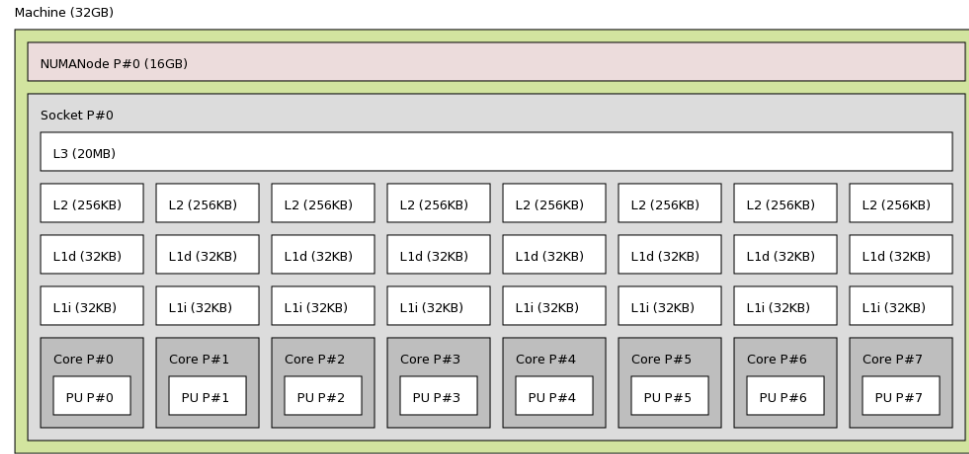


Pipelined/Superscalar design: multiple functional units operate concurrently

Modern CPUs Models

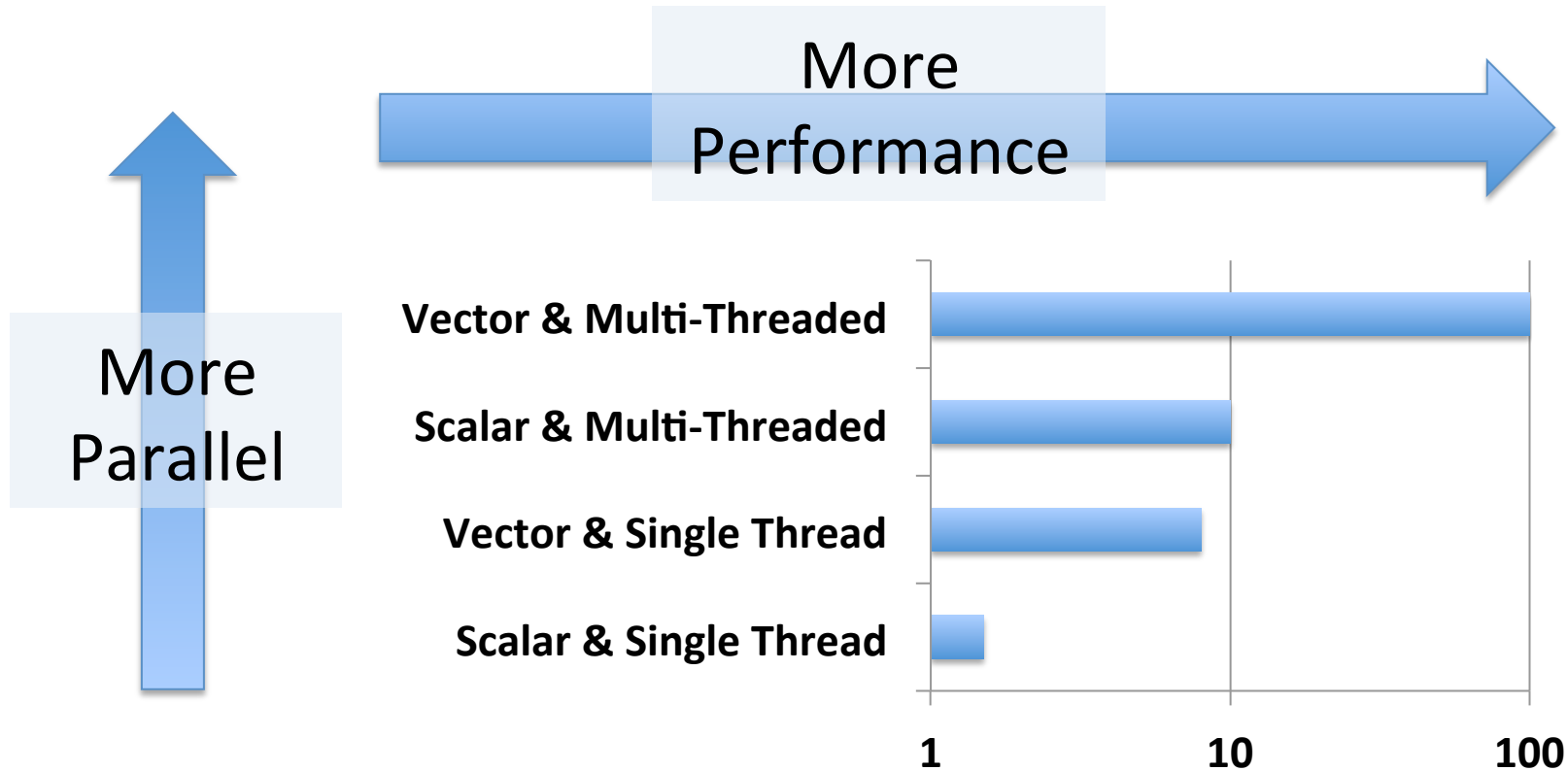


The AMD Opteron 6380 Abu Dhabi 2.5GHz



The Intel Xeon E5-2665 Sandy Bridge-EP 2.4GHz

Threading and Vectorization



DGEMM

- Matrix Multiplication (MM) is used for measuring HW performance in terms of “compute power”
- The DGEMM is a Level 3 BLAS operation
- For MM the complexity ($2 \times N^3$) is relevant compared to the transferred data ($3 \times N^2$) => compute-bound
- FLOP/s are obtained dividing the time to solution for a DGEMM multiplication by the number of operations

DAXPY

- It is a linear combination of vectors
 - $y = \alpha x + y$
- The DAXPY is a Level 1 BLAS operation
- For DAXPY the complexity ($2 \times N$) is equal to the transferred data ($2 \times N$) => memory-bound
- It used to measure the memory bandwidth of a system and how it impacts on performances

