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SEIT 1386

Application Specific Computing (ASC)

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Application Specific Computing
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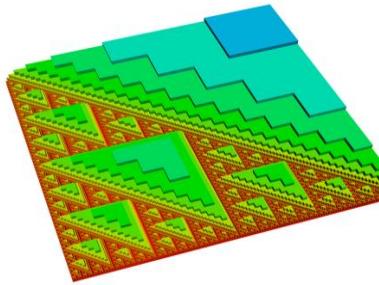
<http://asc.ziti.uni-heidelberg.de>

Application Specific Computing (ASC)

Accelerator



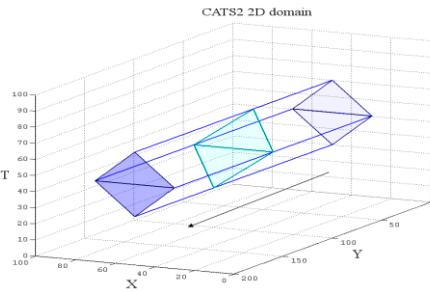
Data



Many-core



Algorithm



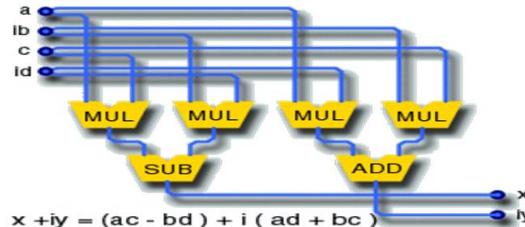
FPGAs



Embedded



Software



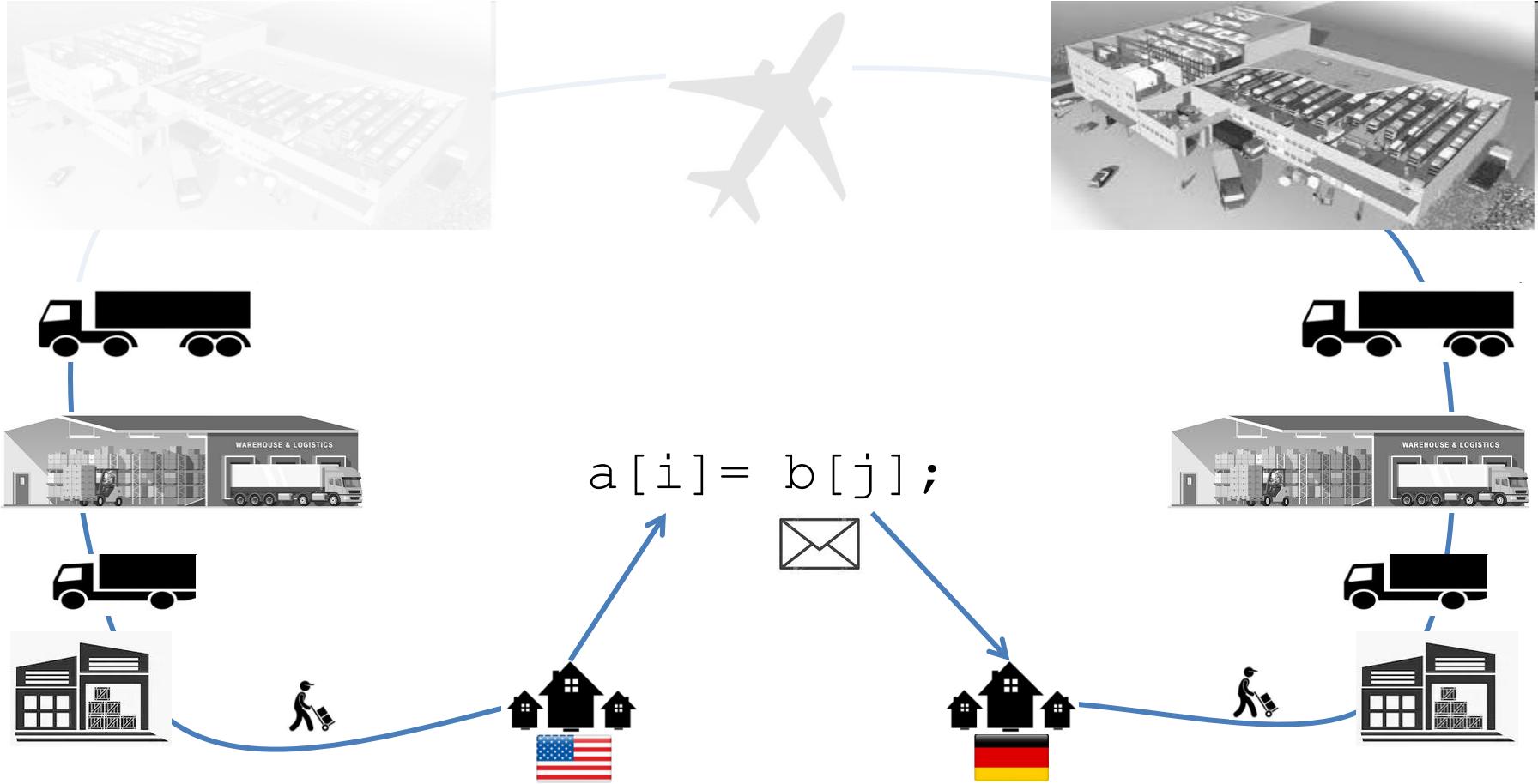
#	T	Site	Manufacturer	Computer	Country	HPCG [Pflop/s]	Rmax [Pflop/s]	HPCG/ Peak	HPCG/ HPL
1	1	Oak Ridge National Laboratory	IBM	Summit IBM Power System, P9 22C 3.07 GHz, Volta GV100, EDR	USA	2.9258	122.3	1.6%	2.4%
2	3	Lawrence Livermore National Laboratory	IBM	Sierra IBM Power System, P9 22C 3.1 GHz, Volta GV100, EDR	USA	1.7957	71.6	1.5%	2.5%
3	16	RIKEN Advanced Institute for Computational Science	Fujitsu	K Computer SPARC64 VIIIfx 2.0GHz, Tofu Interconnect	Japan	0.6027	10.5	5.3%	5.7%
4	9	Los Alamos NL / Sandia NL	Cray	Trinity Cray XC40, Intel Xeon Phi 7250 68C 1.4GHz, Aries	USA	0.5461	14.1	1.2%	3.9%
5	6	Swiss National Supercomputing Centre (CSCS)	Cray	Piz Daint Cray XC50, Xeon E5 12C 2.6GHz, Aries, NVIDIA Tesla P100	Switzerland	0.4864	19.6	1.9%	2.5%
