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Barcelona Supercomputing Center Centro Nacional de Supercomputación

# Understanding applications performance with Paraver

Judit Gimenez BSC

> PATC Parallel Programing Workshop Oct 14-18 2013

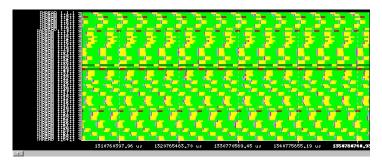
#### **Our Tools**

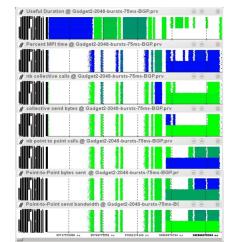
- « Since 1991
- « Based on traces
- « Open Source
  - http://www.bsc.es/paraver

#### « Core tools:

- Paraver (paramedir) offline trace analysis
- Dimemas message passing simulator
- Extrae instrumentation
- « Focus
  - Detail, flexibility, intelligence



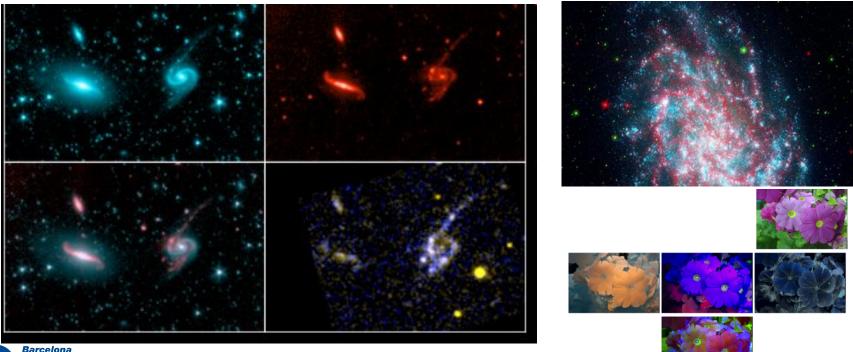






#### ( Different looks at one reality

- Different spectral bands (light sources and filters)
- ( Highlight different aspects
  - Can combine into false colored but highly informative images





#### Spreadsheets and browsers

#### ( Display, manipulate data

- Dynamic content
- User defined operations

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BSC-CNS

Center Centro Nacional de Supercomputación

#### A "different" view on performance analysis and tools

#### ( Behavioral structure vs. syntactic structure

- Algorithmic and performance
- In space and time

#### ( Variability

- Multimodal distributions
- Variability + synchronization  $\rightarrow$  critical non linear effects

( Flexibility to let analyst navigate the captured data and gain as much insight as possible from as few application runs as possible.



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#### Paraver

PATC Parallel Programing Workshop Oct 14-18 2013

- ( A browser ...
- ( ... to manipulate (visualize, filter, cut, combine, ...) ....
- ( ... sequences of time-stamped events ...
- ( ... with a multispectral philosophy ...
- ( ... and a mathematical foundation ...
- (( ... that happens to be mainly used for **performance analysis**



#### Trace

#### ( Sequence of time stamped records

- Punctual events
  - Something happened: when and where (object/entity: ... thread)
  - One record per specific information (encoded as a type and a value)
    - About the event
    - About the interval from the previous event till this one (i.e. hardware counts,...)
- Relations between objects (... communications)
  - Source and sink
  - Attributes (... size, tag)
- Separate numeric (.prv) and symbolic (.pcf) files
- ( Only information derived from captured events and data can be reported.
  - Trivial but ... often forgotten



#### Extrae

#### ( Major BSC instrumentation package

#### ( When / where

- Parallel programming model runtime
  - MPI, OpenMP, pthreads, OmpSs, CUDA, OpenCL, MIC...
  - API entry/exit, OpenMP outlined routines
- Selected user functions
- Periodic samples
- User events

#### ( Additional information

- Counters
  - PAPI
  - Network counters
  - OS counters
- Link to source code
  - Callstack



#### How does Extrae intercept your app?

#### ( LD\_PRELOAD

- Works on production binaries
- Specific library for each combination of runtimes
- Does not require knowledge on the application

#### Programming Library model Serial libseqtrace Pure MPI libmpitrace[f]<sup>1</sup> Pure OpenMP libomptrace Pure Pthreads libpttrace CUDA libcudatrace MPI + OpenMP libompitrace[f]<sup>1</sup> MPI + Pthreads libptmpitrace[f]<sup>1</sup> Mpi + CUDA libcudampitrace[f] 1

<sup>1</sup> for Fortran codes

#### ( Dynamic instrumentation

- Works on production binaries
- Just specify functions to be instrumented.
- ( Other possibilities
  - Link instrumentation library statically (i.e., PMPI @ BG/Q, ...)
  - OmpSs (instrumentation calls injected by compiler + linked to library)



Based on DynInst U.Wisconsin/U.Maryland

#### How to use Extrae?

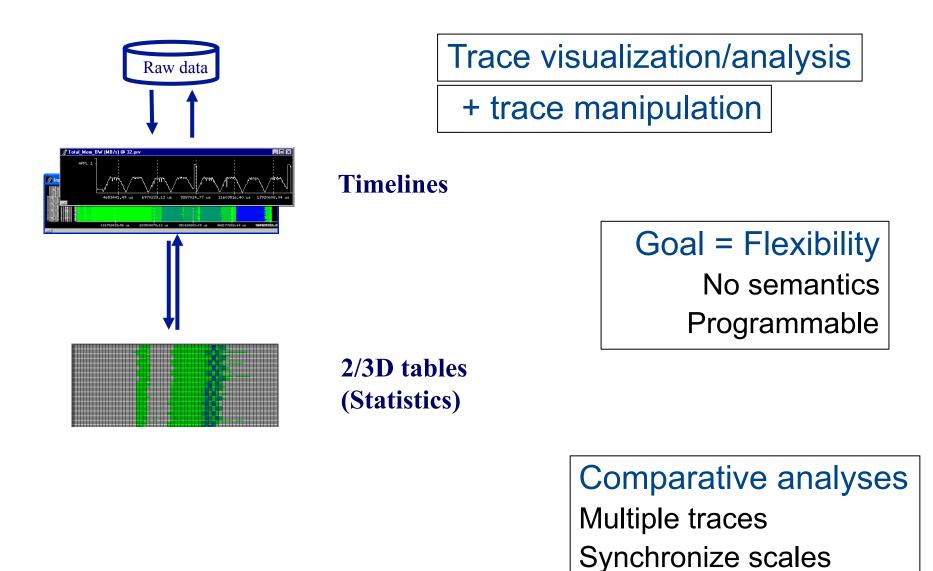
- ( Adapt job submission script
  - Specify LD\_PRELOAD library and xml instrumentation control file
- ( Specify the data to be captured in the .xml instrumentation control file
- ( Run and get the trace ...

Extrae 2.3.4 User's Guide available in <u>http://www.bsc.es/computer-sciences/performance-tools/documentation</u>

Default control files and further examples within installation in \$EXTRAE\_HOME/share/example



#### Paraver – Performance data browser





#### Paraver mathematical foundation

#### ( Every behavioral aspect/metric described as a function of time

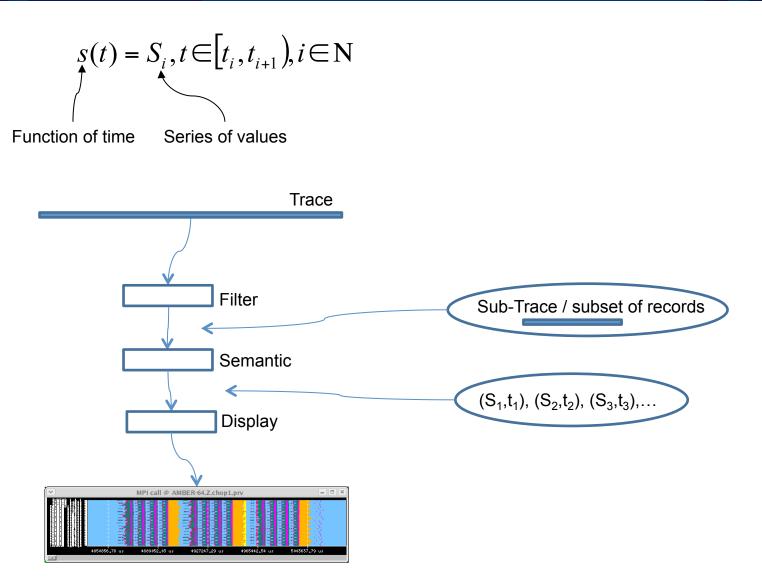
- Possibly aggregated along
  - the process model dimension (thread, process, application, workload)
  - The resource model dimension (core, node, system)
- Language to describe how to compute such functions of time (GUI)
  - Basic operators (from) trace records
  - Ways of combining them

#### ( Those functions of time can be rendered into a 2D image

- Timeline
- ( Statistics can be computed for each possible value or range of values of that function of time
  - Tables: profiles and histograms



#### Paraver mathematical foundation





#### ( Each window displays one view

- Piecewise constant function of time

State, user function, outlined routine

$$s(t) = S_i, i \in \left[t_i, t_{i+1}\right)$$

 $S_i \in \{0, 1\}$ 

 $S_i \in R$ 

 $S_i \in [0, n] \subset N, \quad n < \infty$ 

- Logical
  - In specific user function, In MPI call, In long MPI call
- Numerical

( Types of functions

Categorical

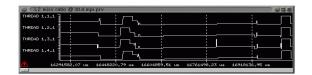
 IPC, L2 miss ratio, Duration of MPI call, duration of computation burst

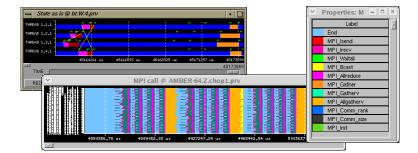


#### Timelines

#### ( Representation

- Function of time
- Colour encoding





- Not null gradient
  - Black for zero value
  - Light green → Dark blue

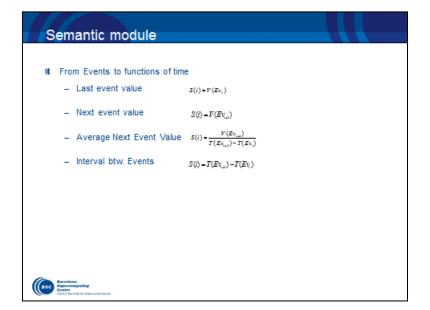


#### ( Non linear rendering to address scalability

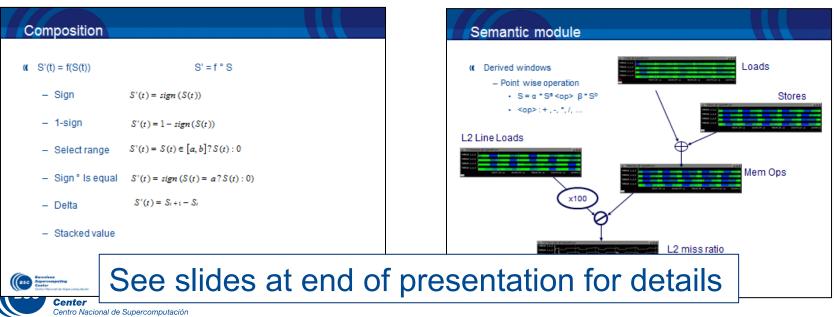
J. Labarta, et al.: "Scalability of tracing and visualization tools", PARCO 2005



#### **Basic functions of time**



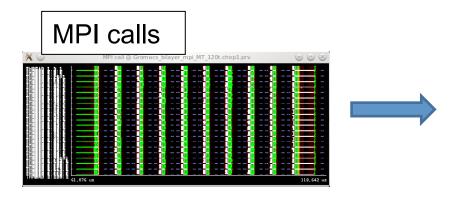
Semantic module	
( From communication rec	ords to functions of time
<ul> <li>Send Bytes</li> </ul>	$s(t) = \sum_{j} Sz(C_j), j \mid (T_s(C_j) < t) \land (T_s(C_j) > t) \land (Dir(C_j) - send)$
- Send Bandwidth	$s(t) = \sum_{j} \frac{\Im z(C_{j})}{T_{z}(C_{j}) - T_{z}(C_{j})}, j \mid (T_{z}(C_{j}) < t) \land (T_{z}(C_{j}) > t) \land (Dir(C_{j}) - send)$
<ul> <li>Msgs in transit</li> </ul>	$s(t) - \sum_{j} sign(j), j \mid (T_s(C_j) < t) \land (T_k(C_j) > t) \land (Dir(C_j) \longrightarrow send)$
- Recv. Bandwidth	$s(t) = \sum_{j} \frac{S_{t}(C_{j})}{T_{x}(C_{j}) - T_{x}(C_{j})}, j \mid (T_{x}(C_{j}) < t) \land (T_{x}(C_{j}) > t) \land (Dir(C_{j}) \longrightarrow recv)$
<ul> <li>Rec. Negative Msgs</li> </ul>	$s(t) - \sum_{j} sign(j), j \mid (T_{x}(C_{j}) < t) \land (T_{x}(C_{j}) > t) \land (Dir(Cj)recv)$
<ul> <li>Comm. Partner</li> </ul>	$s(t) = Partner(C_j), j \mid (T_x(C_j) < t) \land (T_x(C_j) > t)$
<ul> <li>Bytes btw. Events</li> </ul>	$S(t) = \sum_{j} Sa(C_j), j \mid T_s(C_j) \in [T(Ev_i), T(Ev_{i+1})] \lor T_s(C_j) \in [T(Ev_i), T(Ev_{i+1}))$
Exercisions Approximations Control Maccount de Togenoumpodecide	



