Modelling and optimisation of scientific software for multicore platforms

Domingo Giménez

... and the list of collaborators within the presentation

Group page: http://www.um.es/pcgum

Presentations: http://dis.um.es/ %7Edomingo/investigacion.html

June 2010, Workshop Scheduling in Aussois

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- Rosebud (Polytechnic Univ. of Valencia): cluster with 38 cores 2 nodes single-processors, 2 nodes dual-processors, 2 nodes with 4 dual-core, 2 nodes with 2 dual-core, 2 nodes with 1 quad-core
- Hipatia (Polytechnic Univ. of Cartagena): cluster with 152 cores 16 nodes with 2 quad-core, 2 nodes with 4 quad-core, 2 nodes with 2 dual-core

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• Ben-Arabi (Supercomputing Centre of Murcia): Shared-memory $+$ cluster: 944 cores Arabi: cluster of 102 nodes with 2 quad-core Ben: HP Superdome, cc-NUMA with 128 cores

Ben architecture

Hierarchical composition with crossbar interconnection.

Two basic components: the computers and two backplane crossbars.

Each computer has 4 dual-core Itanium-2 and a controller to connect the CPUs with the local memory and the crossbar commuters.

The maximum memory bandwidth in a computer is 17.1 GB/s and with the crossbar commuters 34.5 GB/s.

The access to the memory is non uniform and the user does not control where threads are assigned.

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Scientific code optimisation

• Modelling scientific code

- **From basic routines...**
- \bullet ... to scientific codes
- For multicore, clusters, supercomputers
- **•** Installation tools and methodology
	-
	-
- • Adaptation methodology:
	-
	-

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- For multicore, clusters, supercomputers
- Installation tools and methodology
	- Using the previous models...
	- ... and empirical analysis for the particular routine and computational system
- Adaptation methodology:
	- With the model and the empirical study at installation time...
	- ... adapt the software to the entry and system conditions at running time

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Regional meteorology simulations

Joint work with Sonia Jerez, Juan-Pedro Montávez, Regional Atmospheric Modelling Group, Univ. Murcia Sonia Jerez, Juan-Pedro Montávez, Domingo Giménez, Optimizing the execution of a parallel meteorology simulation code, IEEE IPDPS, 10th Workshop on Parallel and Distributed Scientific and Engineering Computing, Rome, May 25-29, 2009

- MM5: parallel versions with OpenMP and MPI
- Optimise the use on multicore systems of the parallel codes

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Regional meteorology simulations: modelling

After the simulation of a period of fixed length (spin-up period, T_s) the influence of the initial condition is discarded. The value of T_s depends on each experiment.

• Time parallelization:

Divide the period P in N_t subperiods and simulate each subperiod with the *spin-up* time T_s :

$$
\mathcal{T} = \left(\frac{P}{N_t} + \mathcal{T}_s\right)t
$$

where t is the cost of the simulation of a unity-length period

• Spatial parallelization: Using the PARALLEL CODE that divides the spatial domain, each portion is solved in a core. Use $N_p = N_x N_y$ cores for each simulation The total number of cores is $N = N_t N_p$ The cost of a basic operation depends on the parameters: $t=f\left(N_t,N_{\sf x},N_{\sf y}\right)$ and mesh configurat[ion](#page-8-0)

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• Installation:

- A short period of time is simulated for all the possible combinations of N_t with N_p
- with a limit: $N_tN_p \leq 2N$
- for some trial domains
- and different mesh shapes: combinations of N_x and N_y
- Execution:
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	-
	-
	-

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- **•** Execution:
	- Select the values of N_t , N_\times and N_y
	- tacking into consideration the size and characteristics of the problem to be solved
	- with the values $t=f\left(N_t,N_{\sf x},N_{\sf y}\right)$ estimated at installation time for domains close to the current domain
	- to update the information generated at installation time:

Regional meteorology simulations: results

- **O** DEFAUL: uses default parameters
- **O** INSTAL: with installation information selects the values which gives lowest modelled time
- **INS+EXE:** repeats the experiments for the current problem for the parameter combinations which provide lowest modelled time
- EXECUT: repeats installation running for the current domain, and selects the parameters which give the lowest estimated time

Reduction between 25% and 40% of th[e ex](#page-13-0)[ec](#page-15-0)[ut](#page-13-0)[ion](#page-14-0) [ti](#page-3-0)[m](#page-4-0)[e](#page-20-0)

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Hydrodynamic simulations

Joint work with Francisco López-Castejón, Oceanography Group, Polytechnic Univ. of Cartagena

Francisco López-Castejón, Domingo Giménez, Auto-optimisation on parallel hydrodynamic codes: an example of COHERENS with OpenMP for multicore, XVIII International Conference on Computational Methods in Water Resources, Barcelona, June 21-24, 2010

- Easy parallelisation and optimisation of COHERENS
- parallelize each loop separately
- with a different number of threads for each loop
- • select the number of threads in each loop
	- with information obtained at installation time
	- and adaptation in the initial iterations

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Simultaneous Equation Models