6	2	National Supercomputing Center in Wuxi	NRCPC	Sunway TaihuLight NRCPC Sunway SW26010, 260C 1.45GHz	China	0.4808	93.0	0.4%	0.5%
7	12	JCAHPC Joint Center for Advanced HPC	Fujitsu	Oakforest-PACS PRIMERGY CX1640 M1, Intel Xeons Phi 7250 68C 1.4 GHz, OmniPath	Japan	0.3855	13.6	1.5%	2.8%
8	10	Lawrence Berkeley National Laboratory	Cray	Cori Cray XC40, Intel Xeons Phi 7250 68C 1.4 GHz, Aries	USA	0.3554	14.0	1.3%	2.5%
9	14	Commissariat à l'Energie Atomique (CEA)	Bull	Tera-1000-2 Bull Sequana X1000, Intel Xeon Phi 7250 68C 1.4 GHz, Bull BXI 1.2	France	0.3338	12.0	1.4%	2.8%
10	8	Lawrence Livermore National Laboratory	IBM	Sequoia BlueGene/Q, Power BQC 16C 1.6GHz, Custom	USA	0.3304	17.2	1.6%	1.9%

Source: www.top500.org

Why is Everything so Slow?

- Data: `a[i] = b[j]`
 - Number representation
 - Data ordering and layout
- Loops: `for (...)`
 - Tilings
 - Hierarchies
 - Fusion
- Branches: `if (...)`
 - Extraction
 - Pre-evaluation
 - Predication

Single Data Access as Postal Delivery



Loops, single access

Foreach and Tiling

```
for (i=0; i<N; ++i) {  
    S(i);  
}
```

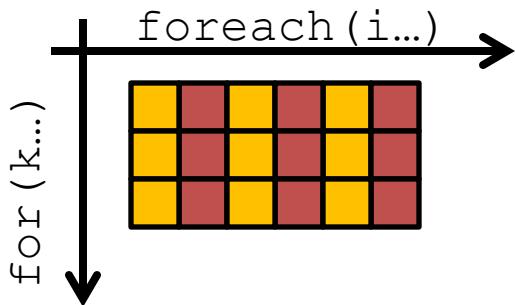
- Thread parallelism in outer loop
- SIMD parallelism in inner loop
- Many different tiling choices

```
foreach( i ∈ [0,N) ) {  
    S(i);  
}
```

```
foreach( i ∈ [0,N/T) ) {  
    foreach( k ∈ [0,T) ) {  
        S( $k+i*T$ );  
    }  
}
```

