# Parallel Programming Models on Hybrid Systems

MPI + OpenMP and other models on clusters of SMP nodes

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- Programming models on hybrid systems [8-50]
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  - Technical aspects with thread-safe MPI [9-11]
  - Mismatch problems with pure MPI and hybrid MPI+OpenMP [12-46]
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  - Pure OpenMP [47-49]
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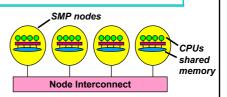








- HPC systems
  - often clusters of SMP nodes
  - i.e., hybrid architectures



- Using the communication bandwidth of the hardware optimal usage
- Minimizing synchronization = idle time

of the hardware

Appropriate parallel programming models / Pros & Cons

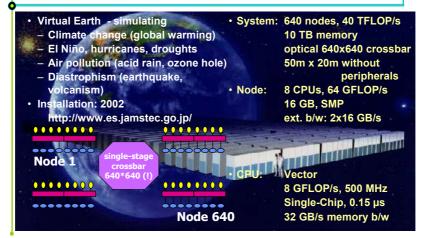


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# Earth Simulator Project ESRDC / GS 40 (NEC)





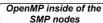


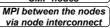


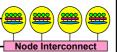




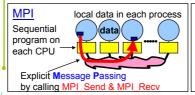
- Pure MPI (one MPI process on each CPU)
- Hybrid MPI+OpenMP
  - shared memory OpenMP
  - distributed memory MPI

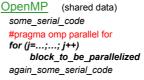






- · Other: Virtual shared memory systems, HPF, ...
- Often hybrid programming (MPI+OpenMP) slower than pure MPI
  - why?















# But results may surprise!

- Example code HYDRA
- · Domain-decomposed hydrodynamics
  - (almost) independent mesh domains with ghost cells on boundaries
  - ghost cells communicate boundary information ~40-50 times per cycle
- Parallelism model: single level
  - MPI divides domains among compute nodes
  - OpenMP further subdivides domains among processors
  - domain size set for cache efficiency
    - · minimizes memory usage, maximizes efficiency
    - scales to very large problem sizes (>10<sup>7</sup> zones, >10<sup>3</sup> domains)
- Results:
  - MPI (256 proc.) ~20% faster
     than MPI / OpenMP (64 nodes x 4 proc./node)
  - domain-domain communication not threaded,
     i.e., MPI communication is done only by main thread
    - · accounts for ~10% speed difference, remainder in thread overhead





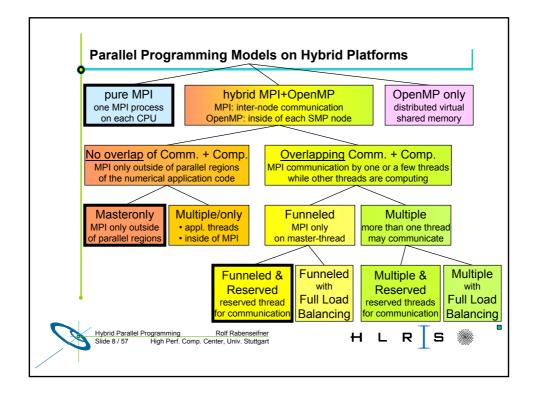








#### Example from SC 2001 Explicit/Semi Implicit C154N6 SEAM Pure MPI versus vs T170 PSTSWM, 16 Level, NCAR Integration rate [Years per day 25 Hybrid MPI+OpenMP (Masteronly) SEAM EXP: 4 MPI -SEAM EXP: HYBRID 4 What's better? 20 → it depends on? PSTSWM: 4 MPI 15 Explicit C154N6 16 Level SEAM: **NPACI** Results with 10 [Years per day] 7 or 8 processes or threads per node SEAM EXP: 7 MPI -- D-SEAM EXP: 8 MPI SEAM EXP: HYBRID 8 300 400 500 600 0 200 **Processors** 15 ntegration rate Figures: Richard D. Loft, Stephen J. Thomas, 10 John M. Dennis: Terascale Spectral Element Dynamical Core for 5 Atmospheric General Circulation Models. 0 Proceedings of SC2001, Denver, USA, Nov. 2001. 200 1000 0 400 600 800 http://www.sc2001.org/papers/pap.pap189.pdf **Processors** Fig. 9 and 10. Rolf Rabenseifner Hybrid Parallel Programming Rolf Rabenseifner Slide 7 / 57 High Perf. Comp. Center, Univ. Stuttgart



#### MPI rules with OpenMP / Automatic SMP-parallelization (2)

· Special MPI-2 Init for multi-threaded MPI processes:

int MPI\_Init\_thread(int \* argc, char \*((\*argv)[]), int required, int\* provided)
MPI\_INIT\_THREAD(REQUIRED, PROVIDED, IERROR)

· REQUIRED values (increasing order):

