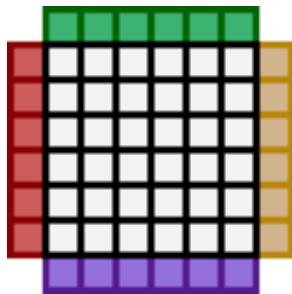


Lessons Learned in Array Programming: from ZPL to Chapel

Brad Chamberlain
Chapel Team, Cray Inc.
ARRAY 2016, June 14, 2016



Safe Harbor Statement

This presentation may contain forward-looking statements that are based on our current expectations. Forward looking statements may include statements about our financial guidance and expected operating results, our opportunities and future potential, our product development and new product introduction plans, our ability to expand and penetrate our addressable markets and other statements that are not historical facts. These statements are only predictions and actual results may materially vary from those projected. Please refer to Cray's documents filed with the SEC from time to time concerning factors that could affect the Company and these forward-looking statements.



My Background

Education:



- Earned Ph.D. from University of Washington CSE in 2001
- Remain associated with UW CSE as an Affiliate Professor

Industrial Experience:

- Currently a Principal Engineer at Cray Inc.
- Also spent an educational year at a start-up between UW and Cray

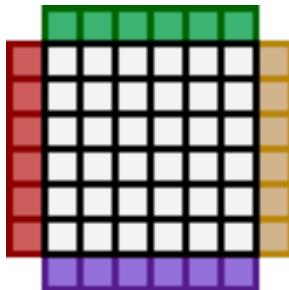
My R&D Interests

Designing and Implementing Parallel Languages

- targeting HPC (High-Performance Computing) system scales
- making use of array abstractions
(as well as other abstractions)

Parallel Array Languages I've Worked on:

ZPL: at UW CSE



Chapel: at Cray



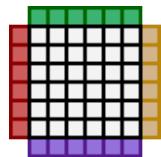
Chapel's Founders / Relationship to ZPL

Hans Zima

*Vienna Fortran, HPF
Fortran-oriented
Performance
Minimal features*

David Callahan

*MTA C, Fortran
Multithreading
Generality
User-optimizable*



Brad Chamberlain

*ZPL
Array Programming
Syntactic performance model
SPMD execution*

John Plevyak

*D, Python, OCaml
Type inference
Generics
OOP*



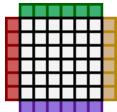
Today's Talk

Theme:

- Comparison of array features in ZPL vs. Chapel
 - and by extension, differences between academic vs. practical languages
 - ZPL: very pure, focused language (“array-based data parallelism”)
 - Chapel: very general, intended for adoption (“any parallelism, including arrays”)

Outline:

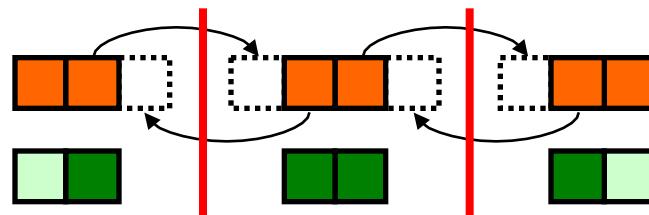
- Background
- ZPL
 - Arrays in ZPL
 - ZPL’s greatest hits
 - ZPL’s drawbacks
- Chapel arrays (learning from ZPL’s mistakes)
- Q&A / Discussion



Local-view vs. Global-view

Local-view:

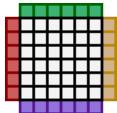
- code describes per-task behavior
- programmer manages coordination details