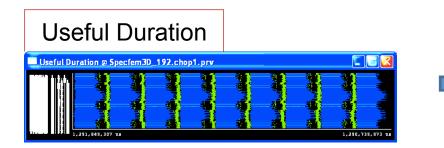
(

#### Tables: Profiles, histograms, correlations

#### ( From timelines to tables

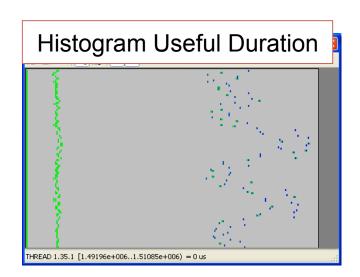


	call	<u>s p</u>		ilayer_mpi_M1	T_120t.	chop1.prv				
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THREAD 1.113.1	67.6081 %	0.0682 %	9.9182 %	2.5777 %	1.7698 %	5	5.1676 %	0.5934 %	0.1465 %	
THREAD 1.114.1	42.8434 %		20.5621 %	1.1947 %	1.0400 %	7	7.7056 %	-	-	
THREAD 1.115.1	68.6127 %	0.0707 %	9.6223 %	2.2589 %	2.0177 %	5	5.9825 %	0.5249 %	0.0297 %	
THREAD 1.116.1	74.6039 %	0.0531%	9.6084 %	2.8813 %	2.5593 %	2	2.9286 %	0.5095 %	0.0483 %	
THREAD 1.117.1	74.3733 %	0.0691%	9.7012 %	2.8517 %	2.5240 %		🗙 🌍 2DP	- MPI call profile @	Gromacs_bilayer_mpi_	MT_120t.c 🕑
THREAD 1.118.1	72.7770 %	0.0545 %	9.5489 %	2.8489 %	2.5353 %		C D 30	Q 😫 🔳	H H II ½	
THREAD 1.119.1	66.7994 %	0.0682 %	10.0674 %	2.4206 %	1.9741 %					
THREAD 1.120.1	43.7224 %		20.5273 %	1.1912 %	1.0175 %					
Total	8,012.4546 %	7.3174 %	1,370.5276 %	288.6168 %	253.0137 %	54				
Average	66.7705 %	0.0690 %	11.4211 %	2.4051%	2.1084 %					
Maximum	75.6821 %	0.4390 %	21.2505 %	2.9706 %	2.6369 %					
Minimum	40.5200 %	0.0129 %	8.8583 %	1.1489 %	1.0077 %					
StDev	11.3685 %	0.0474 %	4.0613 %	0.5984 %	0.5406 %					
Avg/Max	0.8822	0.1572	0.5374	0.8096	0.7996					

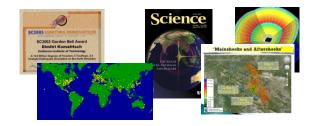


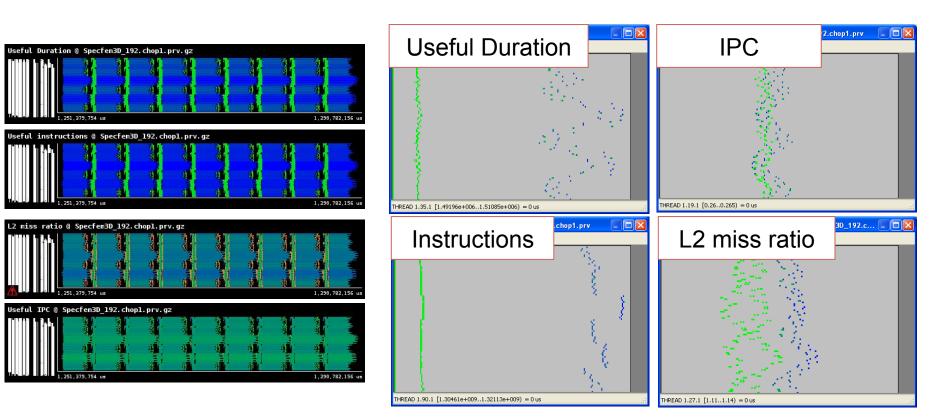


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#### Analyzing variability through histograms and timelines

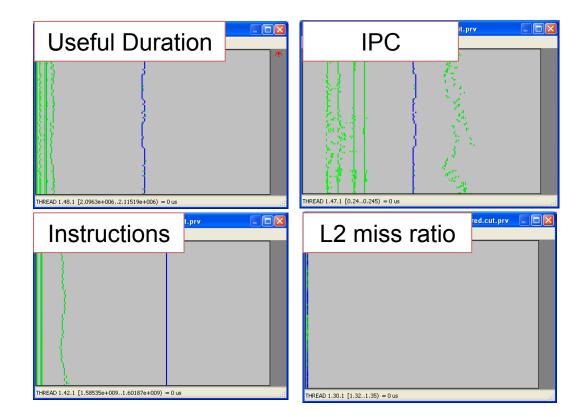






#### Analyzing variability through histograms and timelines

( By the way: six months later ....

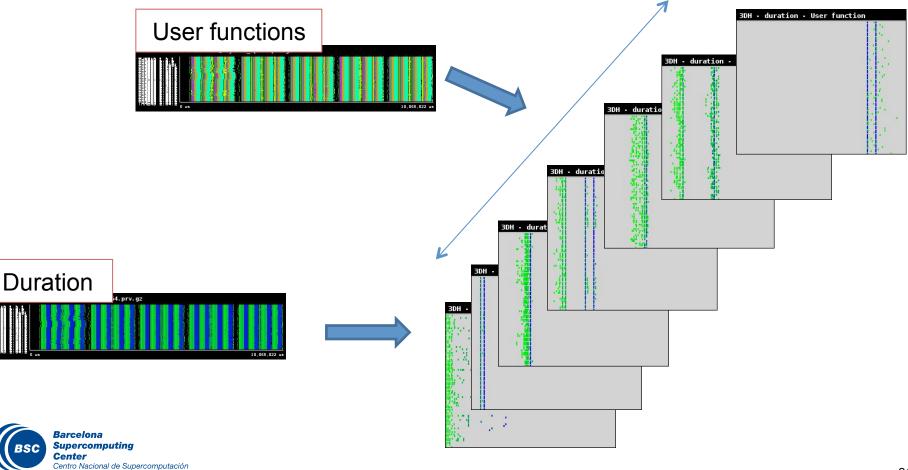




#### **3D** Tables

#### ( An additional control dimension

- One table (plane) per value (or range) of 3D window
- i.e. histogram of duration of each function



#### From tables to timelines

- ( Where in the timeline do the values in certain table columns appear?
  - ie. want to see the time distribution of a given routine?

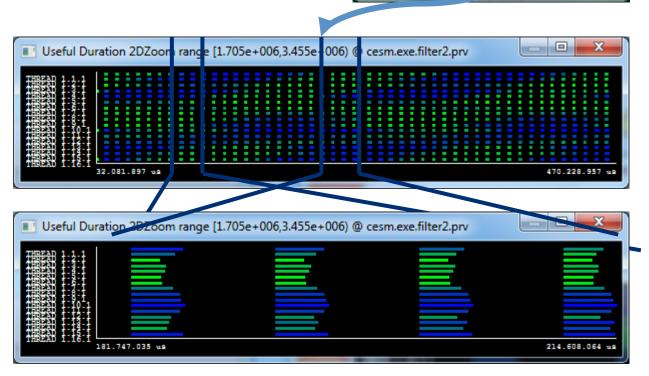


#### Variability ... is everywhere

- (CESM: 16 processes, 2 simulated days
- ( Histogram useful computation duration shows high variability
- ( How is it distributed?

#### ( Dynamic imbalance

- In space and time
- Day and night.
- Season ? 🙂





2DH - Useful Duration ...

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THREAD 1.11.1 [2,555e+006.2,58e+006) = 0 u

x

1/E

#### Other mechanisms integrated in the GUI

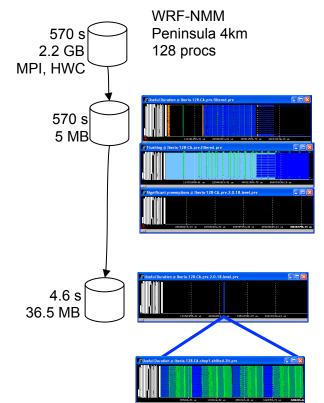
#### ( Trace manipulation

- Cut
- Filter
- ( Performance analytics
  - Clustering
  - Folding
  - Tracking
- ( Executing external commands and tools
  - BSC Tools
  - Scripts
  - External tools



#### ( Data handling/summarization capability

- Filtering
  - Subset of records in original trace
  - By duration, type, value,...
  - Filtered trace IS a paraver trace and can be analysed with the same cfgs (as long as needed data kept)
- Cutting
  - All records in a given time interval
  - Only some processes
- Software counters
  - Summarized values computed from those in the original trace emitted as new even types
  - #MPI calls, total hardware count,...







#### External commands and tools

#### ( Execute external commands ...

- Predefined: Dimemas, Stats,...
- User specified binaries or scripts
- ( ... specifying arguments
  - Trace
  - Command specific arguments

#### ( Paramedir

- Non graphical version of Paraver
- Reads trace, applies standard cfgs, writes ASCII output (table,...)
- ( Scripts can use paramedir, Dimemas, clustering ... in parametric sweeps, search/optimization loops,...



#### Executing external commands

#### ( Example: basic\_analysis.py

Timing:		
Elapsed duration	= 3.887 s	
Ideal time	= 3.223 s	
Compute time	= 2.637952 s	Basic c
MPI time	= 1.24930663 s	Poin
		A
Parallel Efficiency:		Ba
Total Efficiency	= 0.679	A
Load Balance	= 0.950	Ba
Micro Load Balance	= 0.859	Colle
Transfer	= 0.829	N
Bweff	= 0.814	Av
Leff	= 1.000	M
		Ba
Load balance:		
Time Load Balance	= 0.950	Inter - Ir
Instructions Load Balan		Bytes
Cycles load balance	= 0.950	Lo
IPC Load Balance	= 0.960	R
		Num
Computational analysis:	5 000000	Lo
Total useful instructions	= 5.399636e+11	R
Average useful instructions		
Instructions based microloa	d balance/sync = 0.924	
sequential performance:		
Average MIPS	= 3199	
Average IPC	= 1.050	

Basic communication s Point to point:	statistics:
· · ·	of calls = 554.0
Balance in numb	er of calls = 1.0
Average bytes pe	er process= 728596480.0
Balance in bytes	= 0.990
Collectives:	
Num collective ca	alls = 6.0
Average bytes pe	er call = 6.670
Max bytes per ca	all = 8.000
Balance in bytes	= 1.000
Inter - Intra node comr	nunication statistics:
Bytes sent (MB):	
Locally	= 22229.811
Remotely	= 24645.730
Number of sends:	
Locally	= 3520.000
Remotely	= 6592.000

64Proc – 8 MPI by node



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### **Performance Analytics**

PATC Parallel Programing Workshop Oct 14-18 2013

#### **Performance Analytics**

#### ( Dominant practice

- We focus a lot on capturing a lot of data
- but we present either everything or first order statistics
- and require new experiments without squeezing the potential information from the previous one
- ( Need for performance analytics
  - Leveraging techniques from data analytics, mining, signal processing, life sciences,...
  - towards insight
  - And models

#### ( Some techniques worked on at BSC

- Spectral analysis
- Clustering
- Folding
- Simulation (Dimemas)



Spectral analysis

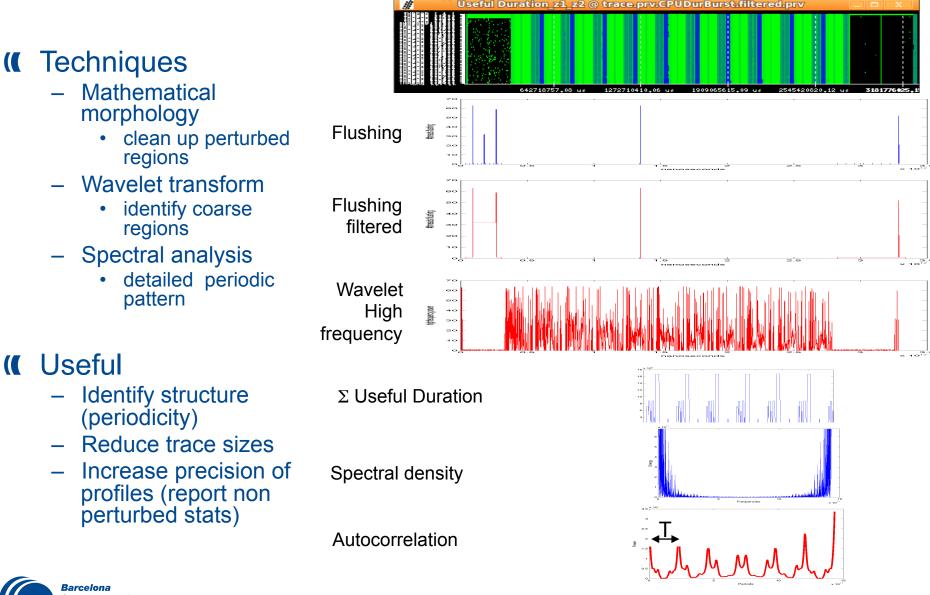


#### **Repetitive behavior**

- ( Applications tend to have Iterative behavior
  - Detailed analysis can be applied to a few such iterations
- ( Metrics in Paraver are functions of time
  - Natural target for signal processing techniques to automatically detect such iterative structure
  - Relevant functions of time at global application level
    - # processes in MPI, outside MPI, ...
    - Sum of useful burst duration
      - Semantic: high when many processes are in the middle of very long computation bursts
      - Does capture repetitive structure of application

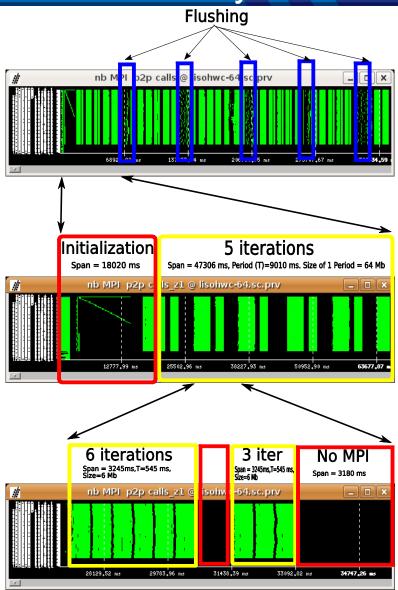


#### Signal processing applied to performance analysis



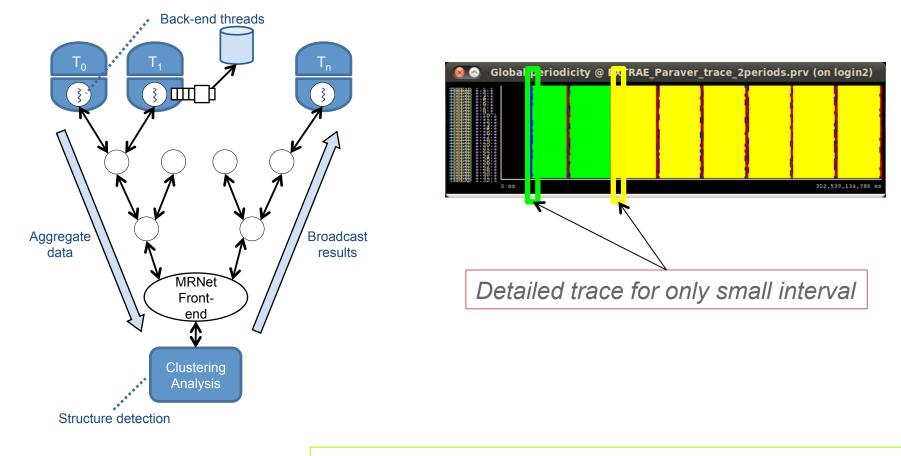
#### Signal processing applied to performance analysis