- MPI\_THREAD\_SINGLE: Only one thread will execute

THREAD\_MASTERONLY: MPI processes may be multi-threaded, but only master thread will make MPI-calls

not part of the standard) AND only while other threads are sleeping

MPI\_THREAD\_FUNNELED: Only master thread will make MPI-calls

- MPI\_THREAD\_SERIALIZED: Multiple threads may make MPI-calls,

but only one at a time

- MPI\_THREAD\_MULTIPLE: Multiple threads may call MPI,

with no restrictions

returned PROVIDED may be less than REQUIRED by the application





# Calling MPI inside of OMP MASTER

- Inside of a parallel region, with "OMP MASTER"
- Requires MPI\_THREAD\_FUNNELED, i.e., only master thread will make MPI-calls
- Caution: There isn't any synchronization with "OMP MASTER"!
   Therefore, "OMP BARRIER" normally necessary to guarantee, that data or buffer space from/for other threads is available before/after the MPI call!

!\$OMP BARRIER !\$OMP MASTER call MPI\_Xxx(...) !\$OMP END MASTER !\$OMP BARRIER #pragma omp barrier

- But this implies that all other threads are sleeping!
- The additional barrier implies also the necessary cache flush!





#### ... the barrier is necessary - example with MPI Recv

```
!$OMP PARALLEL
!$OMP DO
     do i=1,1000
       a(i) = buf(i)
     end do
!$OMP END DO NOWAIT
!SOMP BARRIER
!$OMP MASTER
     call MPI RECV(buf,...)
!$OMP END MASTER
!$OMP BARRIER
!$OMP DO
     do i=1,1000
       c(i) = buf(i)
     end do
!$OMP FND DO NOWAIT
!$OMP END PARALLEL
```

```
#pragma parallel
#pragma for nowait
    for (i=0; i<1000; i++)
        a[i] = buf[i];
#pragma omp barrier
#pragma omp master
        MPI Recv(buf,...);
#pragma omp barrier
#pragma for
nowait for (i=0; i<1000;
i++)
        c[i] = buf[i];
#pragma end parallel
```

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#### Mismatch Problems

**Topology problem** [with pure MPI]

Unnecessary intra-node communication [with pure MPI]

Inter-node bandwidth problem [with hybrid MPI+OpenMP]

Sleeping threads and [with masteronly] saturation problem [with pure MPI]

 Additional OpenMP overhead [with hybrid MPI+OpenMP]

Thread startup / join

Cache flush (data source thread – communicating thread – sync. → flush)

Overlapping communication and computation [with hybrid MPI+OpenMP]

 an application problem → separation of local or halo-based code

a programming problem → thread-ranks-based vs. OpenMP work-sharing

- a load balancing problem, if only some threads communicate / compute

no silver bullet

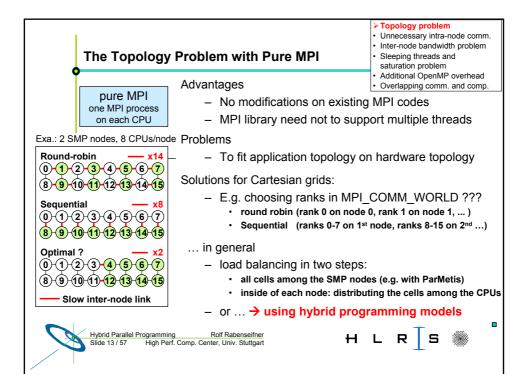
- each parallelization scheme has its problems

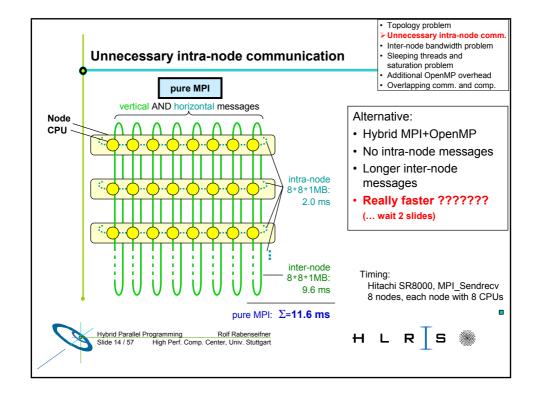












# **Programming Models on Hybrid Platforms: Hybrid Masteronly**

Masteronly MPI only outside of parallel regions

#### Advantages

- No message passing inside of the SMP nodes
  - No topology problem

#### for (iteration ....) { #pragma omp parallel numerical code

/\*end omp parallel \*/

/\* on master thread only \*/ MPI Send (original data to halo areas in other SMP nodes) MPI\_Recv (halo data from the neighbors) } /\*end for loop