Tiling with Dependencies

```
for(i=0; i<N; ++i) {
    S(i);
}
```

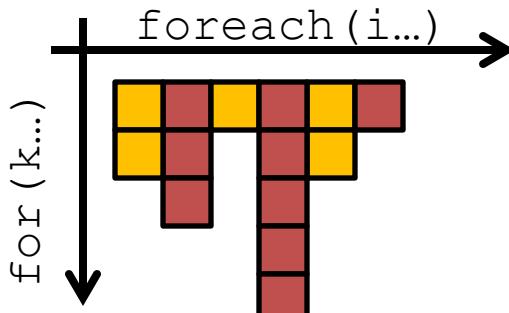


```
foreach( i $\in$  [0, N/T) ) {
    for (k=0; k<T; ++k) {
        S (k+i*T);
    }
}

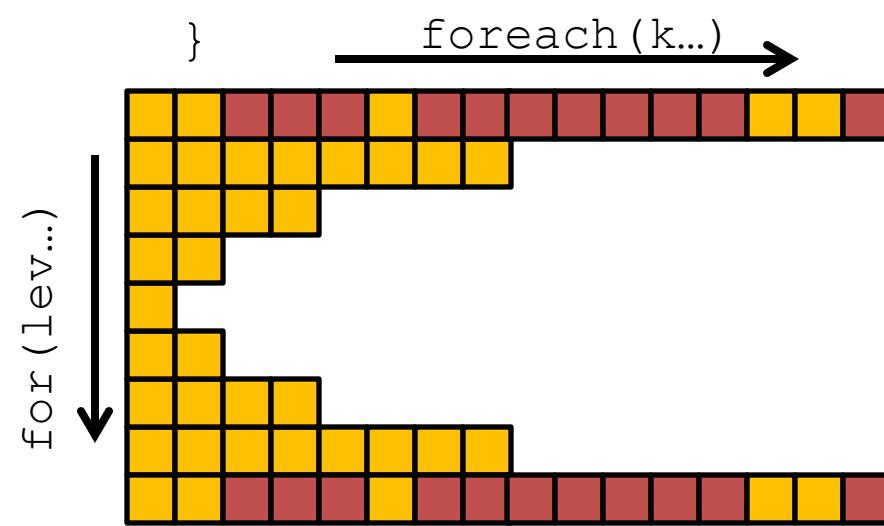
for (k=0; k<T; ++k) {
    foreach( i $\in$  [0, N/T) ) {
        S (k+i*T);
    }
}
```

Segments

```
foreach( i $\in$  [0, M) ) {
    for(k=0; k<L(i); ++k) {
        S(i, k);
    }
}
```

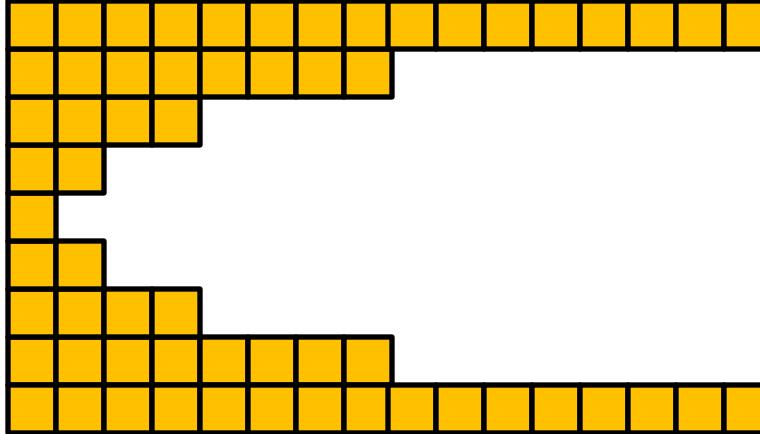


```
for(lev...) {
    foreach(k...) {
        P(lev, k);
    }
}
```

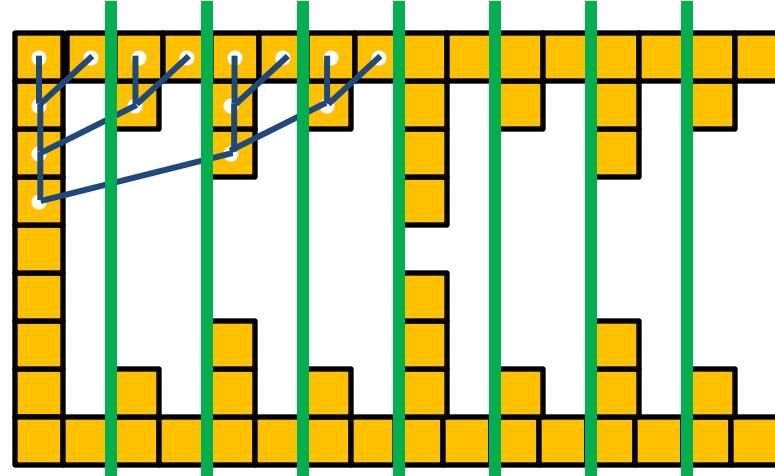


Hierarchies and Communication

```
for (lev...) {  
    foreach (k...) {  
        P (lev, k);  
    }  
}
```