## ( Hierarchical structure identification





#### Scalability: online automatic interval selection



"G. Llort et all, "Scalable tracing with dynamic levels of detail" ICPADS 2011



### Clustering



#### Clustering: analysis of performance @ serial computation bursts

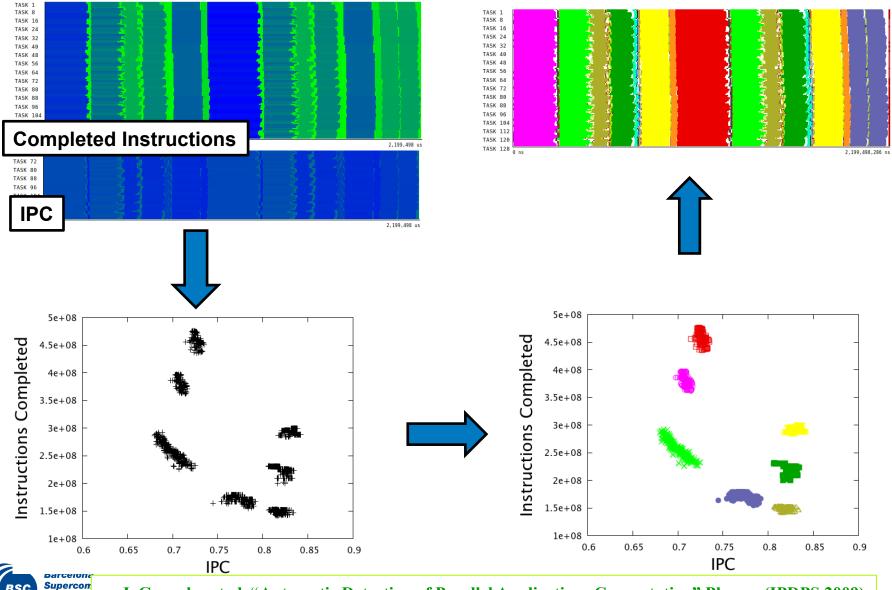
#### ( Identification of computation structure

- CPU burst = region between consecutive runtime (MPI, OpenMP) calls
  - Described with performance hardware counters
  - Associated with call stack data
- **((** Scatter plot on some relevant metrics
  - Instructions: idea of computational complexity, computational load imbalance,...
  - IPC: Idea of absolute performance and performance imbalance
  - Automatically Identify clusters



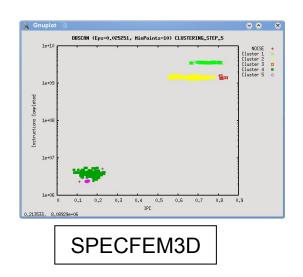
# Using Clustering to identify structure

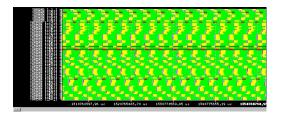
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J. Gonzalez et al, "Automatic Detection of Parallel Applications Computation" Phases. (IPDPS 2009)

# Performance @ serial computation bursts





Asynchronous SPMD

# Balanced #instr variability in IPC



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### Trace 'Iberia-128-CA.chop1.1it' 5e+008 4.5e+008 3.5e+008 3.5e+008 2.5e+008 2.5e+008 1.5e+008 1.5e+008 0.6 0.65 0.7 0.75 0.8 0.85 0.9 0.95 1 IPC WRF 128 cores

DBSCAN (Eps=0.015, MinPoints=10)

Complet

GROMACS

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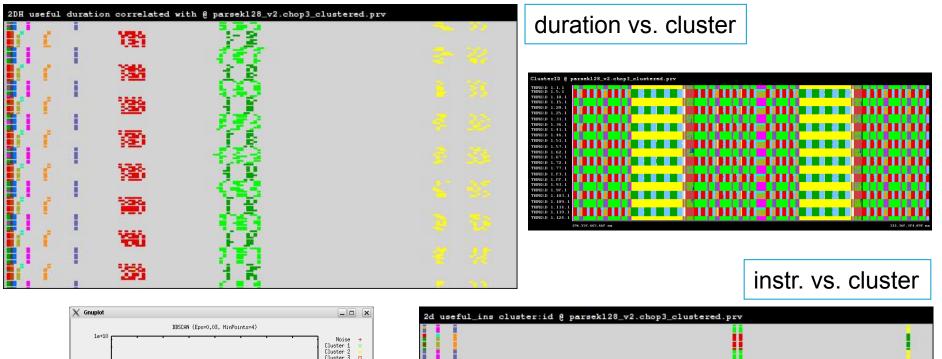
SPMD Repeated substructure

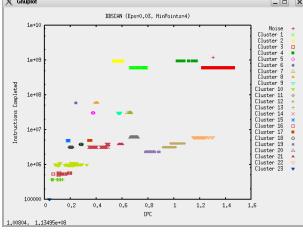
Coupled imbalance

MPMD structure

Different coupled imbalance trends

# Example PARSEK (DEEP)

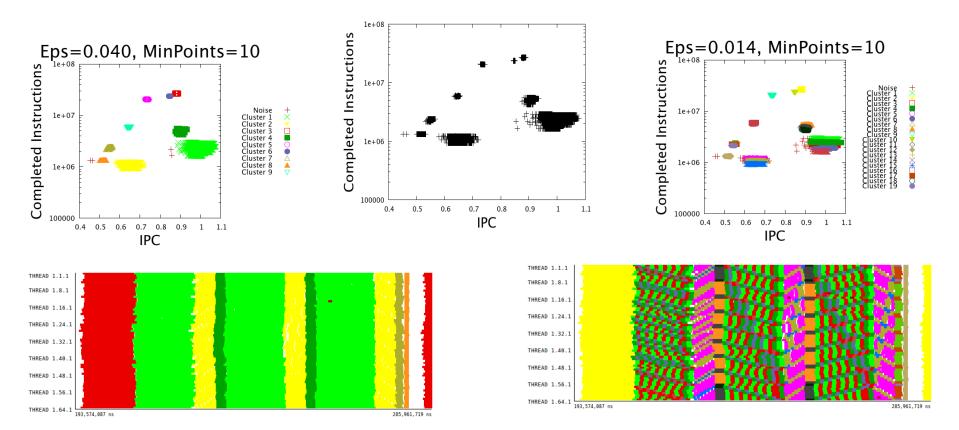








# Structure quality?



## ( How many clusters?

- ( Which is better?
  - The two describe interesting structure
  - Typically SPMD would be a good first level of description for most apps



# (Clustering enables focusing the analysis and opens many different uses

- Analysis
  - Detection of application structure
- Precise instantaneous metrics
  - correlation of sampled data to generate instantaneous metric evolution
- Dimemas:
  - Separate speed factors per cluster on predictive simulations
- Track the evolution of application behaviour effects



. . .



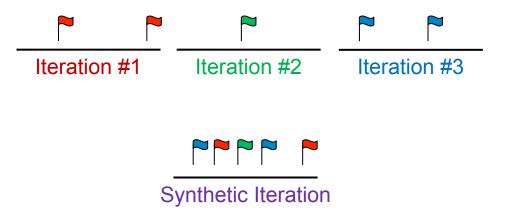


# Mixing instrumentation and sampling ...

# ( ... to get extreme detail with minimal overhead

# ( Different roles

- Instrumentation delimits regions
- Sampling report progress within region



Harald Servat et al. "Detailed performance analysis using coarse grain sampling" PROPER@EUROPAR, 2009



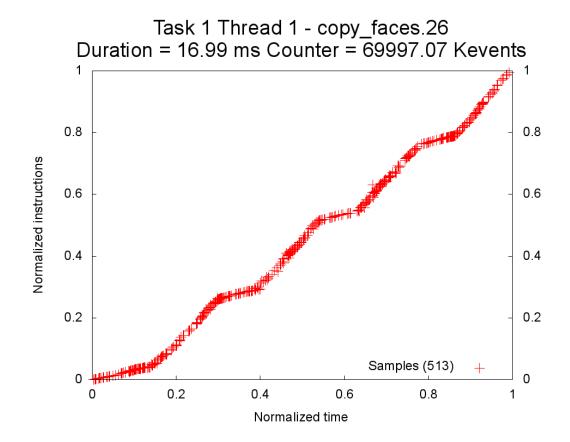
Barcelona Supercomputing Harald Servat et al. "Unveiling Internal Evolution of Parallel Application Computation Phases" ICPP 2011

# Folding hardware counters

Barcelona Supercomputing

entro Nacional de Supercomputación

• Instructions evolution for routine copy\_faces of NAS MPI BT.B



• Red crosses represent the folded samples and show the completed instructions from the start of the routine

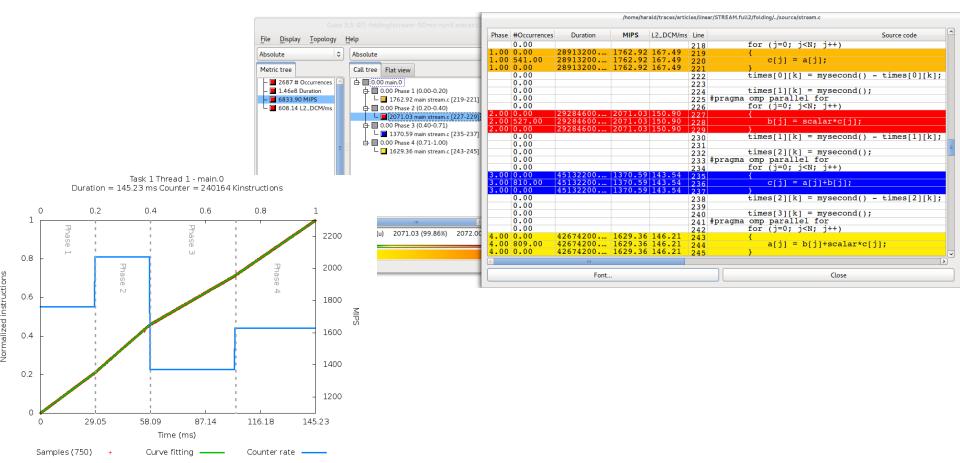
• Green line is the curve fitting of the folded samples and is used to reintroduce the values into the tracefile

• Blue line is the derivative of the curve fitting over time (*counter rate*)

# Folding $\rightarrow$ profiles of rates and ratios

# (Call-site sampling information is folded

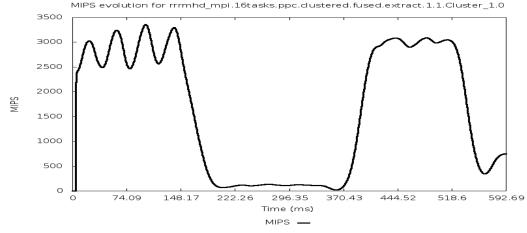
- Correlation between hwc and call-sites
- GVIM/CUBE add-on to show performance within source code
  - Timeless but useful to point performance issues



# ( Performance of a sequential region = 2000 MIPS

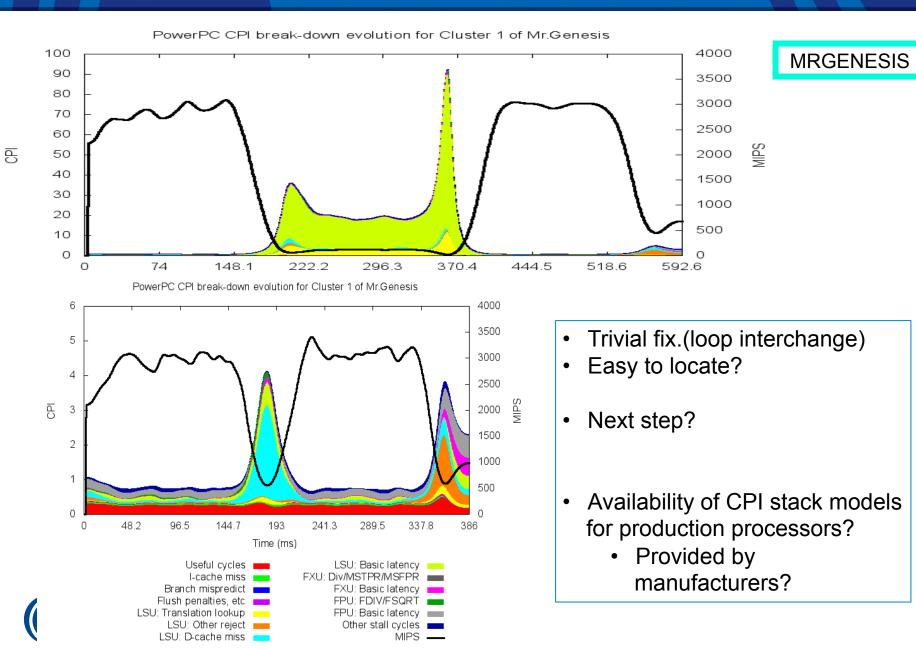
Is it good enough?