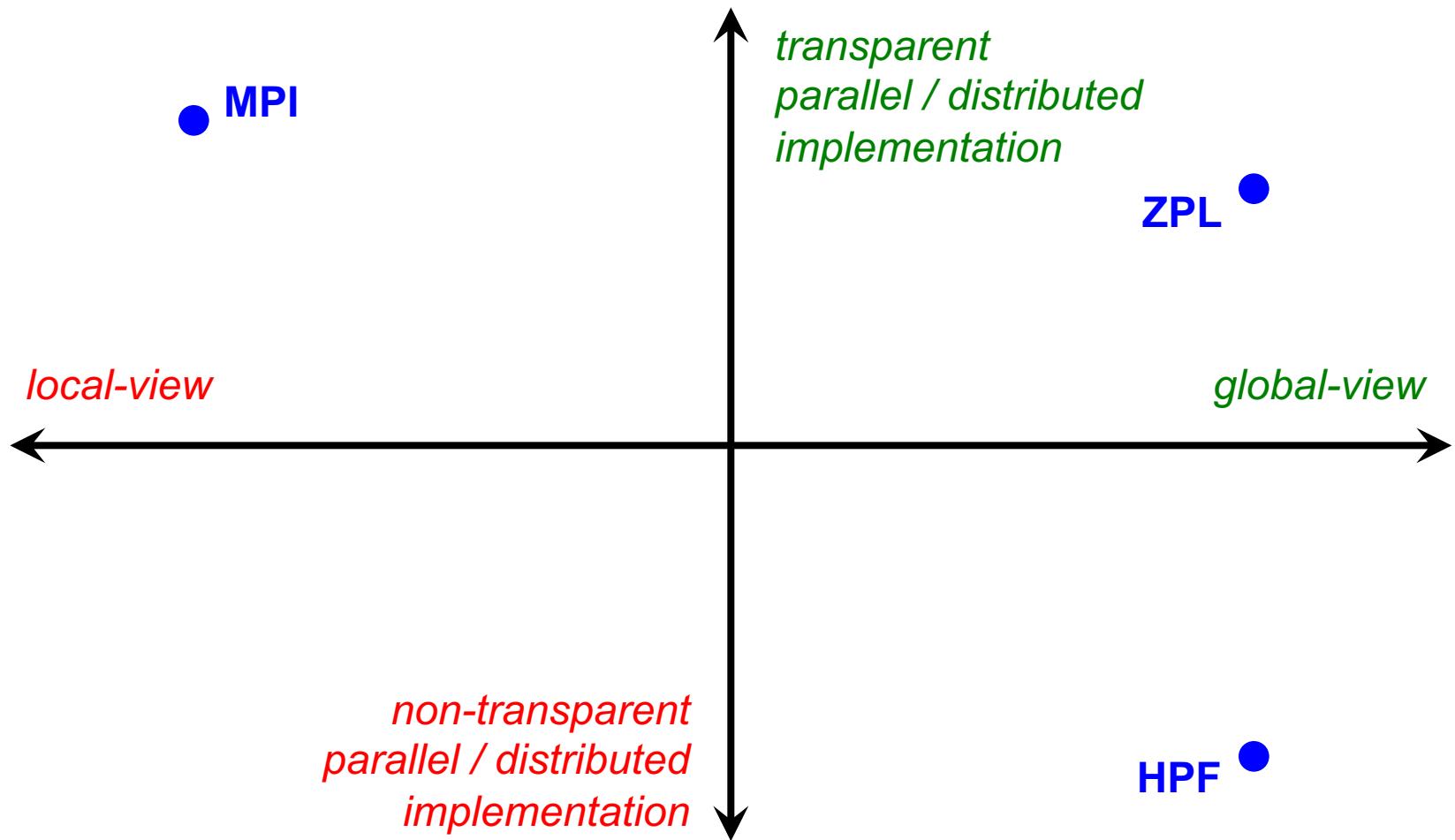
Global-view:

- code describes algorithm as a whole
- lower layers manage coordination
(compiler, runtime, libraries)





Parallel Programming Stereotypes



ZPL Factsheet

ZPL: an array-based data-parallel language

Developed at: University of Washington

Timeframe: 1991 – 2003 (can still download today)

Target systems: 1990's-era HPC systems

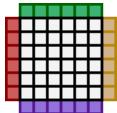
- clusters of commodity processors or SMPs
- custom parallel architectures:
 - Cray T3E, KSR, SGI Origin, IBM SP2, Sun Enterprise, ...

Related languages: HPF

Main concepts:

- abstract machine model: *the CTA*
- data parallelism via *regions* and arrays
- *WYSIWYG performance model*



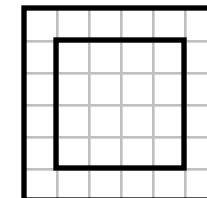


Regions

Regions: index sets that...