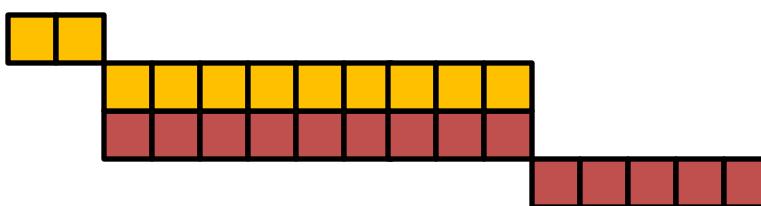
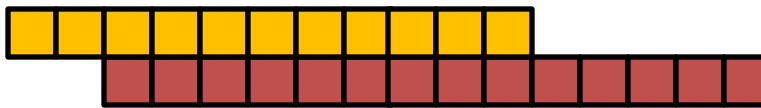
- Reduction, scan, barrier
- Mipmaps, wavelets, multigrid
- Data distribution important



Loops, multiple accesses

Fusion of Two

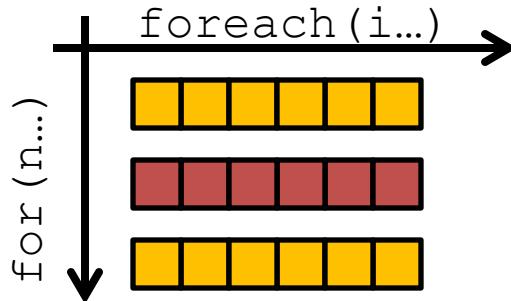
```
foreach( i $\in$  I0 ) {  
    S0(i);  
}  
  
foreach( i $\in$  I1 ) {  
    S1(i);  
}
```



```
foreach( i $\in$  I0\I1 ) {  
    S0(i);  
}  
  
foreach( i $\in$  I0 $\cap$ I1 ) {  
    S0(i); S1(i);  
}  
  
foreach( i $\in$  I1\I0 ) {  
    S1(i);  
}
```

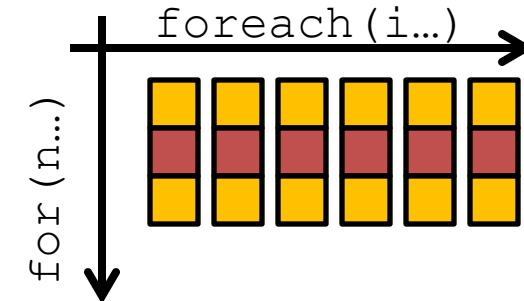
Fusion of Many

```
for(n=0; n<N; ++n) {
    foreach( i $\in I_n$  ) {
        Sn(i);
    }
}
```



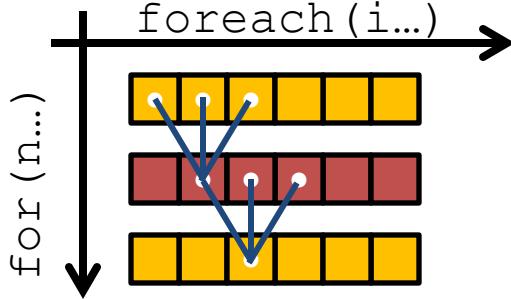
...

```
foreach( i $\in I_0 \cap \dots \cap I_{N-1}$  ) {
    for(n=0; n<N; ++n) {
        Sn(i);
    }
}
```