# Is it easy to improve?

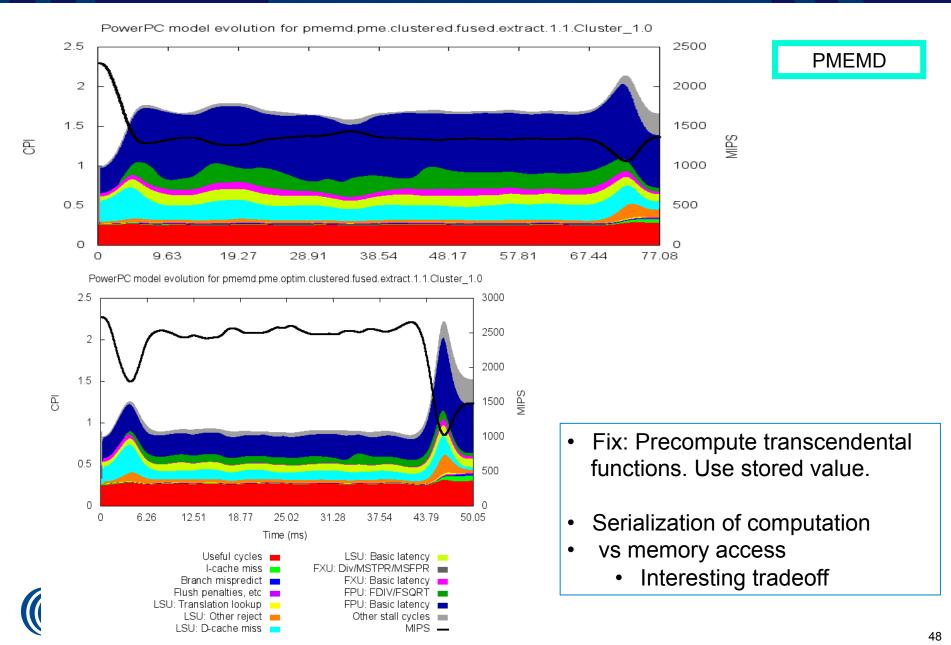


Barcelona Supercomputing Center Centro Nacional de Supercomputación

# Instantaneous CPI stack

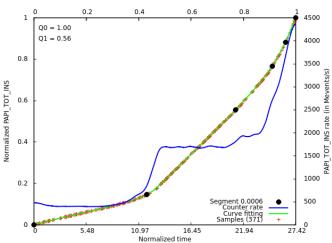


# Instantaneous CPI stack



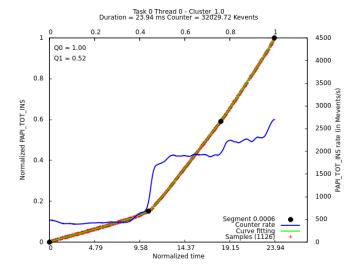
# **Correlating counters**

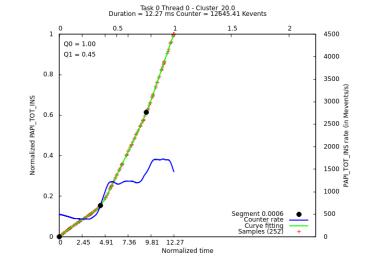






- Between processes
- 3 Algorithmic phases
- Impact of multicore sharing

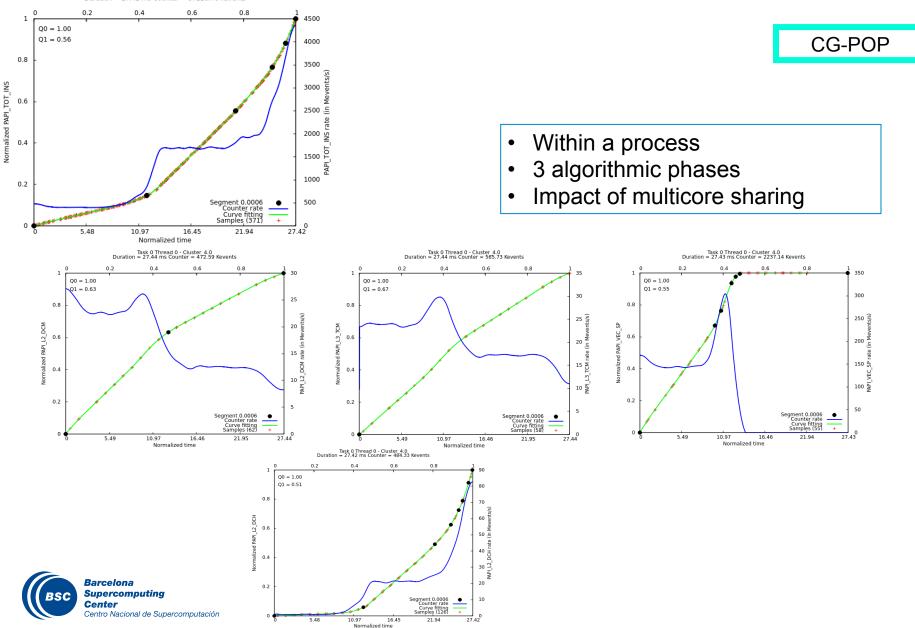






# **Correlating counters**





50

### www.bsc.es



Barcelona Supercomputing Center Centro Nacional de Supercomputación

# Methodology

PATC Parallel Programing Workshop Oct 14-18 2013

# Help generate hypotheses

# Help validate hypotheses

Qualitatively

Quantitatively



# **Tools: mechanisms and navigation**

( The tools are instruments to address the questions

# ( Need to know how to use

- First learn to navigate with the tool
  - ( How to load configurations, zoom, fit coloring scales
  - ( How to read
  - ( How to generate timelines form tables

## ( Second

( Develop a basic understanding of the process of generation of the timelines and histograms.

## Paraver Tutorial: Introduction to Analysis with Paraver (MPI)



# First steps

- ( Parallel efficiency percentage of time invested on computation
  - Identify sources for "inefficiency":
    - load balance
    - Communication /synchronization
- ( Serial efficiency how far from peak performance?

– IPC

- ( Scalability code replication?
  - Total #instructions
- ( Behavioral structure? Variability?

### Paraver Tutorial: Introduction to Paraver and Dimemas methodology



# Presenting application performance

- ( Factors modeling parallel efficiency
  - Load balance (LB)
  - Communication
    - Micro load balance (μLB) or serialization

( Factors describing serial behavior

Computational complexity: #instr

• Transfer

– Performance: IPC

$$CommEff$$
  
$$\eta_{\parallel} = LB * \mu LB * Transfer$$

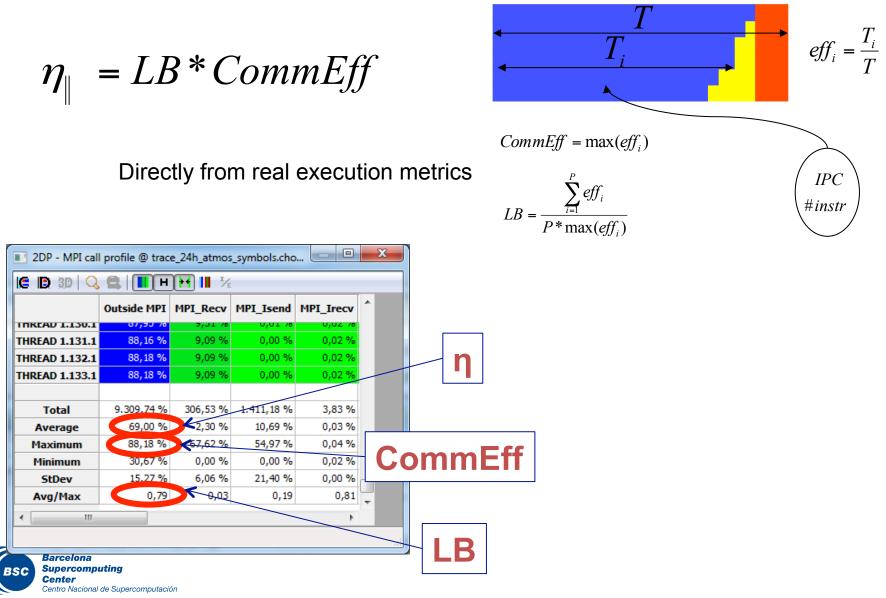
$$\eta_{instr} = \frac{\#instr_0}{\#instr_P}$$

$$\eta_{IPC} = \frac{IPC_P}{IPC_0}$$





M. Casas et al, "Automatic analysis of speedup of MPI applications". ICS 2008.



# Scaling model

# ( Dimemas simulation with ideal target

- Latency =0; BW =  $\infty$ 

$$CommEff = \mu LB * Transfer$$

◄	$T_{ideal}$	
	- <b>-</b> -	
	 · · · ,	

Migrating/local load imbalance Serialization

$$\mu LB = \frac{\max(T_i)}{T_{ideal}} \qquad Transfer = \frac{T_{ideal}}{T}$$

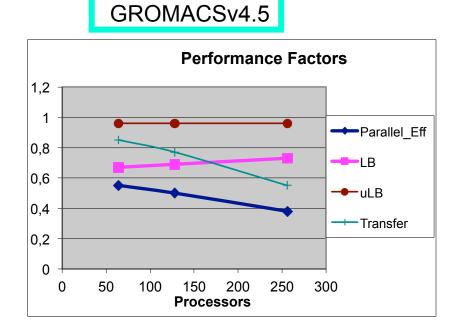
2DP - MPI call profile @ trace_24h_atmos_symbols.cho								
	Outside MPI	MPI_Recv	MPI_Isend	MPI_Irecv	^			
TREAD 1.130.1	07,53 /0	5,31 /0	0,01 /8	0,02 /0				
THREAD 1.131.1	88,16 %	9,09 %	0,00 %	0,02 %				
THREAD 1.132.1	88,18 %	9,09 %	0,00 %	0,02 %				
THREAD 1.133.1	88,18 %	9,09 %	0,00 %	0,02 %				
Total	9.309,74 %	306,53 %	1.411,18 %	3,83 %				
Average	69,00 %	2,30 %	10,69 %	0,03 %				
Maximum	88,18 %	<b>67,62 %</b>	54,97 %	0,04 %				
Minimum	30,67 %	0,00 %	0,00 %	0,02 %	LUL	-В		
StDev	15,27 %	6,06 %	21,40 %	0,00 %				
Avg/Max	0,79	0,03	0,19	0,81	-			
۰ III				+				
					.ti			



# Scaling model

- ( Fundamental behavior
- ( Explains bottleneck ...
- ( ... how they migrate ...
- ( ... and combined effect





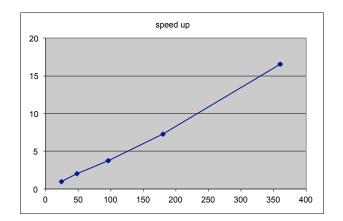


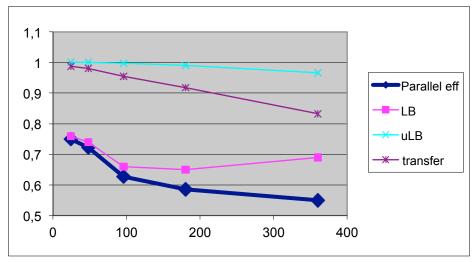
# Modelling efficiency

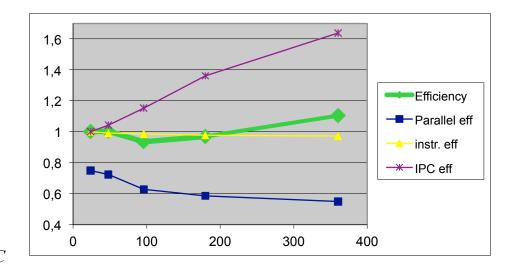
$$\eta_{\parallel} = LB * \mu LB * Transfer$$

CG-POP mpi2s1D - 180x120

Good scalability !! Should we be happy?









# **BSC** Tools web site

# ( <u>www.bsc.es/paraver</u>

- downloads
  - Sources / Binaries
  - Linux / windows / MAC
- documentation
  - Training guides
  - Tutorial slides

# ( Getting started

- Start wxparaver
- Help  $\rightarrow$  tutorials and follow instructions
- Follow training guides
  - Paraver introduction (MPI): Navigation and basic understanding of Paraver operation





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# THANKS

### www.bsc.es



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# **Detailed material**

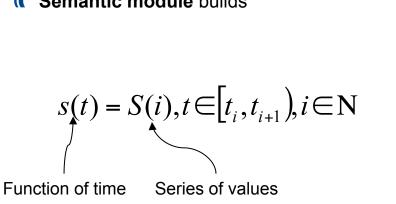
PATC Parallel Programing Workshop Oct 14-18 2013

# **Semantic Module**

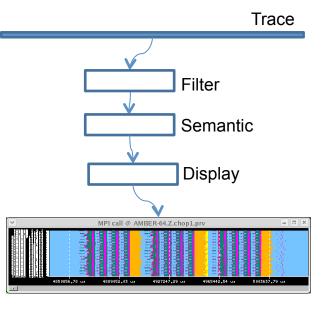


# **Basic functions of time**

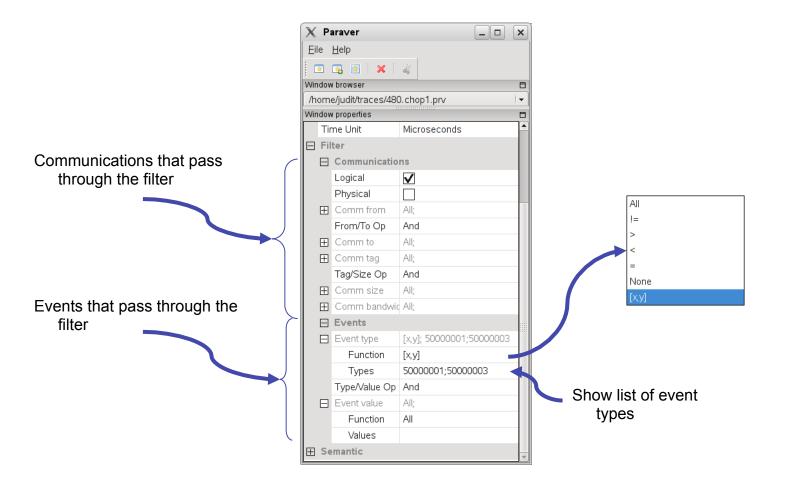
- ( The filter module presents a subset of the trace to the semantic module. Each thread th is described by
  - A sequence of events  $Ev_i, i \in N$ , states  $St_i, i \in N$  and communications  $C_i, i \in N$
  - For each event let  $T(Ev_i)$  be its time and  $V(Ev_i)$  its value
  - For each state let  $T_s(St_i)$  be its start time  $T_e(St_i)$  its stop time and  $V(St_i)$  its value
  - For each Communication let  $T_s(C_i)$  be its send time,  $T_R(C_i)$  its receive time,  $Sz(C_i)$  its size.
  - $Partner(C_i)$  and  $Dir(C_i) \in \{send, recv\}$  identify the partner process and direction of the transfer





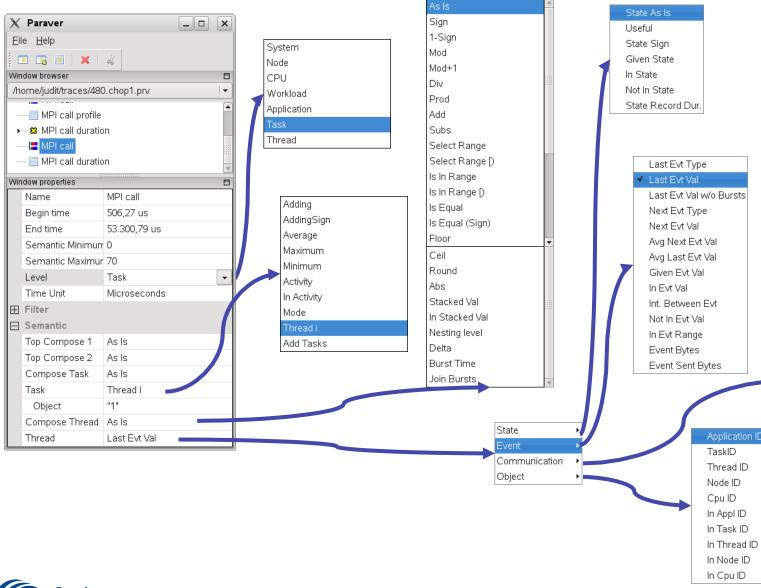


#### ( Semantic module builds





# Semantic module: Control



#### Last Tag

Comm Size Comm Recv. Partner Comm Partner Last Send Dur. Next Recv Dur. Send Bytes in Transit Send Messages in Transit Send BandWidth Recv Bytes in Transit Recv Messages in Transit Recv Messages in Transit Recv Negative Messages Recv Negative Bytes Number Of Receives