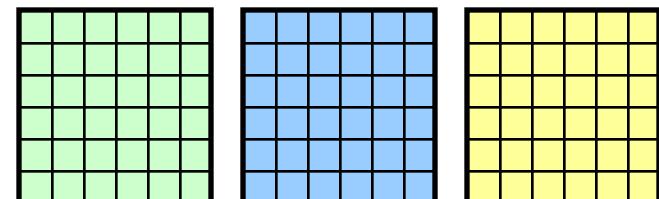
...can be named

```
region      R = [1..n ,1..n ];  
            BigR = [0..n+1,0..n+1];
```



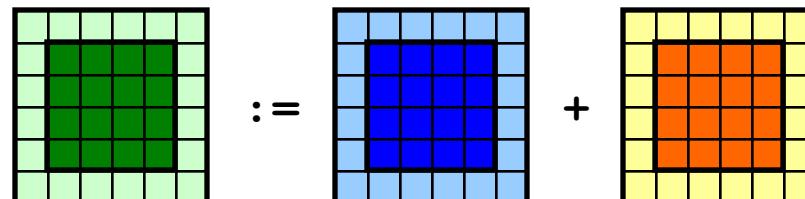
...are used to declare *parallel arrays*

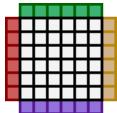
```
var A, B, C: [BigR] integer;
```



...specify indices for a statement's array references

```
[R] A := B + C;
```





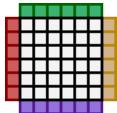
Regions Eliminate Redundancy

$$\begin{array}{c} \text{[green]} \\ \text{[blue]} \\ \text{[orange]} \end{array} := \begin{array}{c} \text{[green]} \\ \text{[blue]} \\ \text{[orange]} \end{array} + \begin{array}{c} \text{[green]} \\ \text{[blue]} \\ \text{[orange]} \end{array}$$

C: **for** (i=1; i<=n; i++) {
 for (j=1; j<=n; j++) {
 A[i][j] = B[i][j] + C[i][j];
 }
 }

F90: A(1:n,1:n) = B(1:n,1:n) + C(1:n,1:n)

ZPL: [1..n,1..n] A := B + C;
or: [R] A := B + C;



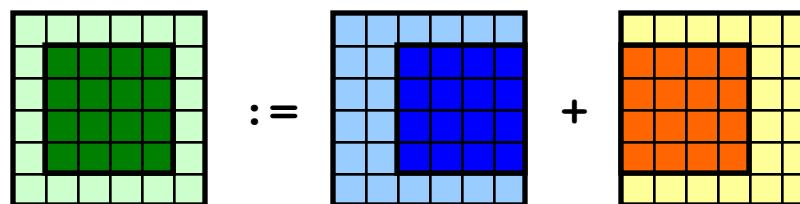
Array Operators

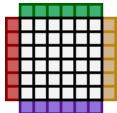
Array Operators: modify the current region's index set for an array reference

E.g., *@-operator* translates indices by a *direction*:

```
direction east = [0, 1];  
            west = [0, -1];
```

```
[R] A := B@east + C@west;
```





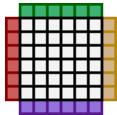
Regions Emphasize Differences

$$\begin{array}{c} \text{[3x3 green]} \\ \text{[3x3 blue]} \end{array} := \begin{array}{c} \text{[3x3 blue]} \\ \text{[3x3 orange]} \end{array} + \begin{array}{c} \text{[3x3 orange]} \end{array}$$

```
C:    for (i=1; i<=n; i++) {  
        for (j=1; j<=n; j++) {  
            A[i][j] = B[i][j+1] + C[i][j-1];  
        }  
    }
```

F90: $A(1:n, 1:n) = B(1:n, 2:n+1) + C(1:n, 0:n-1)$

ZPL: $[1..n, 1..n] A := B@[0, 1] + C@[0, -1];$
or: [R] A := B@east + C@west;



More on Regions / Parallel Arrays

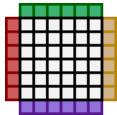
- Region scopes can nest:

```
[R] begin
    A := Index1 + Index2 / 10.0;
    B := A@east;
    [i, 1..n] B := 0.0;
    foo(B);
end;
```

- Constrained, by design:

- Parallel arrays do not support “normal” indexing
- Regions do not support direct iteration

~~for (i, j) in R do A[i, j] = B[i, j+1];~~



Parallel Interpretation of Regions

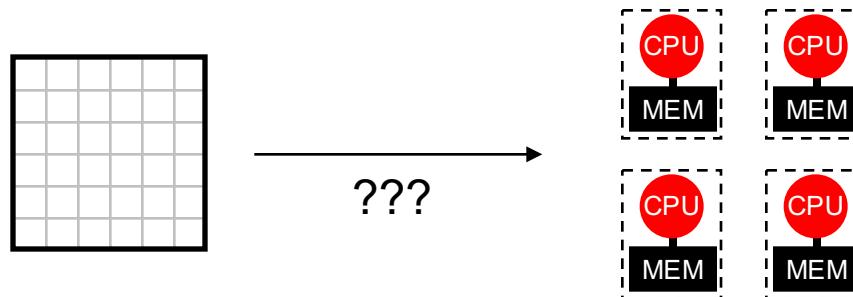
- Users specify virtual processor grid at runtime