#### **Problems**

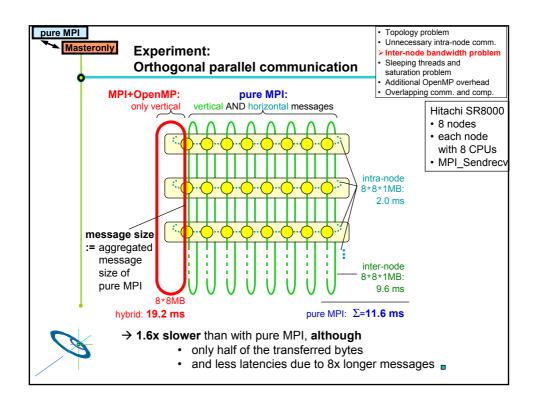
MPI-lib must support MPI THREAD FUNNELED

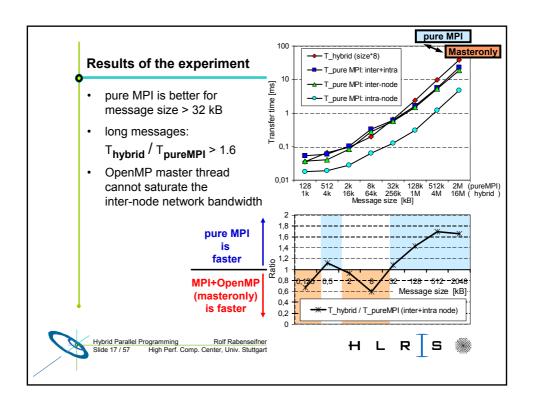
#### Disadvantages

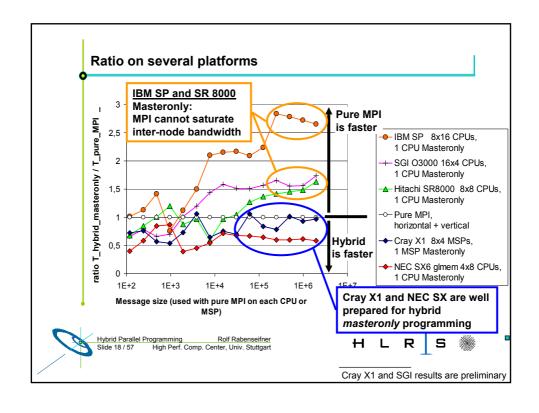
- do we get full inter-node bandwidth? ... next slide
- all other threads are sleeping while master thread communicates
  - → Reason for implementing overlapping of communication & computation









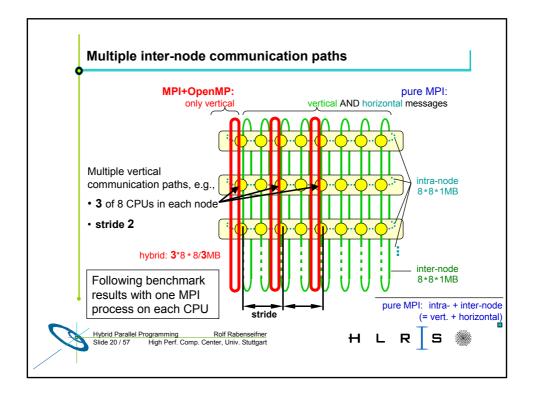


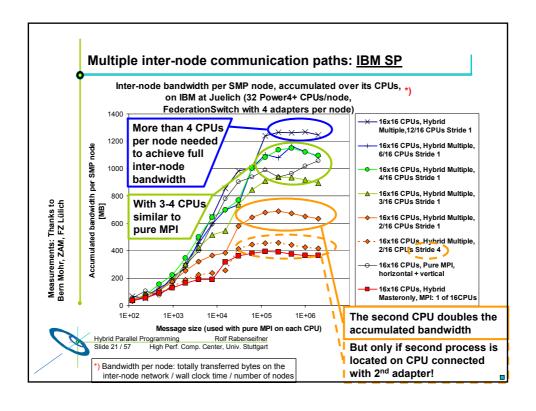
#### **Possible Reasons**

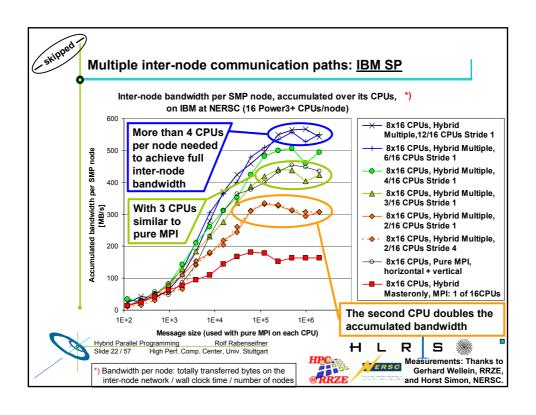
- Hardware:
  - is one CPU able to saturate the inter-node network?
- · Software:
  - internal MPI buffering may cause additional memory traffic
     memory bandwidth may be the real restricting factor?
- → Let's look at parallel bandwidth results