Joint work with José-Juan López-Espín, Univ. Miguel Hernández of Elche, Antonio M. Vidal, Polytechnic Univ. Valencia

José J. López-Espín, Domingo Giménez, Solution of Simultaneous Equations Models

in high performance systems, International Congress on Computational and Applied

Mathematics, Leuven, Belgium, July 5-9, 2010

- Use of matrix decompositions to obtain a number of algorithms with low execution time
- Basic operations: QR decomposition, matrix multiplications, Givens rotations
- Two types of parallelism: in the basic operations, and OpenMP parallelism in the computation of different equations
- Model of the execution time to decide the algorithm to use for an entry and system
- Estimation at installation time of the values of the parameters in the models
- Include two-level parallelism

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Parameterised shared-memory metaheuristics

Joint work with José-Juan López-Espín, Univ. Miguel Hernández of Elche, Francisco Almeida, Univ. of La Laguna Jose-Juan López-Espín, Francisco Almeida, Domingo Giménez, A parameterised shared-memory scheme for parameterised metaheuristics, 10h International Conference on Computational and Mathematical Methods in Science and Engineering, Minisymposium on High Performance Computing, Almería, June 26-30, 2010

- **Parameterised metaheuristic scheme** facilitates development and tuning of metaheuristics and hybridation/combination of metaheuristics
- Unified parallel shared-memory scheme for metaheuristics facilitates development of parallel metaheuristics or of their hybridation/combination
- Parameterised parallel shared-memory scheme for metaheuristics

facilitates optimisation of parallel meta[heu](#page-17-0)[ris](#page-19-0)[t](#page-17-0)[ics](#page-18-0)

Parameterised shared-memory metaheuristics: results

- Applied to obtaining satisfactory Simultaneous Equation Models given a set of values of variables
- Metaheuristics: GRASP, genetic, scatter search, GRASP+genet., GRASP+SS, Gent.+SS, GRASP+genet.+SS
- With different number of threads in each function and two-level parallelism better results

Other scientific problems

• Integral equations to study breaking of microstrip components Joint work with José-Ginés Picón, Supercomputing Centre Murcia, and Alejandro Alvarez and Fernando D. Quesada, ´ Computational Electromagnetism Group Univ. Polytechnic of Cartagena

Parallelise and optimise code, with nested parallelism and basic linear algebra routines (zgemv and zgemm)

• Bayesian simulations

Joint work with Manuel Quesada, and Asunción Martínez-Mayoral and Javier Socuellamos, Univ. Miguel **Hernández**

Web application to study bayesian distributions, to be installed on different platforms and with parallelism hidden to the user

Possible collaboration with a company: design of bridges, with metaheuristics and parallelism, in super[co](#page-19-0)[mp](#page-21-0)[u](#page-19-0)[te](#page-20-0)[r](#page-21-0) [B](#page-3-0)[e](#page-20-0)[n](#page-21-0)[A](#page-3-0)[r](#page-4-0)[a](#page-20-0)[bi](#page-21-0)B

Modelling basic routines

Joint work with Javier Cuenca, Computer Architecture Department, Univ. of Murcia, Luis-Pedro García, Polytechnic Univ. of Cartagena

• The goal:

on multicore systems, with OpenMP,

to model routines of high level

by using information obtained from routines of low level

Basic work:

threads generation loop work distribution synchronisation

• Higher level routines: matrix-vector multiplication Jacobi iteration matrix-matrix multiplciation Strassen multiplication

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Modelling: test routines

R-generate

Creates a series of threads with a fixed quantity of work to do per thread

To compare the time of creating and managing threads

R-pfor

A simple for loop where there is a significant work inside each iteration

To compare the time of distributing dynamically a set of homogeneous tasks

• R-barriers

A barrier primitive set after a parallel working area To compare the times to perform a global synchronisation of all the threads

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Modelling: systems

• P2c (a laptop)

Intel Pentium, 2.8 GHz, with 2 cores. Compilers: icc 10.1 and gcc 4.3.2.

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Alpha EV68CB, 1 GHz, with 4 cores. Compilers: cc 6.3 and gcc 4.3.

X4c

Intel Xeon, 3 GHz, with 4 cores. Compilers: icc 10.1 and gcc 4.2.3.

• X8c (a node of Hipatia) Intel Xeon, 2 GHz, with 8 cores. Compilers: icc 10.1 and gcc 3.4.6

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Modelling: R-generate

threads \leq # cores: $T_{R-generate} = PT_{gen} + NT_{work}$ $\#$ threads $> \#$ cores: $T_{R-generate} = P T_{gen} + N T_{work} \frac{P}{C} \left(1 + \frac{T_{swap}}{T_{cpu}} \right)$

Modelling higher level routines: Jacobi

• Estimation of the parameters:

• Substitution of estimated values of the parameters in the model of the routine:

 $#$ threads \leq $#$ cores:

$$
\mathcal{T}_{Jacobi} = \mathit{PT}_{gen} + 11\frac{n^2}{P}\mathcal{T}_{work}
$$