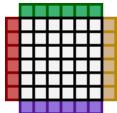
> ./a.out -p4 (*uses a 2x2 grid*)

> ./a.out -p4 -r1 (*uses a 1x4 grid*)

- Region indices are distributed to this grid

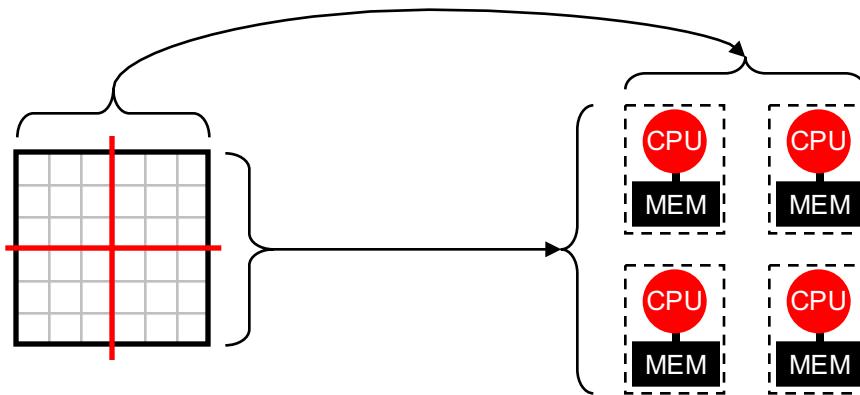
- defines data distribution for arrays
 - defines work distribution for computations





Region Distribution

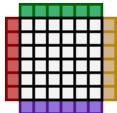
1) Regions are block-distributed:



2) *Interacting regions* are distributed identically

$$\begin{matrix} \text{[R] } & A := B + C; \\ \begin{matrix} \text{[R] } & A := B + C; \end{matrix} & \begin{matrix} \text{[R] } & A := B + C; \end{matrix} \end{matrix}$$

\therefore 



ZPL's Performance Model

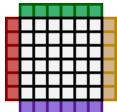
Distribution rules imply a performance model:

- Traditional operators are perfectly parallel

$$[R] \ A := B + C;$$

- Array operators indicate likely communication
 - of a particular style

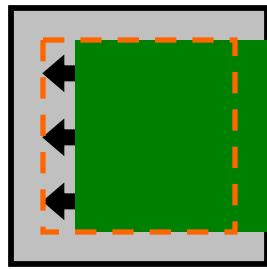
$$[R] \ A := B @east + C @west;$$



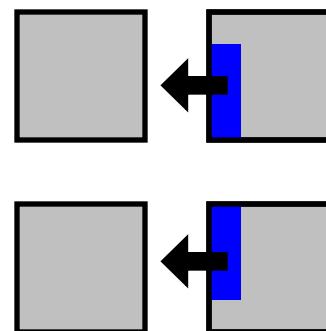
@-induced Communication

- @ is used to refer to neighboring elements.
- data must be transferred to neighboring processors

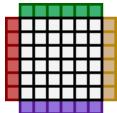
[R] A := A@east;



global view



local view

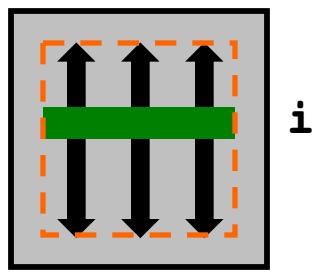


Flood Communication

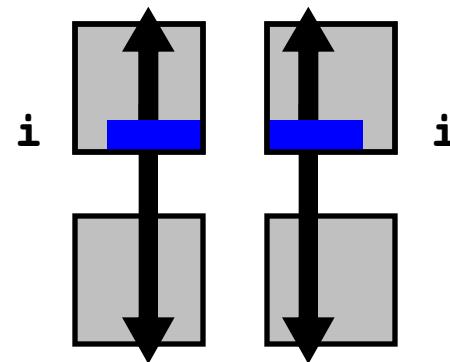
Floods replicate data across array dimensions