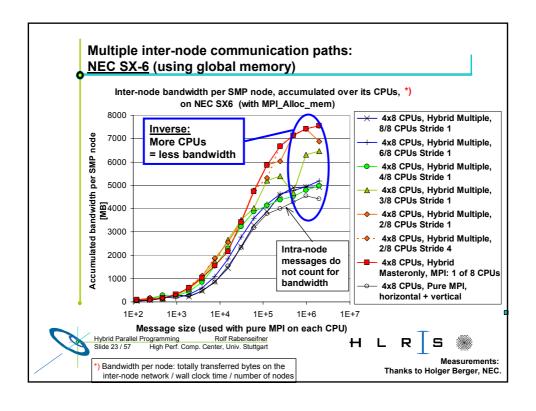


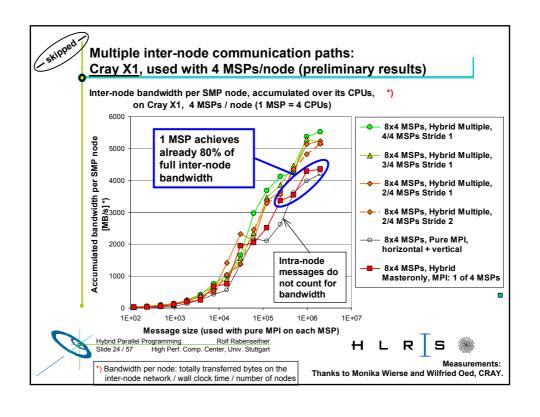


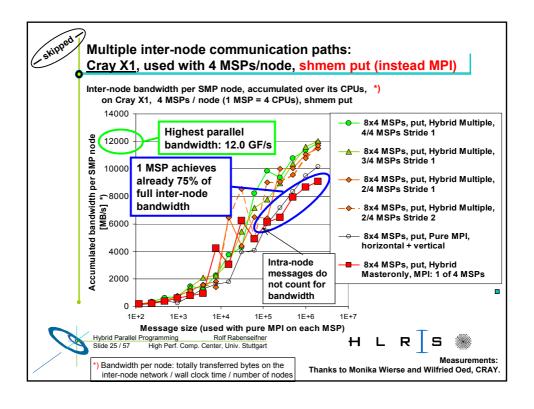


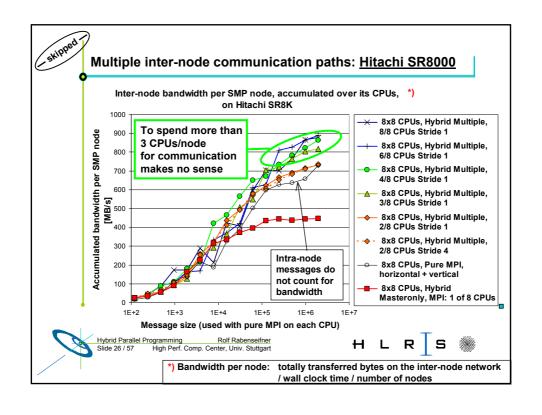


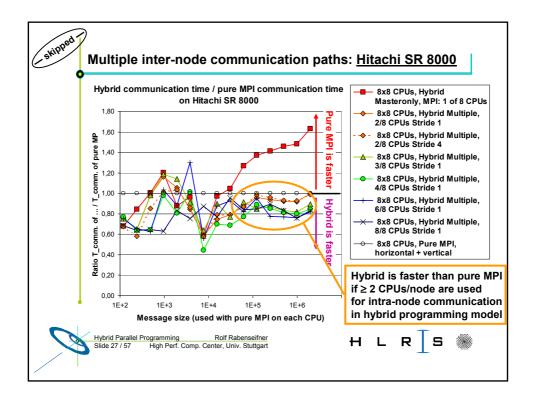


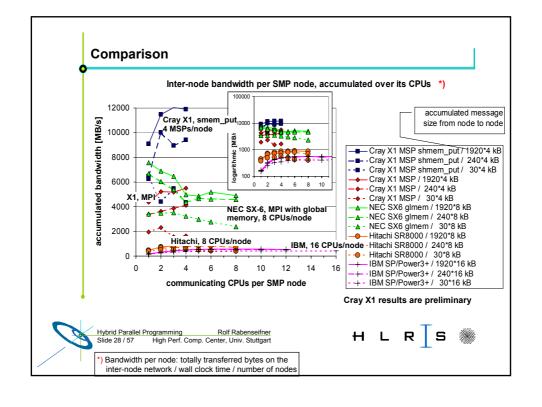


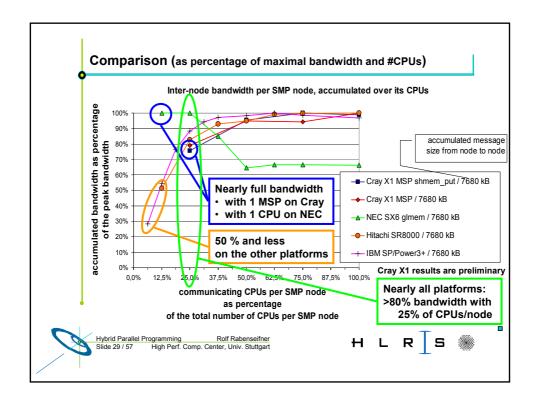


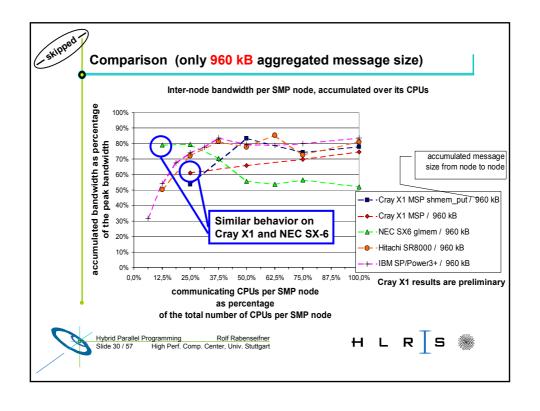


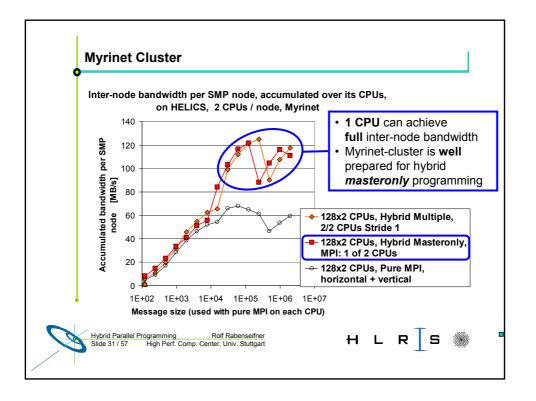


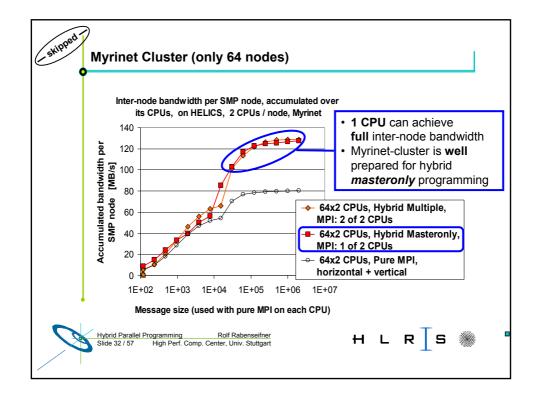














## Hybrid Programming on Cray X1: MSP based usage

- · pure MPI or hybrid masteronly MPI+OpenMP
  - → same communication time
- 1 MSP already achieves 80% of maximum bandwidth (contiguous data)
  - · Are CPU-intensive MPI routines (Reduce, strided data) efficient & multi-threaded ?
- Hybrid programming → 4 layers of parallelism
  - MPI between nodes (e.g. domain decomposition)
  - OpenMP between MSPs (e.g. outer loops)
  - Automatic parallelization (e.g. inner loops)
  - Vectorization (e.g. most inner loops)
  - → risk of Amdahl's law on each level!
- Hybrid & overlapping communication and computation
  - · horrible programming interface (but standardized)
  - · but chance to use sleeping MSPs while master MSP communicates



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#### Hybrid Programming on Cray X1: SSP based

- Communication is hardware-bound to SSP
  - 1 SSP can get only 1/4 of 1 MSP's inter-node bandwidth
  - with shmem put: all SSPs of a node can together achieve full inter-node bandwidth (12.3 GB/s of 12.8 GB/s hardware specification)
- Hybrid MPI+OpenMP, masteronly style
  - optimized MPI library needed with same bandwidth as on 1 or 4 MSP
  - e.g., internally thread-parallel
- Multiple communicating user-threads are not supported
- pure MPI
  - efficient MPI implementation under development







# Comparing inter-node bandwidth with CPU performance

\*) Bandwidth per node: totally transferred bytes on the network / number of nodes / wall clock time