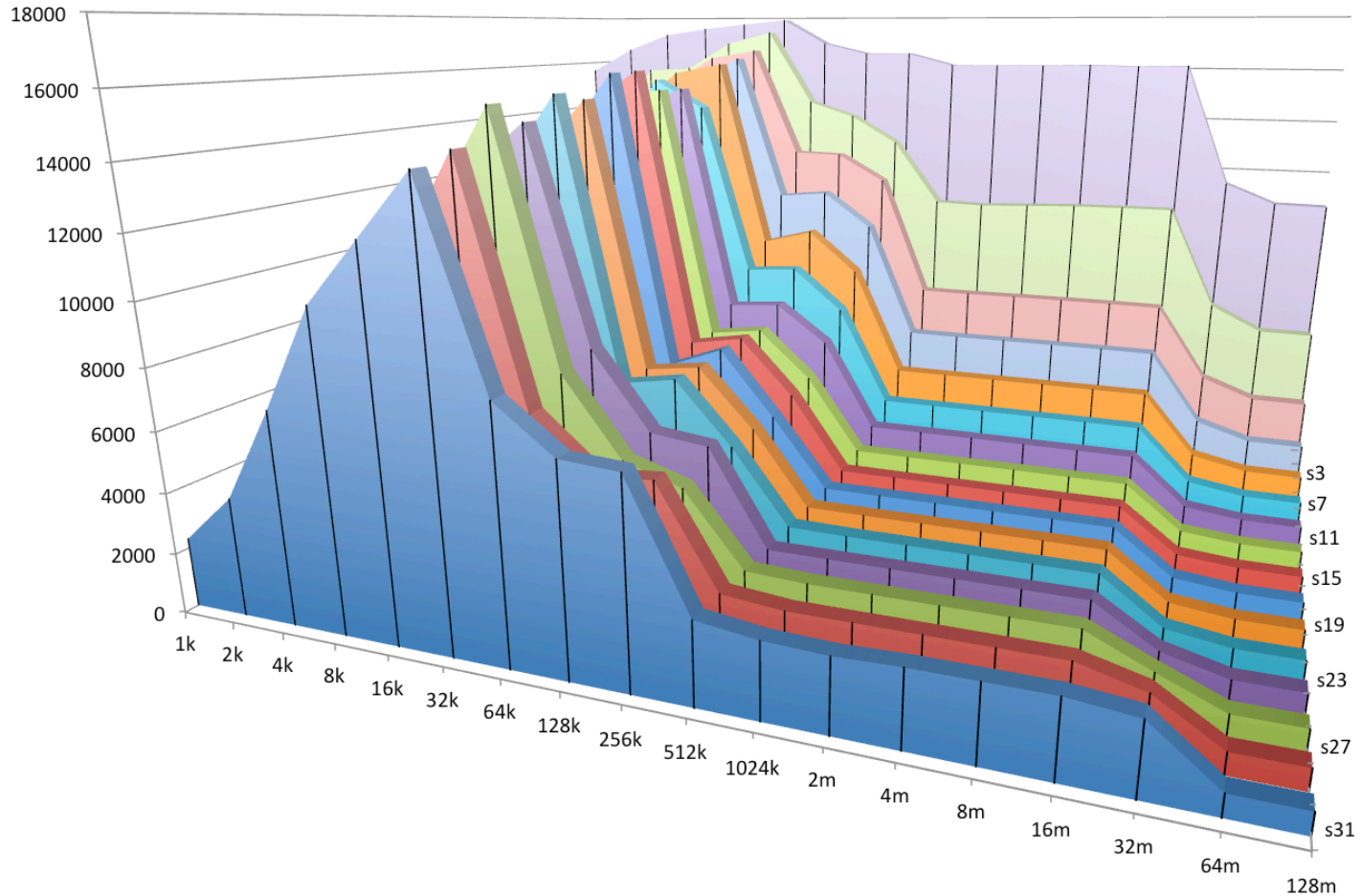


```
/* $begin mountainmain */
for (size = MINBYTES; size <= MAXBYTES; size <<= 1)
    for (stride = MAXSTRIDE - 1; stride >= 1; stride -= STRIDESTRIDE) {
        printf("%.0f\t", run(size, stride, Mhz));
    }
    printf("\n");
}
```

```
/* $begin mountainfuns */
void test(int elems, int stride) /* The test function */
{
    for (int i = 0; i < elems; i += stride)
        int result += data[i];
}

/* Run test(elems, stride) and return read throughput (MB/s) */
double run(int size, int stride, double Mhz)
{
    double cycles;
    int elems = size / sizeof(int);

    /* call test(elems, stride) */
```



Libraries



Highly-portable
(included into some
Linux distributions)



Freely available
Open Source Optimized

FFTW

MAGMA

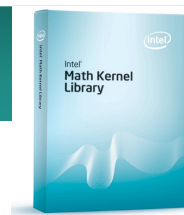
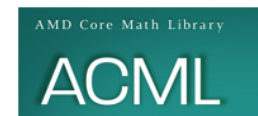
ATLAS

OpenBLAS

PLASMA



Third-Party Highly-Optimized



nag[™] Results Matter. Trust NAG.

IBM **ESSL**



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Thanks for your attention!!