- data must be broadcast over sub-dimensions of the processor grid

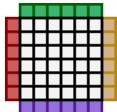
[R] $A := >>[i,] A;$



global view



local view

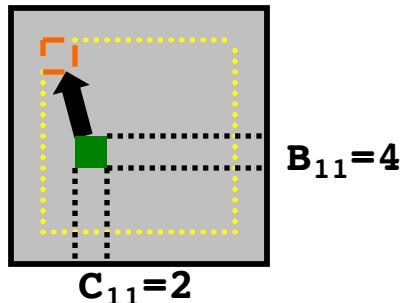


Remap Communication

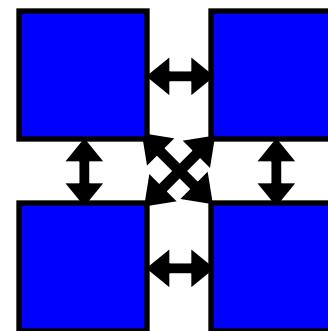
Remap arbitrarily re-arranges data

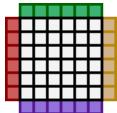
- indexes into an array with other arrays
- tends to require all-to-all communication

[R] $A := A \# [B, C];$



global view





Array Operator Summary

| operator | effect | sample | communication |
|-----------|----------------------------|--------------|--------------------|
| @ | translate indices | $A@east$ | point-to-point |
| flood | replicate array elements | $>> [i,] A$ | sub-grid broadcast |
| reduction | collapse array elements | $+<< [R] A$ | sub-grid reduction |
| scan | parallel scan | $+ A$ | parallel prefix |
| remap | arbitrary gather / scatter | $A\# [X, Y]$ | all-to-all |

This is what we refer to as ZPL's *WYSIWYG performance model*: Communication implications are visible in a program's syntax.