All values: aggregated over one SMP nodes. *) mess. size: 16 MB *) 2 MB	Master -only, inter- node [GB/s]	pure MPI, inter- node [GB/s]	Master- only bw / max. intra- node bw	pure MPI, intra- node [GB/s]	memo- ry band- width [GB/s]	Peak & Linpack perfor- mance Gflop/s	max.inter -node bw / peak & <i>Linpack</i> perf. B/Flop	nodes*CPUs
Cray X1,shmem_put preliminary results	9.27	12.34	75 %	33.0	136	<b>51.2</b> 45.03	<b>0.241</b> 0.274	8 * 4 MSPs
Cray X1, MPI preliminary results	4.52	5.52	82 %	19.5	136	<b>51.2</b> 45.03	<b>0.108</b> <i>0.123</i>	8 * 4 MSPs
NEC SX-6 global memory	7.56	4.98	100 %	78.7 93.7 <sup>+</sup> )	256	<b>64</b> 61.83	<b>0.118</b> 0.122	4 * 8 CPUs
NEC SX-5Be local memory	2.27	2.50 a)	91 %	35.1	512	<b>64</b> 60.50	0.039 0.041	2 *16 CPUs a) only with 8
Hitachi SR8000	0.45	0.91	49 %	5.0	32 store 32 load	<b>8</b> 6.82	<b>0.114</b> 0.133	8 * 8 CPUs
IBM SP Power3+	0.16	0.57 <sup>+</sup> )	28 %	2.0	16	<b>24</b> 14.27	<b>0.023</b> 0.040	8 *16 CPUs
SGI O3000, 600MHz	0.43+)	1.74 <sup>+</sup> )	25 %	1.73 <sup>+</sup> )		<b>4.8</b> 3.64	<b>0.363</b> 0.478	16 *4 CPUs
SUN-fire (prelimi.)	0.15	0.85	18 %	1.68				4 *24 CPUs
HELICS Dual-PC cluster with Myrinet	0.118 <sup>+</sup> )	0.119 †)	100 %	0.104 +)		<b>2.80</b> 1.61	<b>0.043</b> 0.074	128 *2 CPUs

# The sleeping-threads and the saturation problem

- · Topology problem
- Unnecessary intra-node comm.Inter-node bandwidth problem
- Sleeping threads and saturation problem
- Additional OpenMP overheadOverlapping comm. and comp.

- · Masteronly:
  - all other threads are sleeping while master thread calls MPI
    - → wasting CPU time
    - →→→ wasting plenty of CPU time
      if master thread cannot saturate the inter-node network
- · Pure MPI:
  - all threads communicate,
     but already 1-3 threads could saturate the network
     wasting CPU time
- Overlapping communication and computation





#### Example with Sweep3d - analyzed with Kojak

- Expert: part of Kojak project at FZ Jülich,
  - Contact: Dr. Bernd Mohr
  - www.fz-jülich.de/zam/kojak/
- Sweep3d
  - ASCI Benchmark (MPI-Version) http://www.llnl.gov/asci\_benchmarks/asci/limited/sweep3d/asci\_sweep3d.html
  - A first, insufficient (straight-forward) hybrid "masteronly" MPI+OpenMP implementation

#### Demo:

- Icon starts D:\EigeneDateien\expert\_Mohr\src\presenter.py
- File → Open → D:\EigeneDateien\expert\_Mohr\reports\sweep3d.eap.dat
- Left mouse button: open more details
- Right mouse double-click: choose this event class for details in next window





# Additional OpenMP Overhead

- Thread fork / join
- Cache flush
  - synchronization between data source thread and communicating thread implies → a cache flush

Topology problem

- · Unnecessary intra-node comm. Inter-node bandwidth problem
- · Sleeping threads and
- saturation problem
- > Additional OpenMP overhead · Overlapping comm. and comp.

Amdahl's law for each level of parallelism









#### **Mismatch Problems**

Topology problem

Unnecessary intra-node communication

[with pure MPI] [with pure MPI]

Inter-node bandwidth problem

[with hybrid MPI+OpenMP]

Sleeping threads and saturation problem

[with masteronly] [with pure MPI]

Additional OpenMP overhead

[with hybrid MPI+OpenMP]

Thread fork / ioin

Cache flush (data source thread – communicating thread – sync. → flush)

#### Overlapping communication and computation [with hybrid MPI+OpenMP]

- an application problem → separation of local or halo-based code
- a programming problem → thread-ranks-based vs. OpenMP work-sharing
- a load balancing problem, if only some threads communicate / compute
- → no silver bullet
  - each parallelization scheme has its problems



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#### Overlapping Communication and Computation

MPI communication by one or a few threads while other threads are computing

- the application problem:
  - one must separate application into:
    - · code that can run before the halo data is received
    - · code that needs halo data

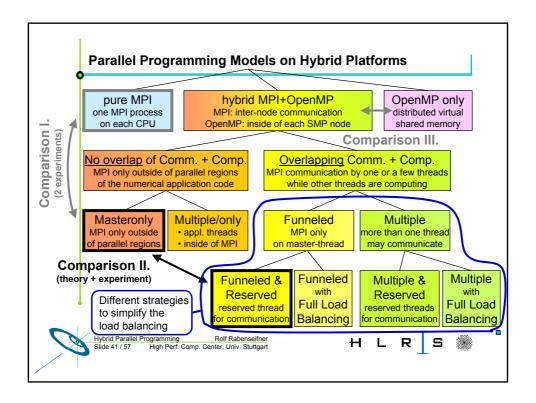
#### → very hard to do !!!