# Semantic module

- ( From Events to functions of time
  - Last event value  $S(i) = V(Ev_i)$
  - Next event value  $S(i) = V(Ev_{i+1})$
  - Average Next Event Value  $S(i) = \frac{V(Ev_{i+1})}{T(Ev_{i+1}) T(Ev_i)}$
  - Interval btw. Events  $S(i) = T(Ev_{i+1}) T(Ev_i)$



# Semantic module

- ( From communication records to functions of time
  - Send Bytes
  - Send Bandwidth
  - Msgs in transit

Recv. Bandwidth

Rec. Negative Msgs

$$s(t) = \sum_{j} \frac{Sz(C_j)}{T_R(C_j) - T_S(C_j)}, j \mid (T_S(C_j) < t) \land (T_R(C_j) > t) \land (Dir(C_j) == send$$

== recv

$$s(t) = \sum_{j} sign(j), j \mid (T_s(C_j) < t) \land (T_R(C_j) > t) \land (Dir(C_j) == send)$$

 $s(t) = \sum Sz(C_j), j \mid (T_s(C_j) < t) \land (T_R(C_j) > t) \land (Dir(C_j) = send)$ 

$$s(t) = \sum_{j} \frac{Sz(C_j)}{T_R(C_j) - T_S(C_j)}, j \mid (T_S(C_j) < t) \land (T_R(C_j) > t) \land (Dir(C_j))$$

$$s(t) = \sum_{j} sign(j), j \mid (T_{R}(C_{j}) < t) \land (T_{S}(Cj) > t) \land (Dir(Cj) == recv)$$

$$s(t) = Partner(C_j), j \mid (T_s(C_j) < t) \land (T_R(C_j) > t)$$

$$S(i) = \sum_{j} Sz(C_{j}), j \mid T_{S}(C_{j}) \in [T(Ev_{i}), T(Ev_{i+1})] \lor T_{R}(C_{j}) \in [T(Ev_{i}), T(Ev_{i+1}))$$

- Comm. Partner
- Bytes btw. Events



\_

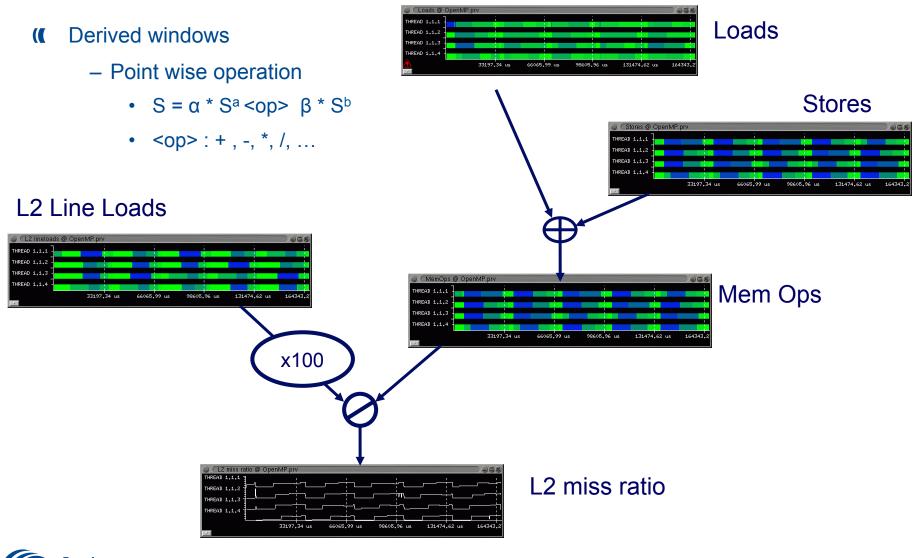
—

# Composition

- (( S'(t) = f(S(t))  $S' = f^{\circ} S$ 
  - Sign S'(t) = sign(S(t))
  - 1-sign S'(t) = 1 sign(S(t))
  - Select range  $S'(t) = S(t) \in [a,b]? S(t) : 0$
  - Sign ° Is equal S'(t) = sign(S(t) = a?S(t):0)
  - Delta  $S'(t) = S_{i+1} S_i$
  - Stacked value



# Semantic module

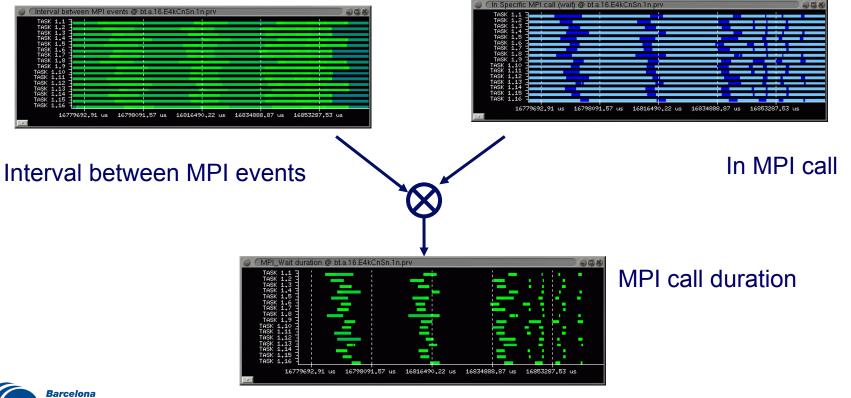




# Semantic module

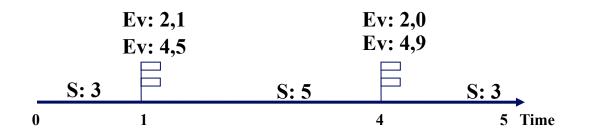
#### ( Derived windows

- Point wise operation
  - $S = \alpha * S^a < op > \beta * S^b$
  - <op>: + , -, \*, /, ...

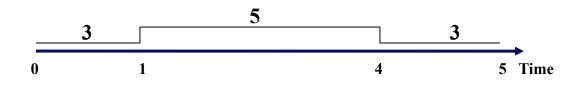


Scenter Centro Nacional de Supercomputación

# Semantic module: Examples



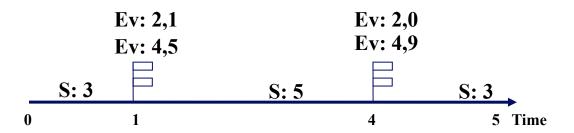
# ( Thread function: State as is



- Useful for
  - Global thread activity: computing, idle, fork/join, waiting,.....



### Semantic module: Examples



( Filter: type == 2

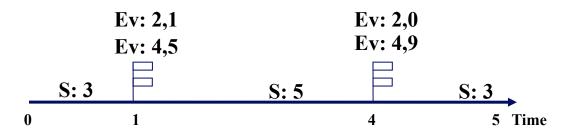
- Thread function: Last event value



- Useful for
  - In parallel region
  - Mutual exclusion
  - Variable values: iteration,....

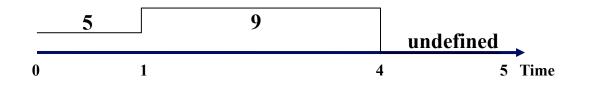


### Semantic module: Examples



( Filter: type == 4

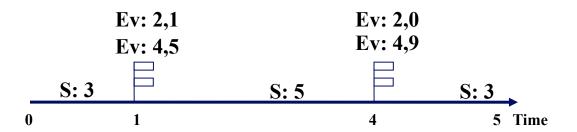
- Thread function: Next event value



- Useful for
  - Hwc events (TLB, L1 misses,...) within interval

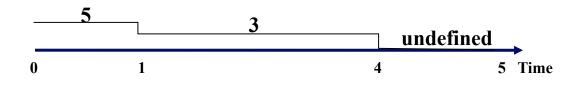


### Semantic module: Examples



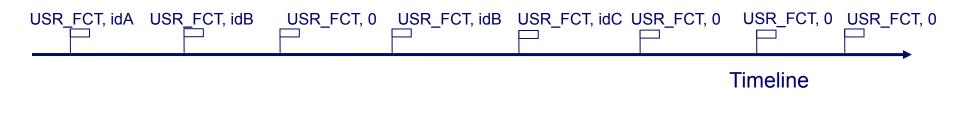
( Filter: type == 4

- Thread function: Average next event value

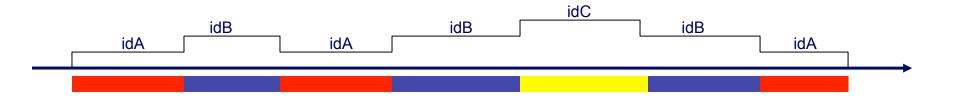


- Useful for
  - Hwc events (TLB, L1 misses,...) per time unit within interval





Filter: type == USR\_FCT
 Thread function: Last event value
 Compose: Stacked value

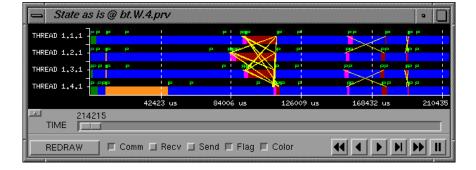


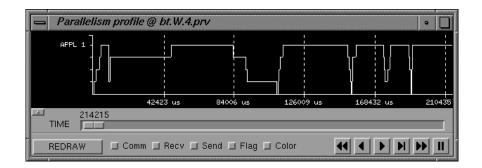
Useful for

#### Routine



### Semantic module perspective





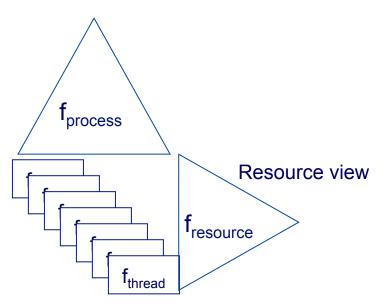
### ( Process model

 Thread, task, application, workload

# ( Resource model

- CPU, node, system

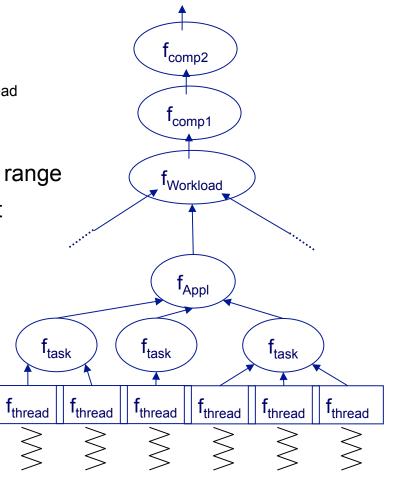
Process view





### Process model perspective

- Semantic value: S(t)
- S =  $f_{comp2} \circ f_{comp1} \circ f_{Workload} \circ f_{Application} \circ f_{task} \circ S_{thread}$
- Semantic functions
  - f<sub>comp2</sub>, f<sub>comp1</sub>: sign, mod, div, in range, select range
  - f<sub>Application</sub>, f<sub>Workload</sub> : add, average, max, select
  - f<sub>task</sub>: add, average, max, select
  - S<sub>thread</sub>: in state, useful, given state,
  - last event value,
  - next event value,
  - average next event value
  - interval between events, …



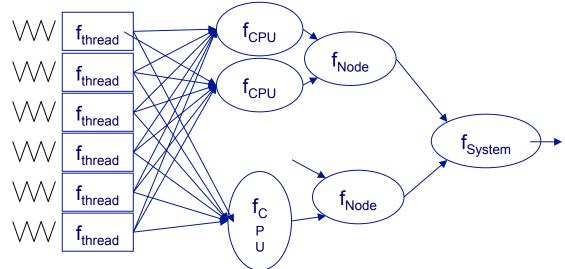


### **Resource model perspective**

• 
$$Sf_{resource} = f_{comp2} \circ f_{comp1} \circ f_{System} \circ f_{Node} \circ f_{CPU} \circ S_{thread}$$

Semantic functions

- f<sub>System</sub> : add, average, max, select
- f<sub>Node</sub> : add, average, max, select
- f<sub>CPU</sub>: active thread, select
- Sthread: in state, useful, given state, next event value, thread\_id





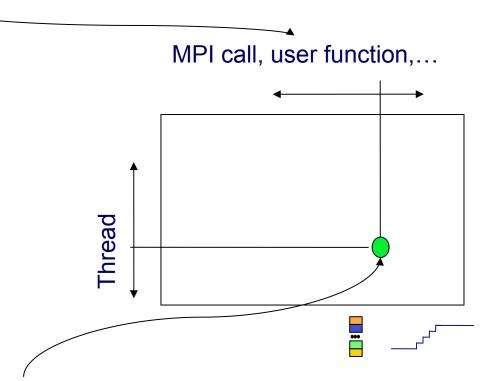
# **Analysis Module**



# How to read profiles

#### One columns per specific value of categorical Control window

X MPI profile @ Iberia-128-CA.chop1.1it.shifted.prv							
C	🗈 3D 🔍	R   🔳 🖡	+ <del>}+</del>     ½	Ē			
		End	MPI_lsend	MPI_lrecv	MPI_Wait	MPI_Allreduce	MPI_Comr
TH	IREAD 1.1.1	86,98 %	0,06 %	0,08 %	11,12 %	1,75 %	
тн	READ 1.2.1	88,29 %	0,10 %	0,10 %	9,95 %	1,56 %	
TH	IREAD 1.3.1	88,33 %	0,13 %	0,10 %	9,92 %	1,51 %	
ΤН	IREAD 1.4.1	89,75 %	0,10 %	0,09 %	8,62 %	1,44 %	
ΤН	IREAD 1.5.1	89,47 %	0,11 %	0,10 %	8,85 %	1,46 %	
TH	IREAD 1.6.1	88,76 %	0,12 %	0,09 %	9,54 %	1,48 %	
ΤН	IREAD 1.7.1	91,77 %	0,13 %	0,10 %	6,51 %	1,49 %	
ΤН	IREAD 1.8.1	90,23 %	0,06 %	0,08 %	8,13 %	1,50 %	
TH	IREAD 1.9.1	91,88 %	0,13 %	0,09 %	6,73 %	1,17 %	
TH	READ 1.10.1	93,24 %	0,18 %	0,11 %	5,41 %	1,05 %	
TH	READ 1.11.1	93,25 %	0,18 %	0,11 %	5,45 %	1,00 %	
тн	READ 1.12.1	94,63 %	0,17 %	0,11 %	4,16 %	0,93 %	
TH	READ 1.13.1	93,40 %	0,17 %	0,11 %	5,35 %	0,96 %	
TH	READ 1.14.1	94,99 %	0,20 %	0,11 %	3,77 %	0,93 %	
TH	READ 1.15.1	96,80 %	0,22 %	0,11 %	1,92 %	0,95 %	
TH	READ 1.16.1	95,73 %	0,12 %	0,09 %	2,99 %	1,06 %	
MPLWait     ■							