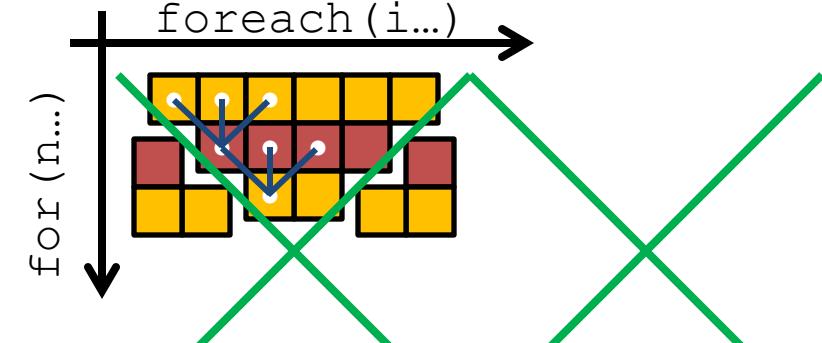


Fusion with Neighbor Dependencies

```
for(n=0; n<N; ++n) {
    foreach( i $\in$ I ) {
        Sn(i);
    }
}
```



```
foreach(tile...) {
    for(n...) {
        foreach( i $\in$ tile ) {
            Sn(i);
        }
    }
}
```



Fusion with Reductions

```
foreach( I→I ) { ... }
```

```
for( I→α ) { ... }
```

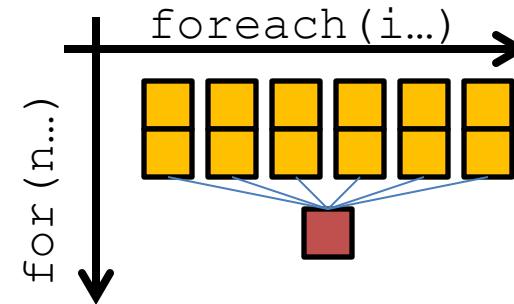
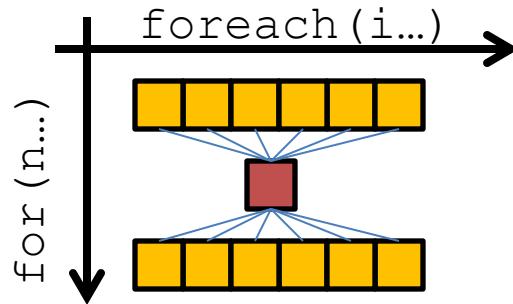
```
foreach( I→I ) { ... α ... }
```

```
foreach( I→I ) { ... }
```

```
foreach( I→I ) { ... }
```

```
for( I→α ) { ... }
```

... α ...



Branches

Extraction

```
foreach( i ∈ I ) {  
    if( cond0(i) ) {  
        S0(i);  
    } else if( cond1(i) ) {  
        S1(i);  
    } else {  
        S2(i);  
    }  
}
```

```
foreach( i ∈ I0(cond0) ) {  
    S0(i);  
}  
foreach( i ∈ I1(cond1) ) {  
    S1(i);  
}  
foreach( i ∈ I2(cond2) ) {  
    S2(i);  
}
```

Pre-Evaluation

```
foreach( i∈I ) { compute( cond0[ ] , cond1[ ] );  
    if( cond0(i) ) { S0(i); } else if( cond1(i) ) { S1(i); } else { S2(i); } }  
  
foreach( i∈I ) { if( cond0[i] ) { S0(i); } else if( cond1[i] ) { S1(i); } else { S2(i); } }
```

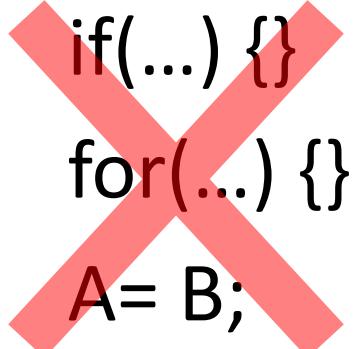
Predication

```
foreach( i∈I ) {  
    if( cond0(i) ) {  
        v= S0(i);  
    } else if( cond1(i) ) {  
        v= S1(i);  
    } else {  
        v= S2(i);  
    }  
}  
  
foreach( i∈I ) {  
    v0= S0(i);  
    v1= S1(i);  
    v2= S2(i);  
    v= selector(i, v0, v1, v2);  
}
```

Simple Rules

Golden Rules for High Performance Code

- Do not use branches
- Do not use loops
- Do not copy data

A large red X mark is positioned to the right of the three rules, indicating that each of the actions listed is to be avoided.

if(...) {}
for(...) {}
A= B;

Rules of Thumb for High Performance Code

- **Avoid** branches in loops `if(...){}`
- **Avoid** general loops `for(...){}`
- **Avoid** data copies `A= B;`
- **Employ** clever algorithms

Conclusions

- Hardware(HW) – Software(SW)
 - Hardware designs highly specialized
 - Language constructs too general
 - Mismatch of SW to HW
- Algorithms
 - Important to avoid obvious donts
 - Some very efficient patterns exist
 - General cases execute poorly
- **Many things to be discovered !**



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