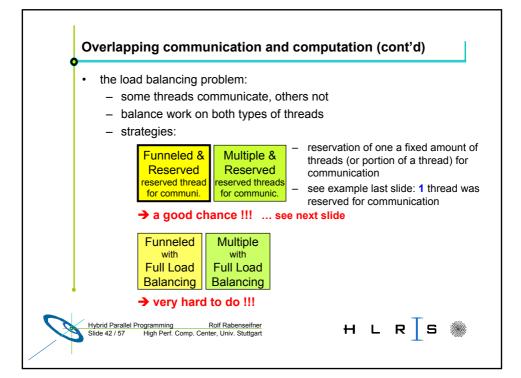
- the thread-rank problem:
  - comm. / comp. via thread-rank
  - cannot use work-sharing directives
  - → loss of major OpenMP support
- the load balancing problem

```
if (my_thread_rank < 1) {
  MPI_Send/Recv....
} else {
  my_range = (high-low-1) / (num_threads-1) + 1;
  my_low = low + (my_thread_rank+1)*my_range;
  my_high=high+ (my_thread_rank+1+1)*my_range;
  my_high = max(high, my_high)
  for (i=my_low; i<my_high; i++) {
 }
```







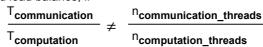


## Overlapping computation & communication (cont'd)

funneled & reserved

Funneled & reserved or Multiple & reserved:

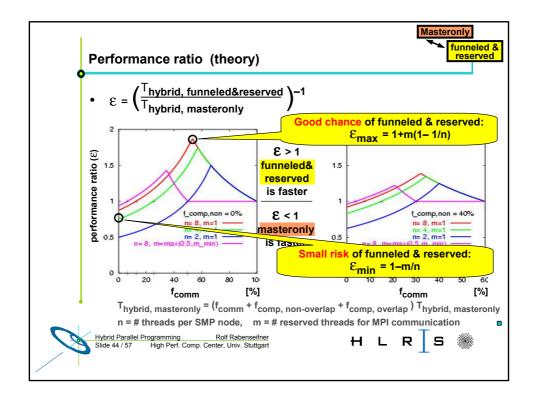
- · reserved tasks on threads:
  - master thread or some threads: communication
  - all other threads .....: computation
- · cons:
  - bad load balance, if

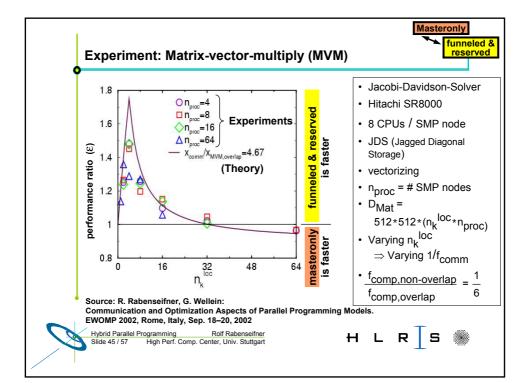


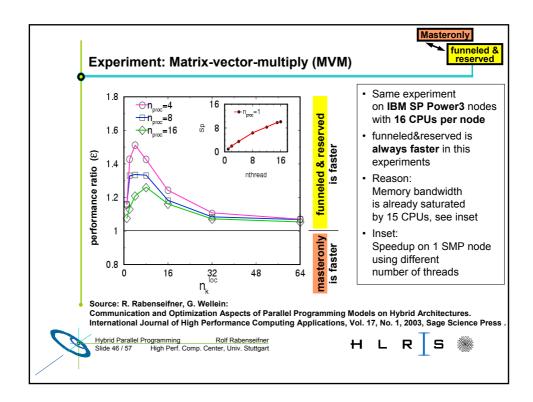
- pros:
  - more easy programming scheme than with full load balancing
  - chance for good performance!