Value/color is a statistic computed for the specific thread when control window had the value corresponding to the column

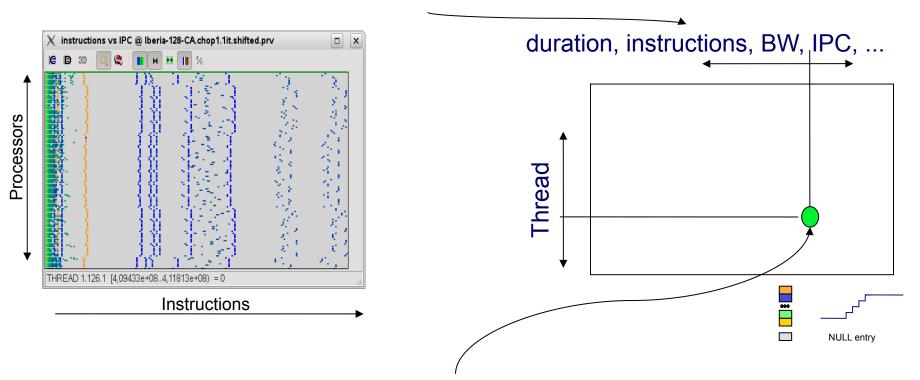
**Relevant statistics:** 

Time, %time, #bursts, Avg. burst time Average of **Data window** 



# How to read histograms

#### Columns correspond to bins of values of a numeric Control window



Value/color is a statistic computed for the specific thread when control window had the value corresponding to the column

**Relevant statistics:** 

Time, %time, #bursts, Avg. burst time Average of **Data window** 



### Tables

Single flexible quantitative analysis mechanism 

Let

- cw<sub>1</sub> and cw<sub>2</sub> two views we will call control views
- dw a view we will call data window
- For each control window we define a set of bins

 $bin_{i}^{cw} = [range_{i}^{cw}, range_{i+1}^{cw}]$   $range_{i+1}^{cw} = range_{i}^{cw} + delta^{cw}$ 

And the discriminator functions

> $\delta_i^{cw}(t) = ((S^{cw}(t) \in bin_i^{cw})?1:0)$  $\delta_{i,k}(t) = \delta_i^{cw_1}(t) * \delta_k^{cw_2}(t)$

For each window w

$$S_{th}^{w}(t) = S_{th}^{w}(i), t \in \left[t_{i}^{w}, t_{i+1}^{w}\right]$$

Identify regions with cw's within the (j,k) bin

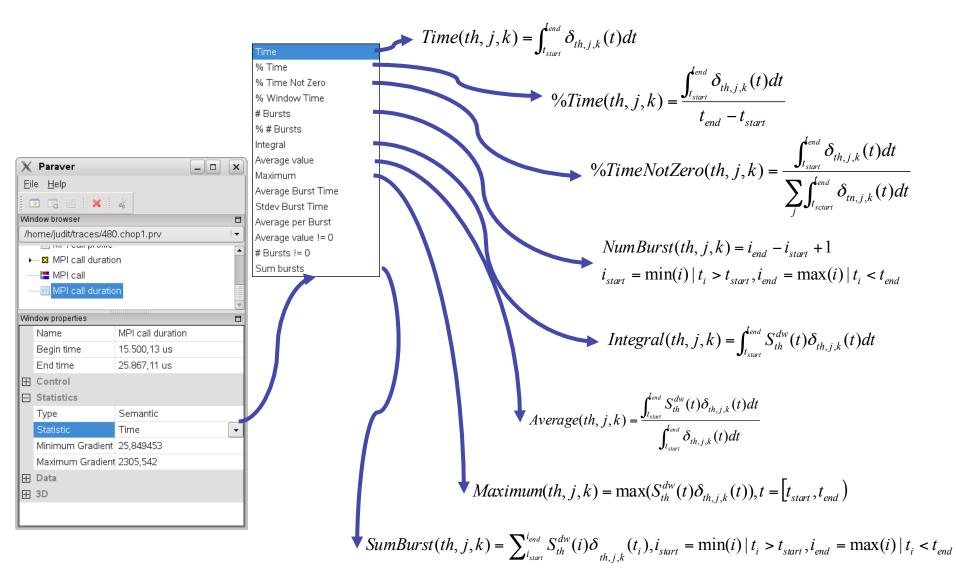
The 3D analysis module computes a cube (or plane in the case of 2D) of statistics

$$M(thread, j, k) = statistic(S_{th}^{dw}(t) * \delta_{th, j, k}(t))$$

Where the statistic can represent the average value, the number of intervals,....



### 2D analysis module





# **Distributed Configurations**



# (CFG

### \$PARAVER\_HOME/cfgs

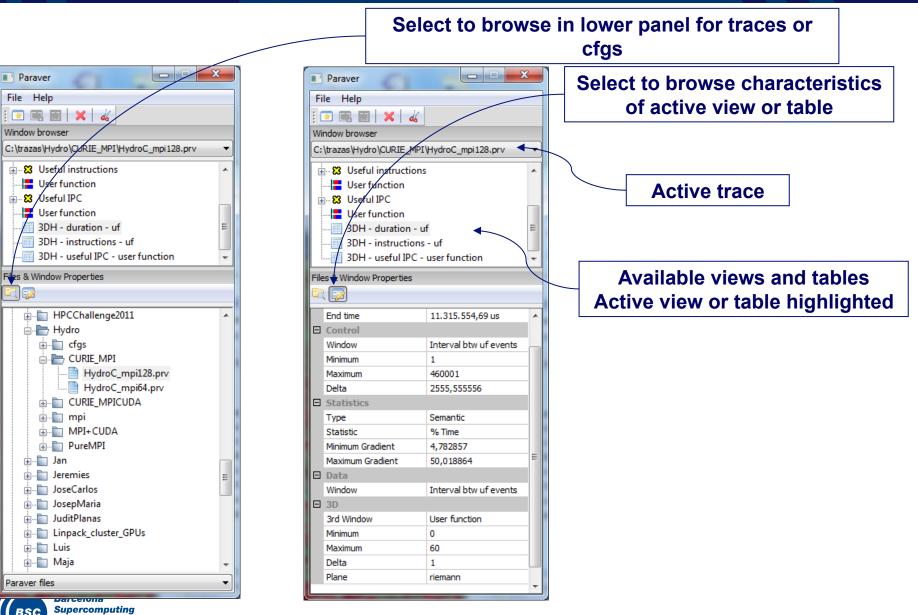
- General
  - including basic views (timelines) and analyses (2/3D profiles), including views of the user functions and call-stack
- Counters\_PAPI
  - Hardware counter derived metrics. Grouped in directories for
    - Program: related to algorithmic/compilation (i.e. instructions, FP ops,...)
    - Architecture: related to execution on specific architectures (i.e. cache misses, ...)
    - Performance: metrics reporting rates per time (i.e. MFLops, MIPS, IPC,...)
- MPI
  - Grouped in directories displaying views and analysis. Further separated into point to point and collectives.
- OpenMP
  - Grouped in directories displaying views and analysis



# How to ...

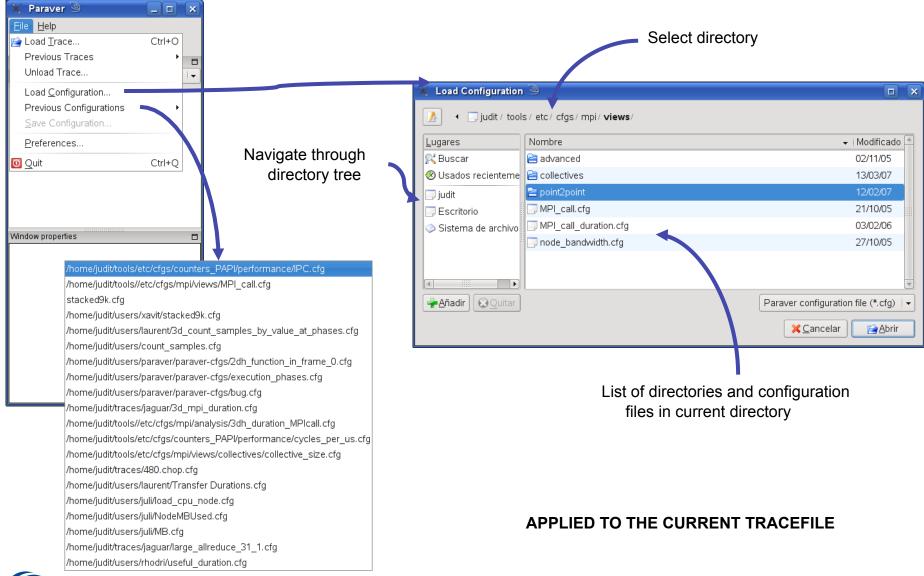


### Main Paraver window



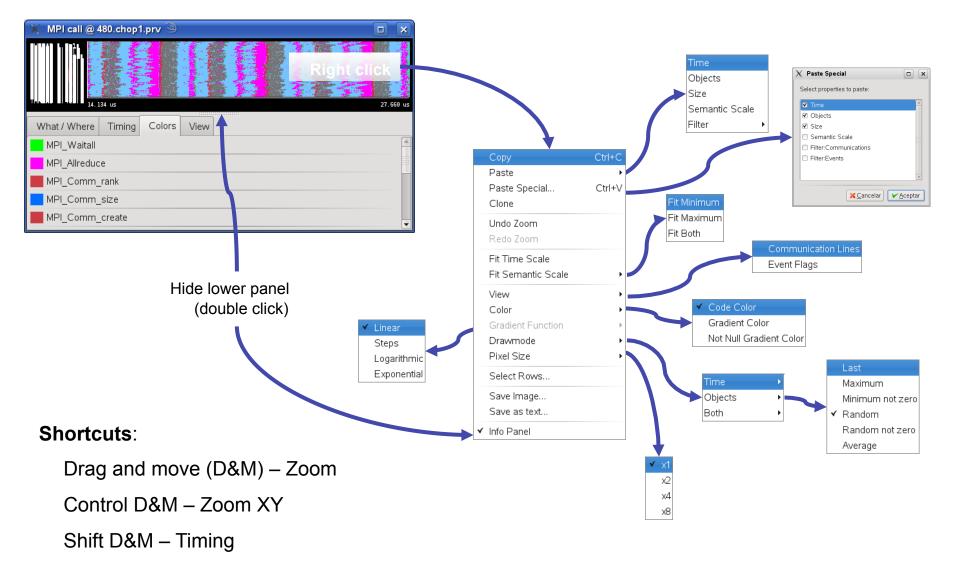
Center Centro Nacional de Supercomputación