 $#$ threads $>$ $#$ cores:

$$
\mathcal{T}_{Jacobi} = \mathit{PT}_{gen} + 11 \frac{n^2}{C} \mathcal{T}_{work} \left(1 + \frac{\mathcal{T}_{swap}}{\mathcal{T}_{cpu}} \right)
$$

Decision of the number of threads and compiler to use in the solution of the problem.**K ロ ▶ K @ ▶ K 할 X X 할 X → 할 X → 9 Q Q ^**

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Modelling: Jacobi, results

Modelling: Strassen multiplication

 $#$ threads \leq $#$ cores:

$$
\mathcal{T}_{Strassen} = \mathit{PT}_{gen} + \frac{7}{4} \frac{n^3}{\mathit{P}} \mathcal{T}_{mult} + \frac{9}{2} n^2 \mathcal{T}_{add}
$$

$$
T_{Strassen} = PT_{gen} + \frac{49}{32} \frac{n^3}{P} T_{mult} + \frac{63}{8} \frac{n^2}{P_1} T_{add} + \frac{9}{2} n^2 T_{add}
$$

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$$
T_{Strassen} = PT_{gen} + \frac{49}{32} \frac{n^3}{C} T_{mult} \left(1 + \frac{T_{swap}}{T_{cpu}} \right) +
$$

$$
\frac{63}{8} \frac{n^2}{\min\{P_1, C\}} T_{add} \left(1 + \frac{T_{swap}}{T_{cpu}}\right) + \frac{9}{2} n^2 T_{add}
$$

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Modelling higher level routines: Strassen, SP values

Modelling: Strassen, results

Modelling higher routines: Strassen, results

Problem size 1000

Combination giving the best results:

Execution time for different values of the parameters:

- To identify the shape matrix multiplication has in a multicore as a function of the problem size and the number of threads, to decide the number of threads to use to obtain the lowest execution time
- **•** To use this information to develop two-level (OpenMP+BLAS) versions of the multiplication, and select the number of threads in each level
- To use this information to develop three-level (MPI+OpenMP+BLAS) versions, and select the number of processes and threads in each level
- To use this information to develop heterogeneous/distributed three-level (MPI+OpenMP+BLAS) versions, and select the number of processes and its distribution or the data partition, and in each processor the number of threads in each level**A DIA K RIA K E A SA K H A K RIA K LE A SA CA**

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Systems, basic components

Using MKL

- The library is multithreaded.
- Number of threads estabished with the environment variable MKL_NUM_THREADS or in the program with the function mkl set num threads.
- Dynamic parallelism is enabled with MKL DYNAMIC=true or $mkl_set_dynamic(1)$. The number of threads to use in dgemm is decided by the system, and is less or equal to that established.
- To enforce the utilisation of the number of threads, dynamic parallelism is turned off with MKL DYNAMIC=false or mkl_set_dynamic(0).

MKL, results

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threads

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MKL, results

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MKL, results

Two-level parallelism

It is possible to use two-level parallelism: Open $MP + MKL$. The rows of a matrix are distributed to a set of OpenMP threads (nthomp). A number of threads is established for MKL (nthmkl). Nested parallelism must be allowed, with OMP NESTED=true or

omp_set_nested(1).

```
omp_set_nest(1);omp_set_num_threads(nthomp);
mkl_set_dynamic(0);
mkl_set_num_threads(nthmkl);
#pragma omp parallel
   obtain size and initial position of the submatrix of A to be
      multiplied
```
call dgemm to multiply this submatrix by matrix B
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Two-level parallelism, results

thr. OpenMP - # thr. MKL / without -with dynamic

thr. OpenMP - # thr. MKL / without - with dynamic

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Two-level parallelism, results

hipatia16

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Two-level parallelism, conclusions

- In Hipatia (MKL version 10.0) the nested parallelism seems to disable the dynamic selection of threads.
- In the other systems, with dynamic assignation the number of MKL threads seems to be one when more than one OpenMP threads are running.
- When the number of MKL threads is established in the program bigger speed-ups are obtained.
- Normally the use of only one OpenMP thread is preferable.
- Only in Ben to use a higher number of OpenMP threads is a good option. Speed-ups between 1.2 and 1.8 are obtained with 16 OpenMP and 4 MKL threads.

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Two-level parallelism, results

Two-level parallelism, surface shape

Execution time with matrix size 5000 only times lower than 1/10 the sequential time

Matrix multiplication: research lines

- Development of a 2lBLAS prototype, and application to scientific problems
- Simple MPI+OpenMP+MKL version

Experiments in large shared-memory (ben), large clusters (arabi), and heterogeneous (rosebud, ben+arabi)

● ScaLAPACK style MPI+OpenMP+MKL version

Determine number of processors, and OpenMP and MKL threads From the model and empirical analysis or with adaptive algorithm In heterogeneous platform the number of processes per processor

● Heterogeneous ScaLAPACK style MPI+OpenMP+MKL version Determine volume of data for each processors, and OpenMP and MKL threads

From the model and empirical analysis or with adaptive algorithm