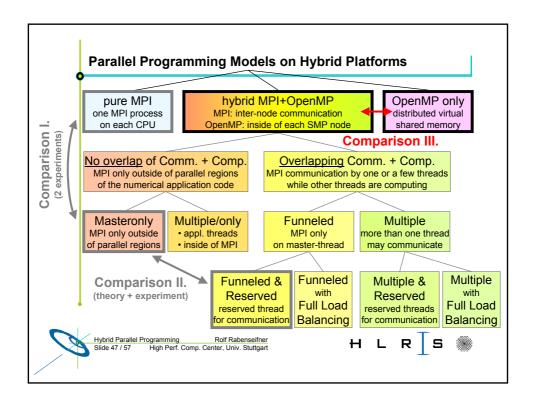


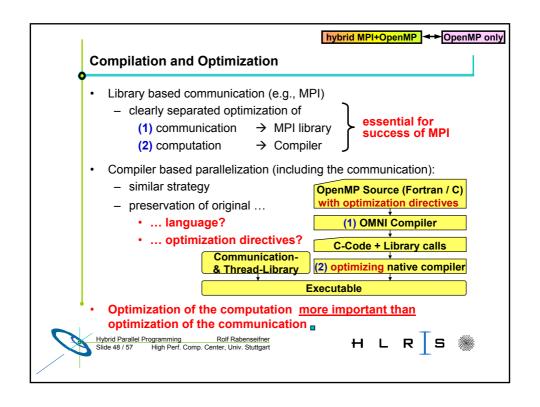


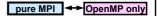












#### OpenMP/DSM

- Distributed shared memory (DSM) //
- Distributed virtual shared memory (DVSM) //
- Shared virtual memory (SVM)
- · Principles
  - emulates a shared memory
  - on distributed memory hardware
- · Implementations
  - e.g., TreadMarks





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- Acknowledgments & Conclusions [56-57]











#### No silver bullet

- The analyzed programming models do **not** fit on hybrid architectures
  - whether drawbacks are minor or major
    - > depends on applications' needs
  - problems ...
    - > to utilize the CPUs the whole time
    - > to achieve the full inter-node network bandwidth
    - > to minimize inter-node messages
    - > to prohibit intra-node
      - message transfer,
      - synchronization and
      - balancing (idle-time) overhead
    - > with the programming effort



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# **Chances for optimization**

- with hybrid masteronly (MPI only outside of parallel OpenMP regions), e.g.,
  - > Minimize work of MPI routines, e.g.,
    - application can copy non-contiguous data into contiguous scratch arrays (instead of using derived datatypes)
  - MPI communication parallelized with multiple threads to saturate the inter-node network
    - by internal parallel regions inside of the MPI library
    - by the user application
  - > Use only hardware that can saturate inter-node network with 1 thread
  - > Optimal throughput:
    - reuse of idling CPUs by other applications



L R







#### **Other Concepts**

- Distributed memory programming (DMP) language extensions
  - Co-array Fortran
  - UPC (Unified Parallel C)

Idea: direct access to remote data via additional [rank] index

- Multi level parallelism (MLP)
  - combining OpenMP (inside of the processes)
  - with Sys V shared memory (data access between processes)
  - only on ccNUMA

# No standards! Only on a few platforms!



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#### **DMP Language Extensions**

- Programmable access to the memory of the other processes
- Language bindings:
  - Co-array Fortran
  - UPC (Unified Parallel C)
- Special additional array index to explicitly address the process
- Examples (Co-array Fortran):

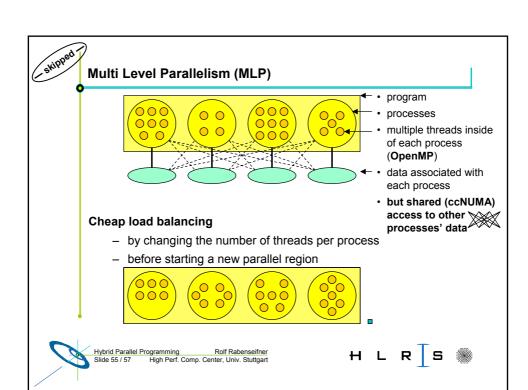
```
integer a[*], b[*]
                                ! Replicate a and b on all processes
a[1] = b[6]
                                ! a on process 1 := b on process 6
```

```
dimension (n,n) :: u[3,*]
                                ! Allocates the nxn array u
                                           on each of the 3x* processes
p = THIS_IMAGE(u,1)
                                ! first co-subscript of local process
q = THIS IMAGE(u,1)
                                ! second co-subscript of local process
u(1:n,1)[p+1,q] = u(1:n,n)[p,q]! Copy right boundary u(1, 0) on process [p, 0]
                                ! to right neighbor [p+1,] into left boundary u(n,)
```









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  - Gerhard Wellein, RRZE
  - Monika Wierse, Wilfried Oed, and Tom Goozen, CRAY
  - Holger Berger, NEC
  - Reiner Vogelsang, SGI
  - Gabriele Jost, NASA
  - Dieter an Mey, RZ Aachen
  - Horst Simon, NERSC
  - Matthias Müller, HLRS
  - my colleges at HLRS



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#### **Conclusions**

- · Only a few platforms
  - e.g., Cray X1 in MSP mode, NEC SX-6, and Myrinet-cluster
  - are well designed hybrid MPI+OpenMP masteronly scheme
- · Other platforms
  - masteronly style cannot saturate inter-node bandwidth
  - optimization chances should be used
- · Pure MPI and hybrid masteronly:
  - idling CPUs (while one or some are communicating)
- DSM systems (pure OpenMP):
  - may help for some applications
- Optimal performance:
  - overlapping of communication & computation
    - → extreme programming effort
  - optimal throughput
    - → reuse of idling CPUs by other applications
      - · single threaded, vectorized, low-priority, small-medium memory needs









See also  $\underline{www.hlrs.de/people/rabenseifner} \rightarrow list of publications$