### Load configuration files



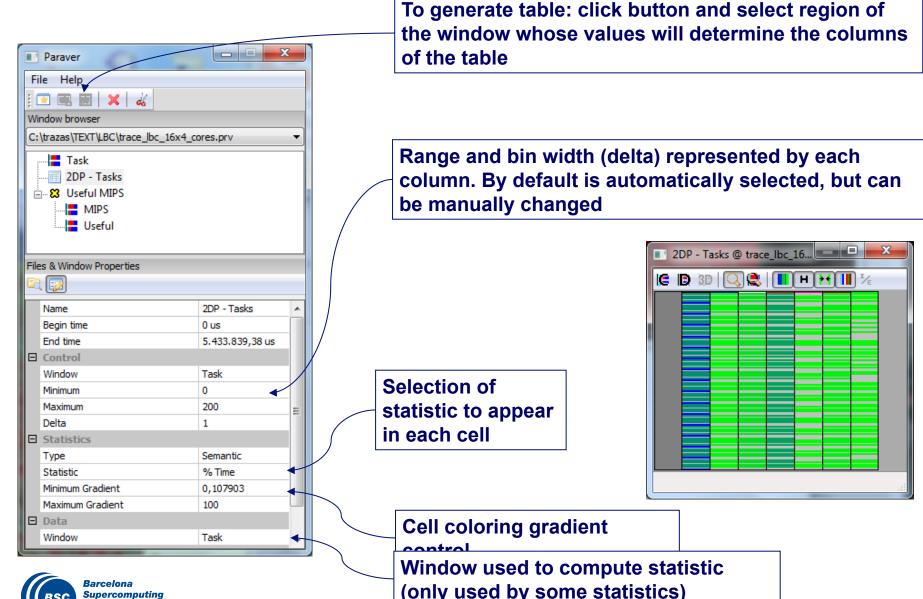


### Navigation





### How to generate table and change statistic

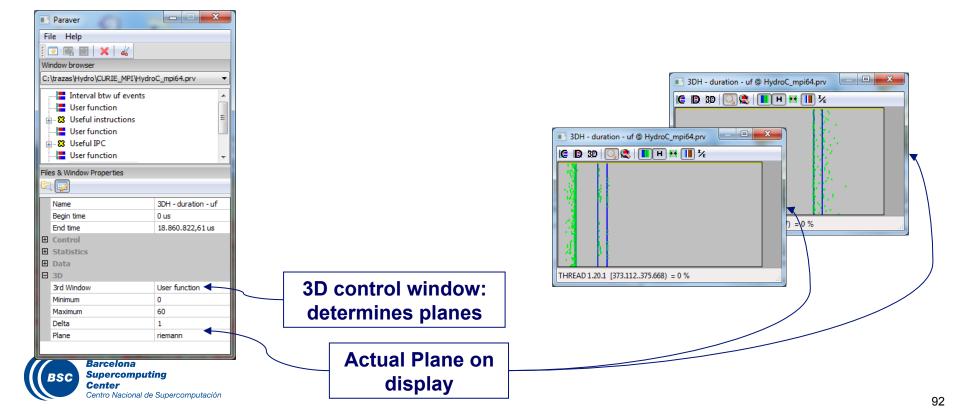


Supercomputing Center Centro Nacional de Supercomputación

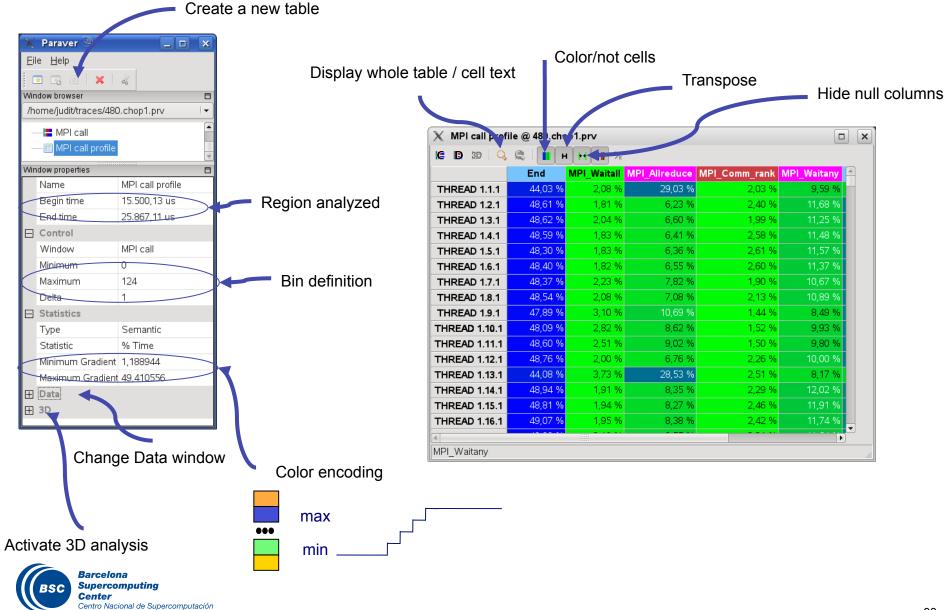
## **3D** tables

### ( One additional dimension

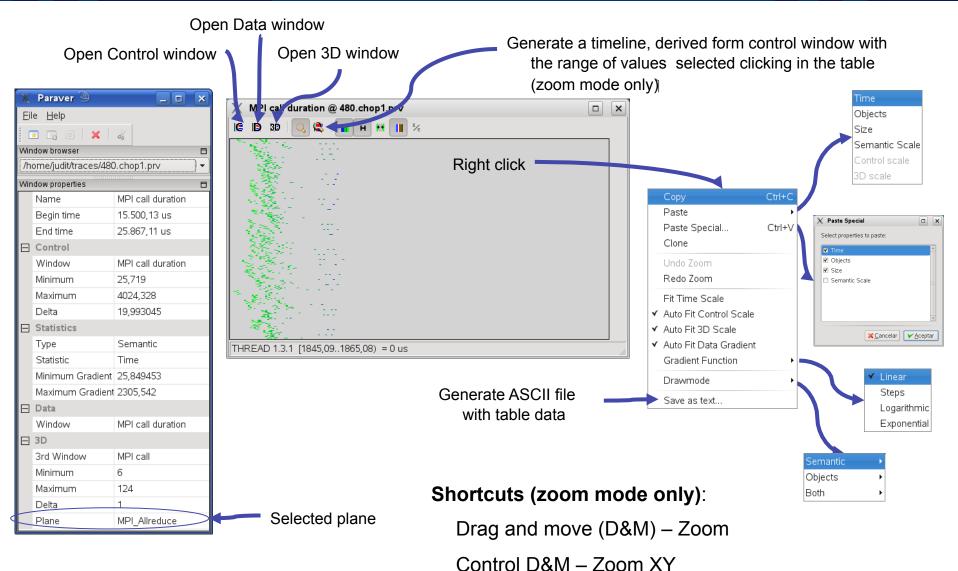
- One plane per value of a 3D control window
- ( Useful to categorize histograms
  - i.e. histogram of duration of specific user function



### Table information and control



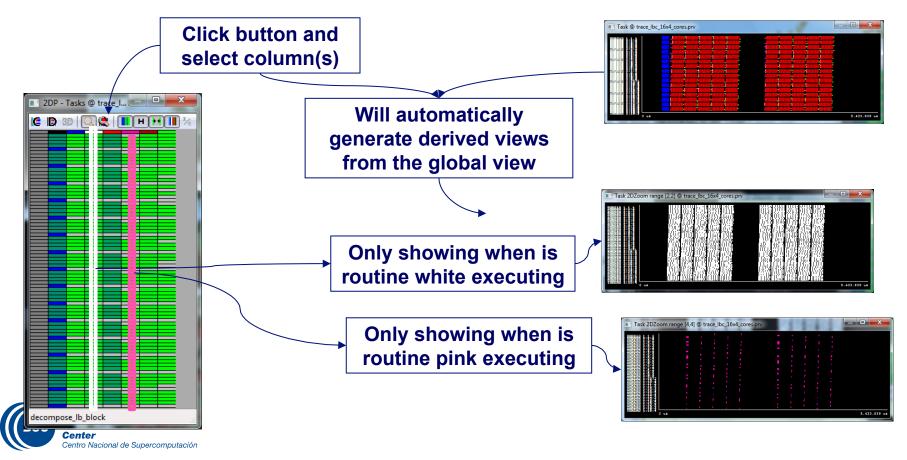
## Table information and control





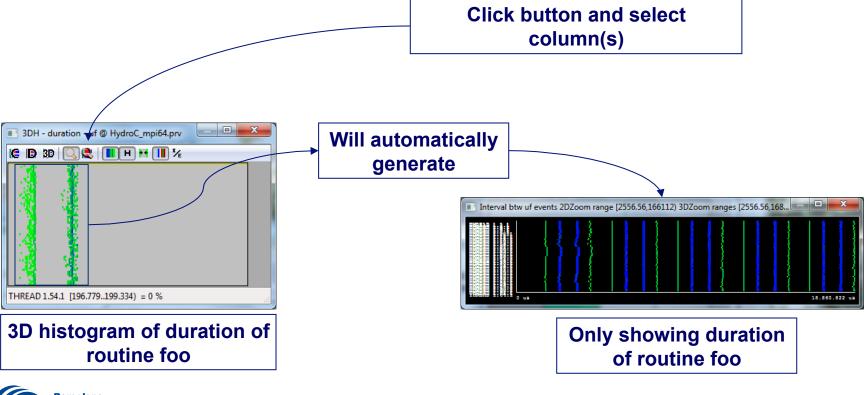
### From tables to timelines

- ( Where in the timeline do the values in certain table columns appear?
  - ie. want to see the time distribution of a given routine?



### From tables to timelines

- ( Where in the timeline do the values in certain table columns appear?
  - ie. want to see where the timeline happen computation bursts of a given length?



# **Trace manipulation**



### Handling very large traces

### ( Paraver data handling utilities

- If trying to load a very large trace, Paraver will ask if you want to filter it

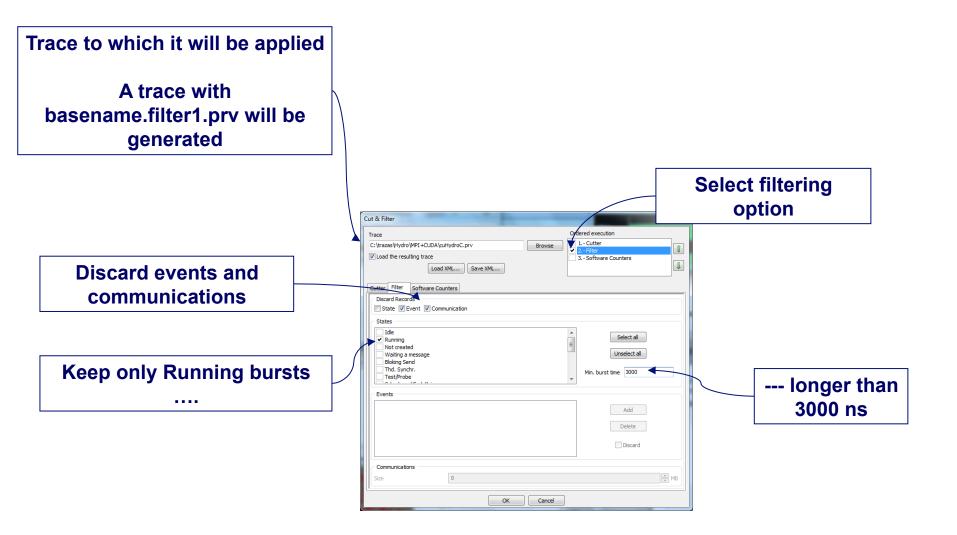
### ( Three steps:

- Filter original trace discarding most of the records only keeping most relevant information (typically computation bursts longer than a given lower bound)
- Analyze coarse grain structure of trace. Typically useful\_duration.cfg
- Cut original trace to obtain a fully detailed trace for the time interval considered representative or of interest

Guided hands-on available in <u>http://www.bsc.es/computer-sciences/performance-tools/documentation</u> → Trace Preparation



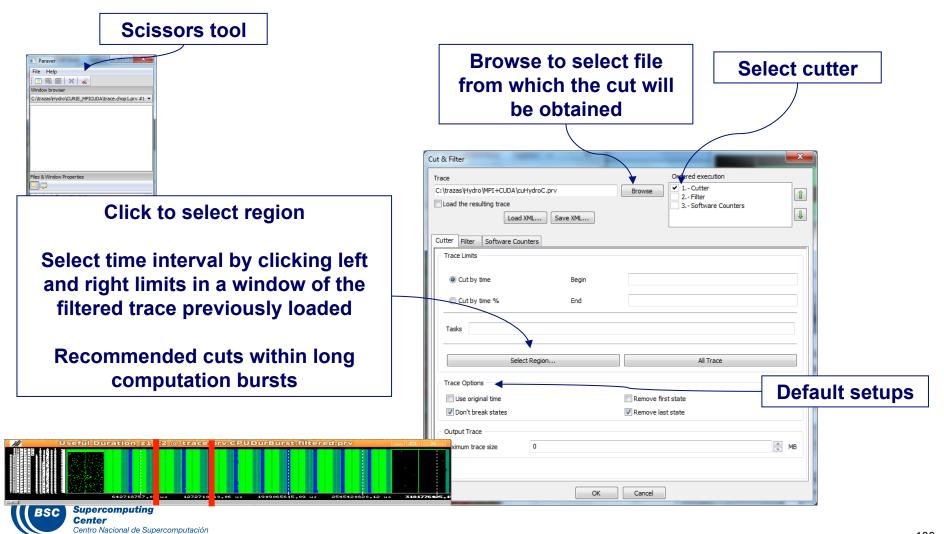
### Filtering very large traces





### Cutting very large traces

#### ( Load a filtered trace and use the scissors tool







### Adapt job submission script





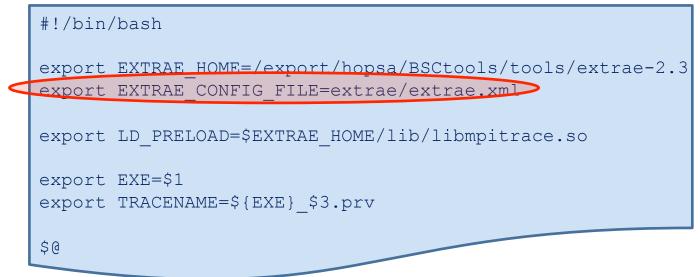
### Adapt job submission script

#!/bin/bash

export NP=8 export INPUT=\$1

cleo-submit -np \$NP ./trace.sh ./HydroC -i \$INPUT

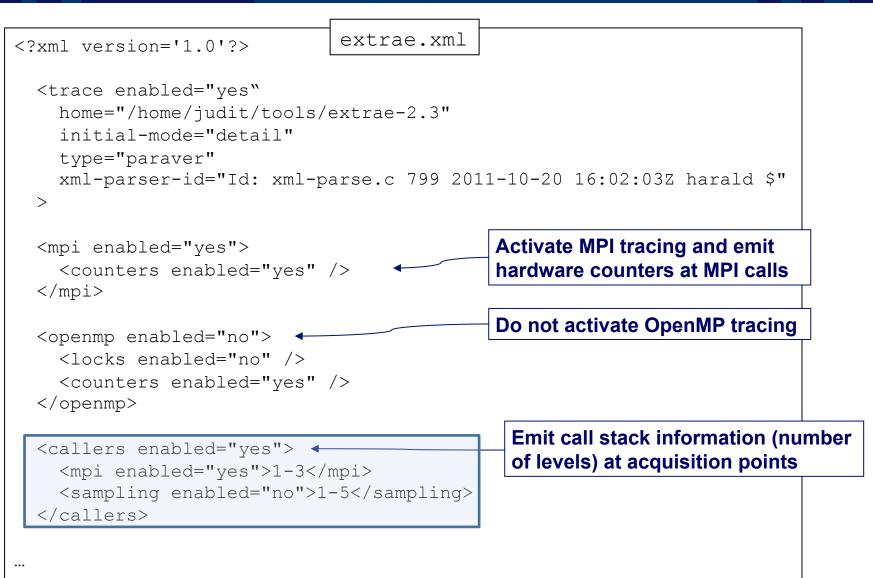
trace.sh



appl.job



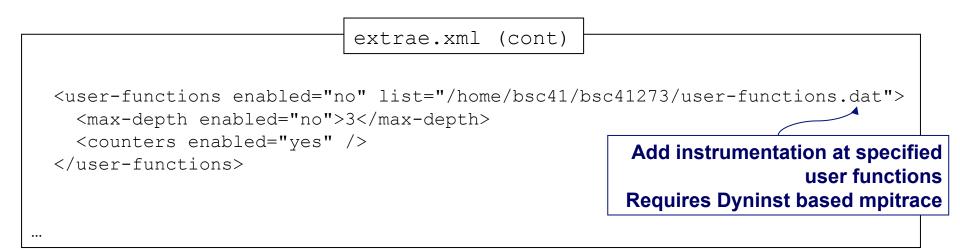
### Trace control .xml



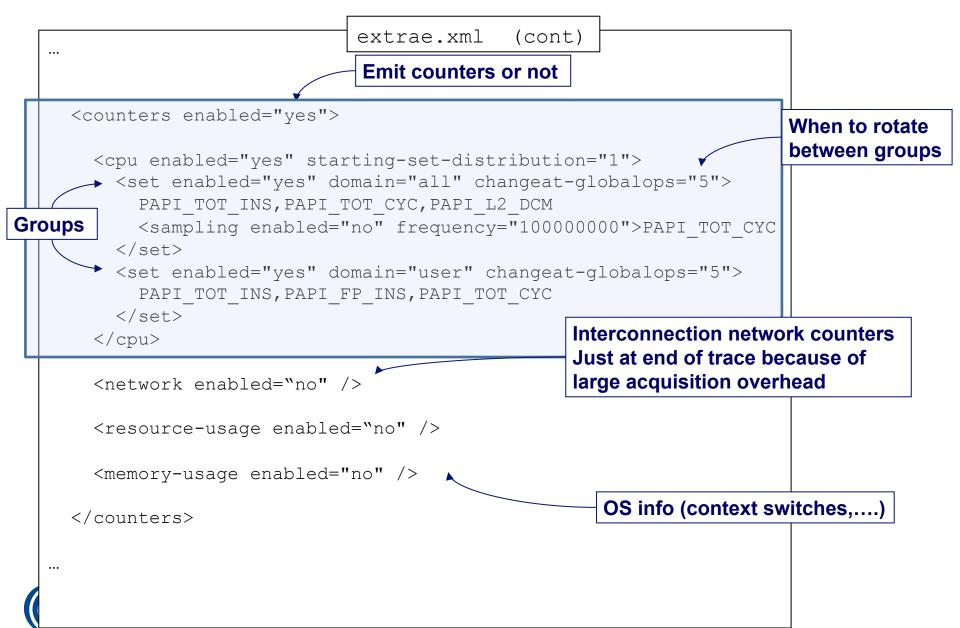
Details in \$EXTRAE HOME/share/example/MPI/extrae explained.xml Supercomputing

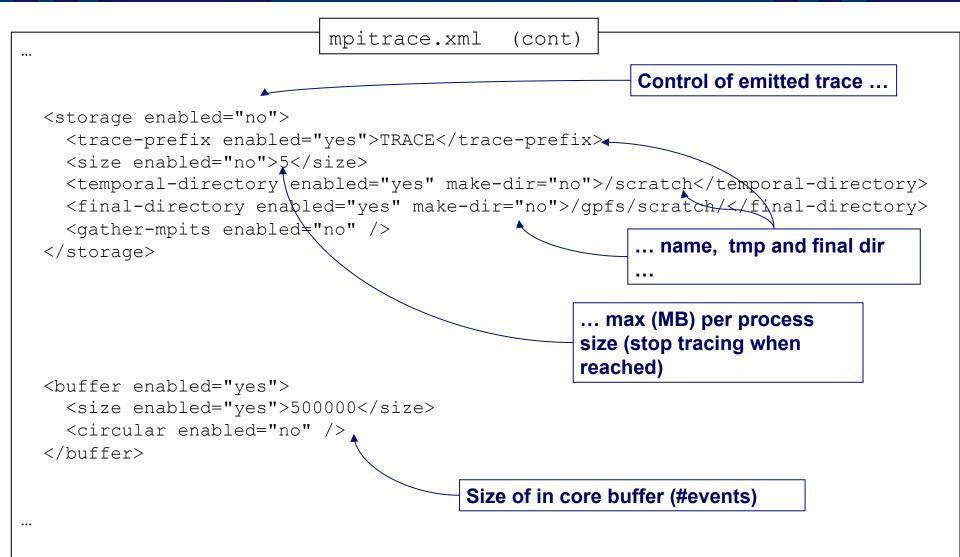
Barcelona

Center

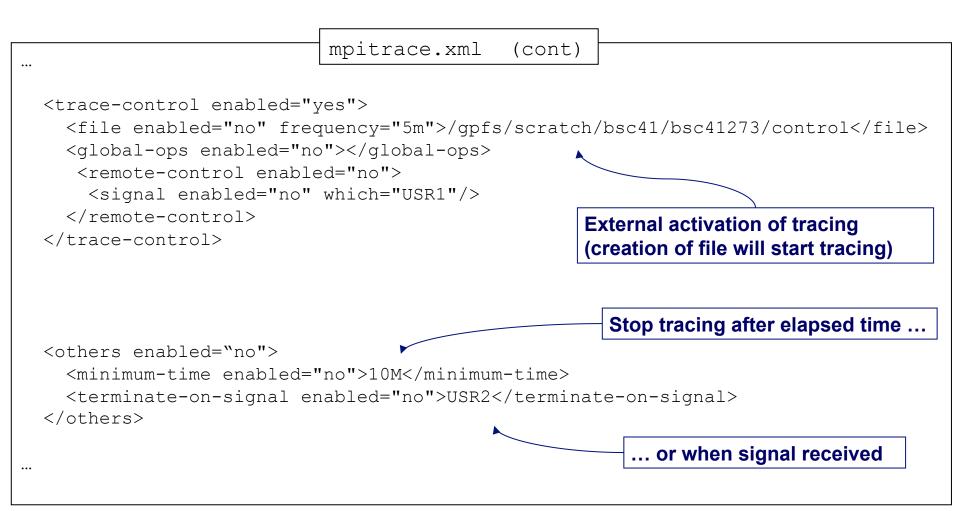




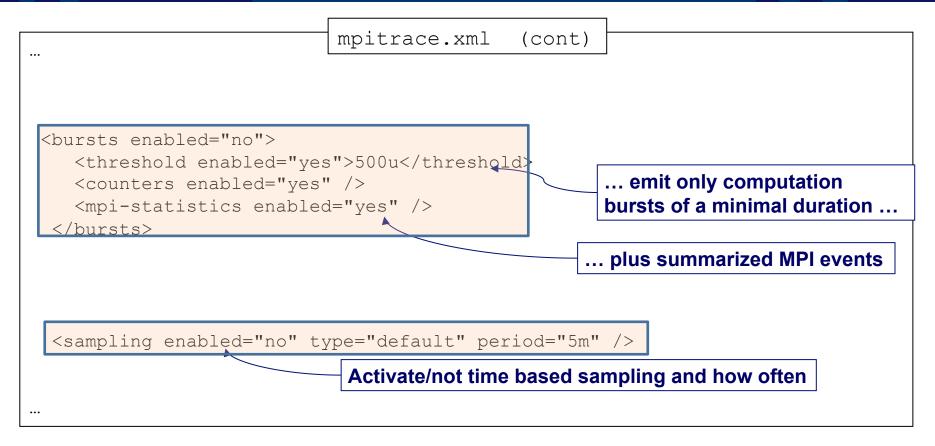




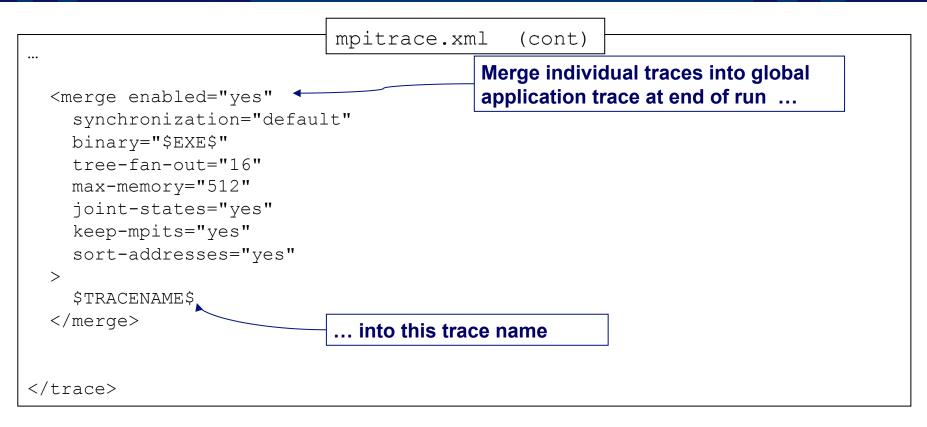














### ( Library depends on programming model

Programming model	Library		
Serial	libseqtrace		
Pure MPI	libmpitrace[f] <sup>1</sup>		
Pure OpenMP	libomptrace		
Pure Pthreads	libpttrace		
CUDA	libcudatrace		
MPI + OpenMP	libompitrace[f] <sup>1</sup>		
MPI + Pthreads	libptmpitrace[f] <sup>1</sup>		
Mpi + CUDA	libcudampitrace[f] <sup>1</sup>		

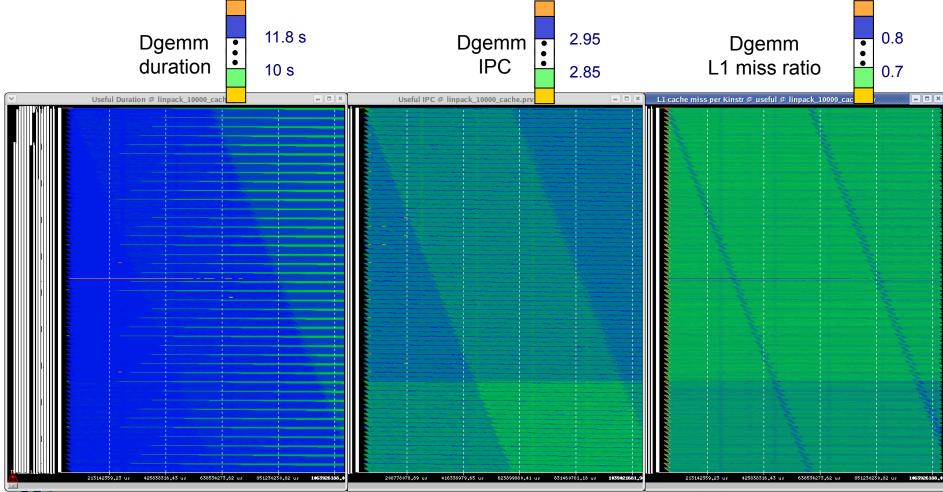
<sup>1</sup> for Fortran codes



# Scalability

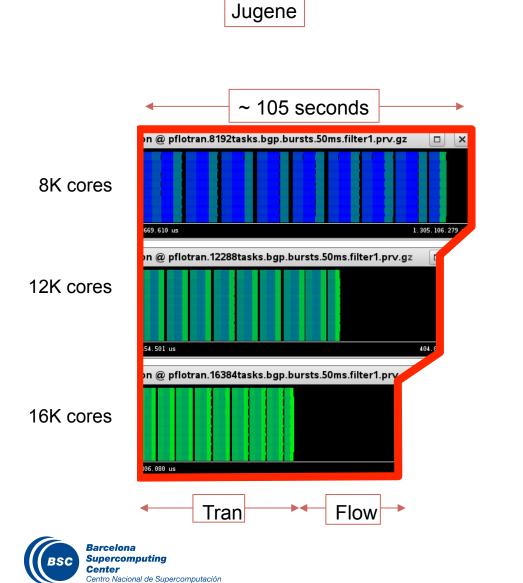


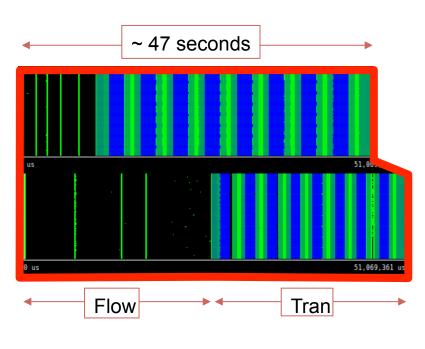
#### (Linpack @ Marenostrum: 10k cores x 1700 s



SC Barcelona Supercomputing Center

### Scalability of analysis





Jaguar



### Data reduction techniques

### **(C)** Software counters

- Summarize information of some event types (ie. MPI calls) by emitting aggregate counts
- Emit counts at structurally relevant points (i.e. begin and end of long computation phases)

### ( Representative cuts

Emit full detail only on selected intervals, representative of full program execution

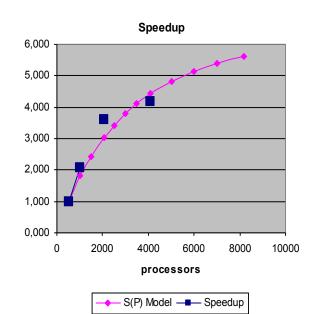
### ( On and off line combinations

- By instrumentation
- By paraver filtering



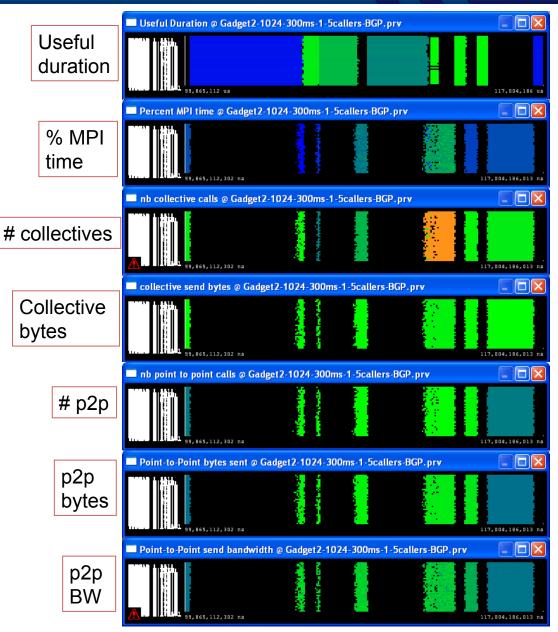
J. Labarta, et al.: "Scalability of tracing and visualization tools", PARCO 2005

### Software counters

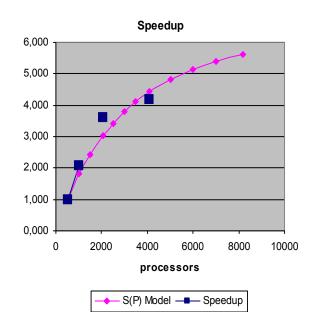


GADGET, PRACE Case A, 1024 procs



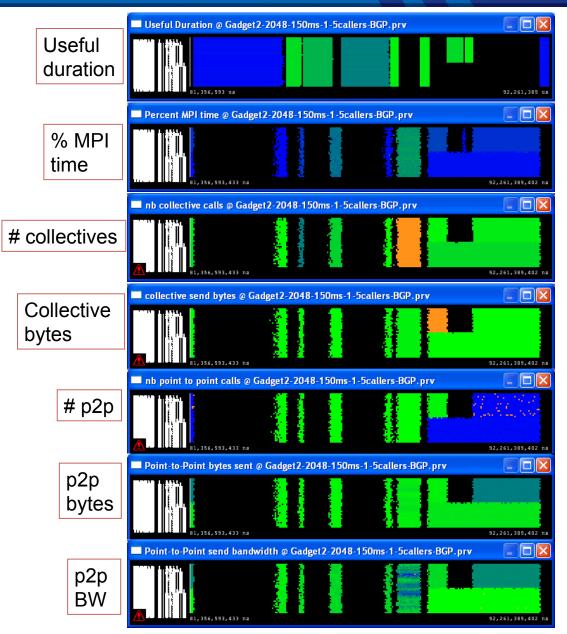


### Software counters

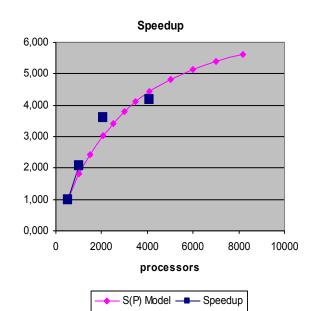


GADGET, PRACE Case A, 2048 procs





### Software counters



GADGET, PRACE Case A, 4096 procs