ZPL's Greatest Hits: Hierarchical Arrays in NAS MG



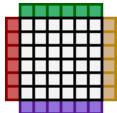
COMPUTE

|

STORE

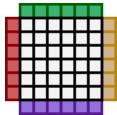
|

ANALYZE

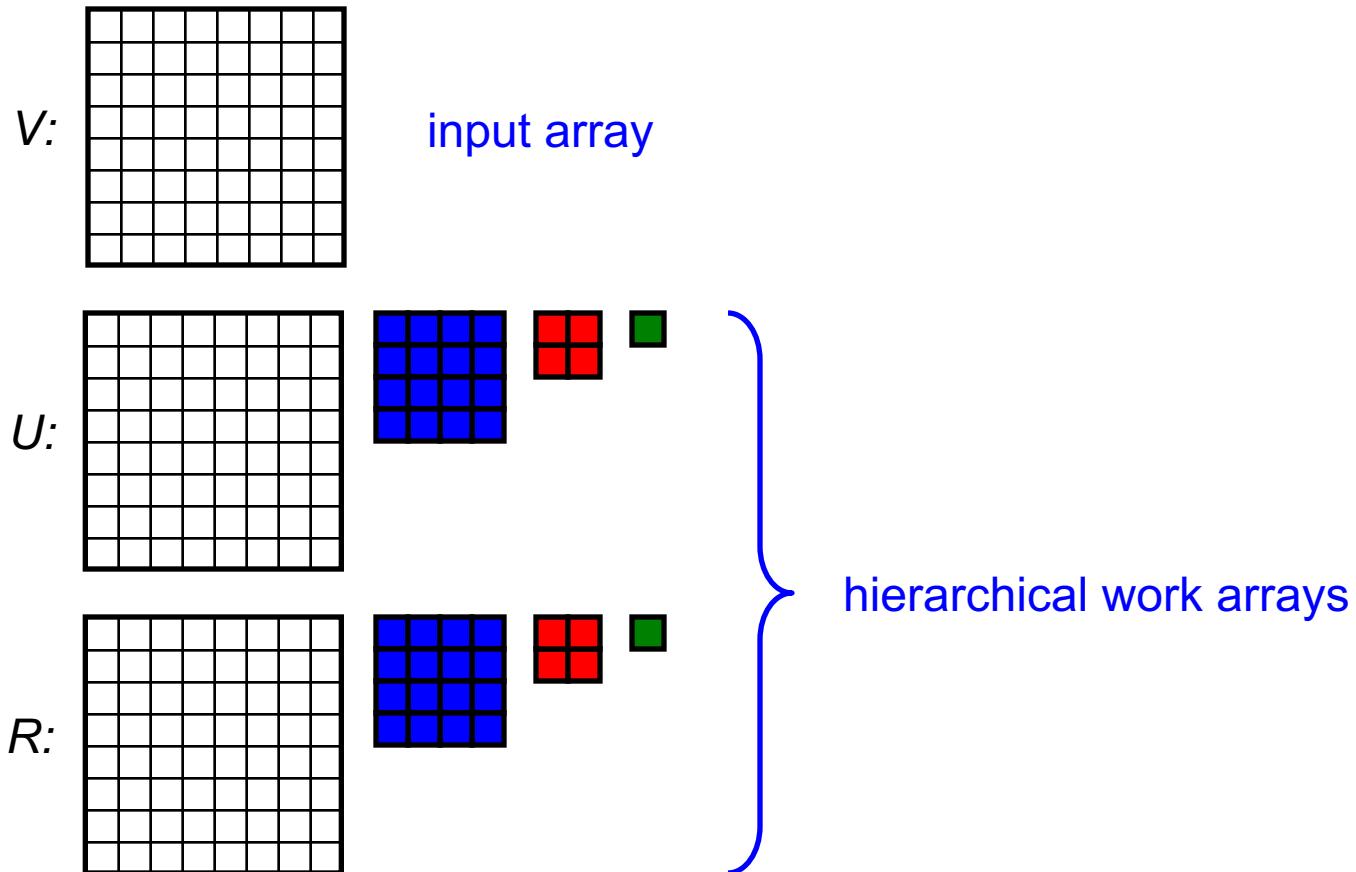


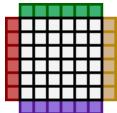
The NAS MG Benchmark

Mathematically: use a 3D multigrid method to find an approximate solution to a discrete Poisson problem ($\nabla^2 u = v$)



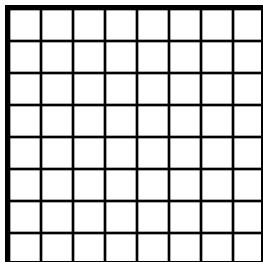
MG's arrays



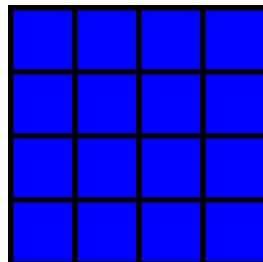


Hierarchical Arrays

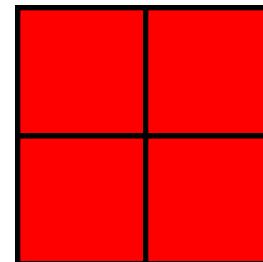
conceptually:



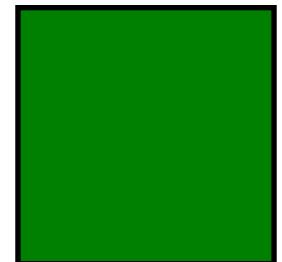
level 1



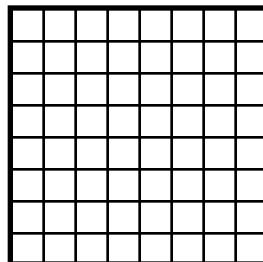
level 2



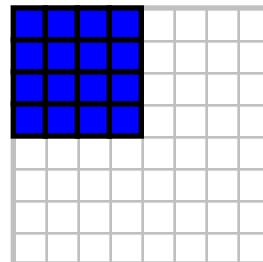
level 3



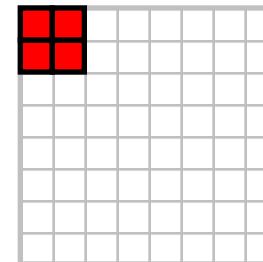
*dense
indexing:*



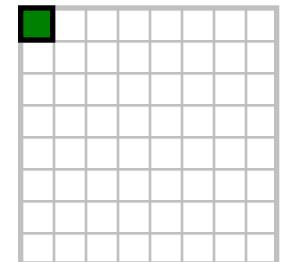
$(1:8, 1:8)$



$(1:4, 1:4)$

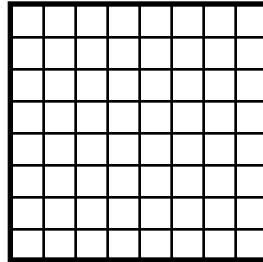


$(1:2, 1:2)$

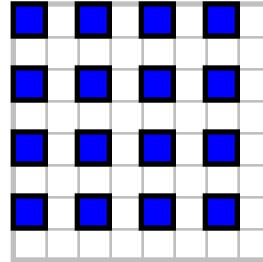


$(1:1, 1:1)$

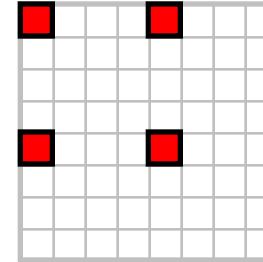
*strided
indexing:*



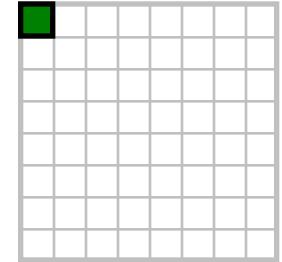
$(1:8:1, 1:8:1)$



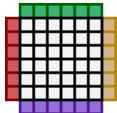
$(1:8:2, 1:8:2)$



$(1:8:4, 1:8:4)$

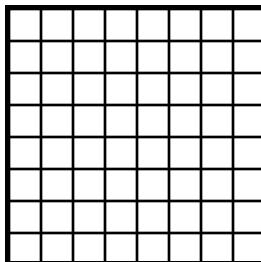


$(1:8:8, 1:8:8)$

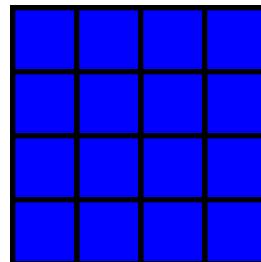


Hierarchical Arrays

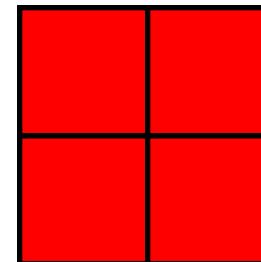
conceptually:



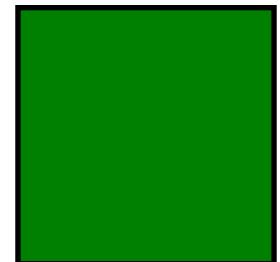
level 1



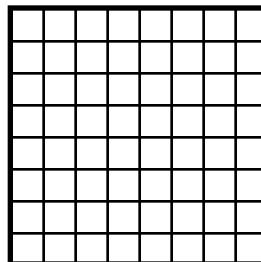
level 2



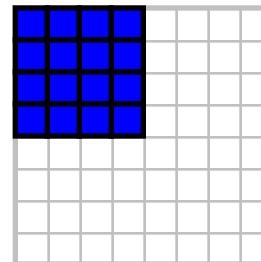
level 3



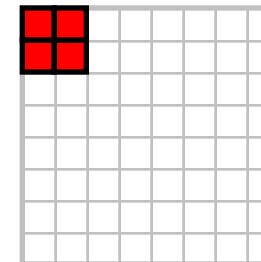
*dense
indexing:*



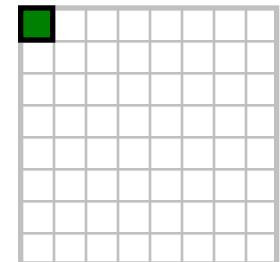
$(1:8, 1:8)$



$(1:4, 1:4)$

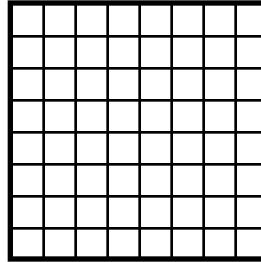


$(1:2, 1:2)$

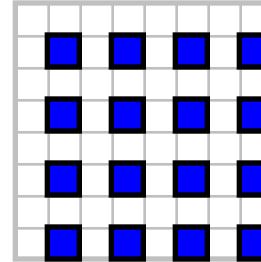


$(1:1, 1:1)$

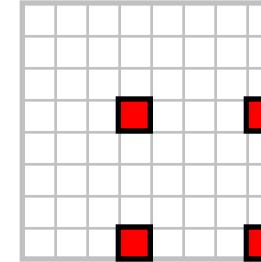
*strided
indexing:*



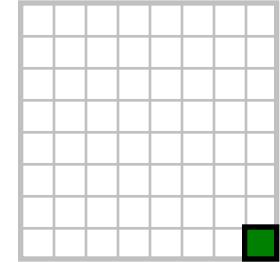
$(1:8:1, 1:8:1)$



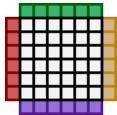
$(2:8:2, 2:8:2)$



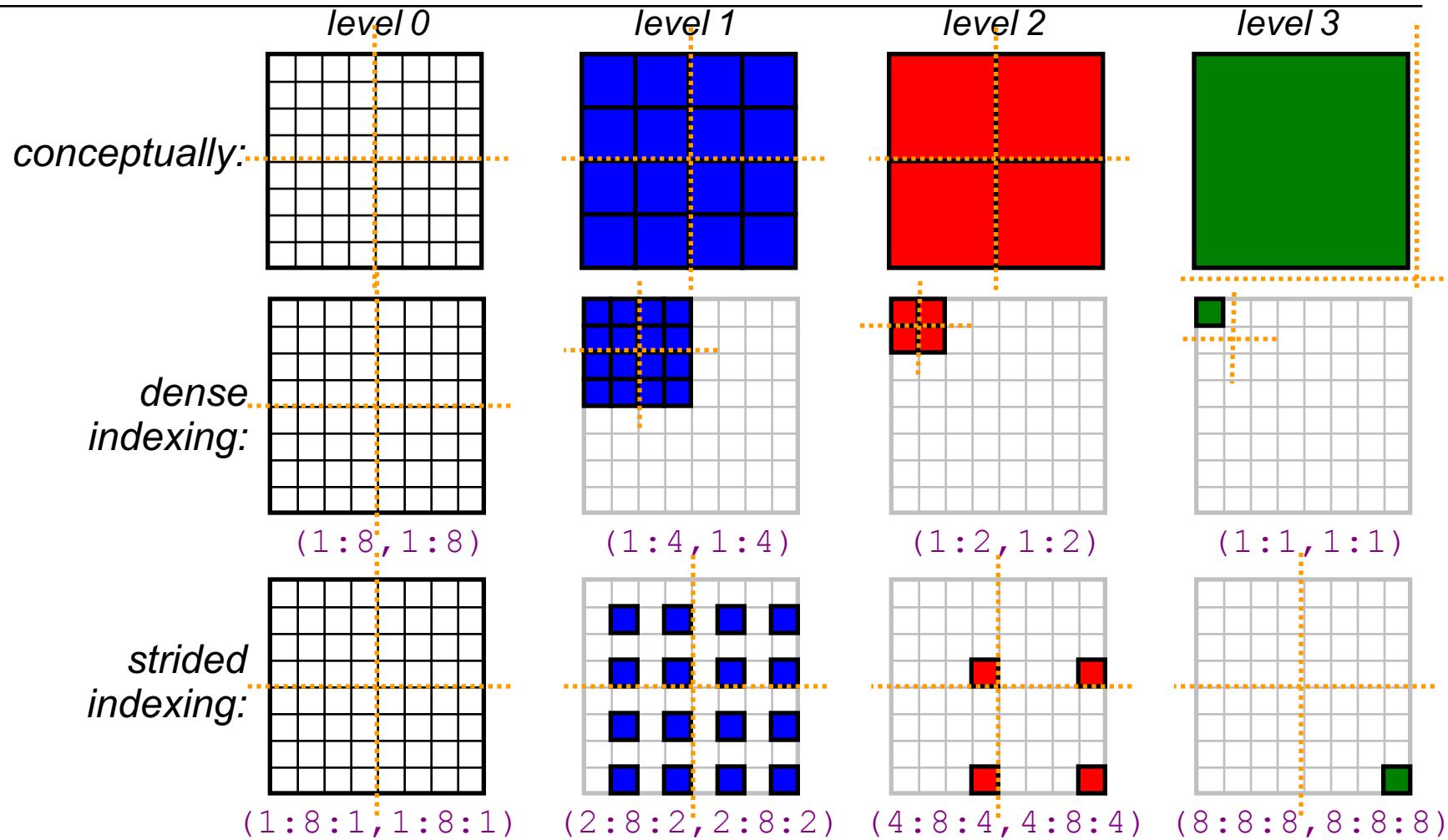
$(4:8:4, 4:8:4)$

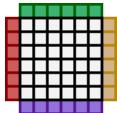


$(8:8:8, 8:8:8)$

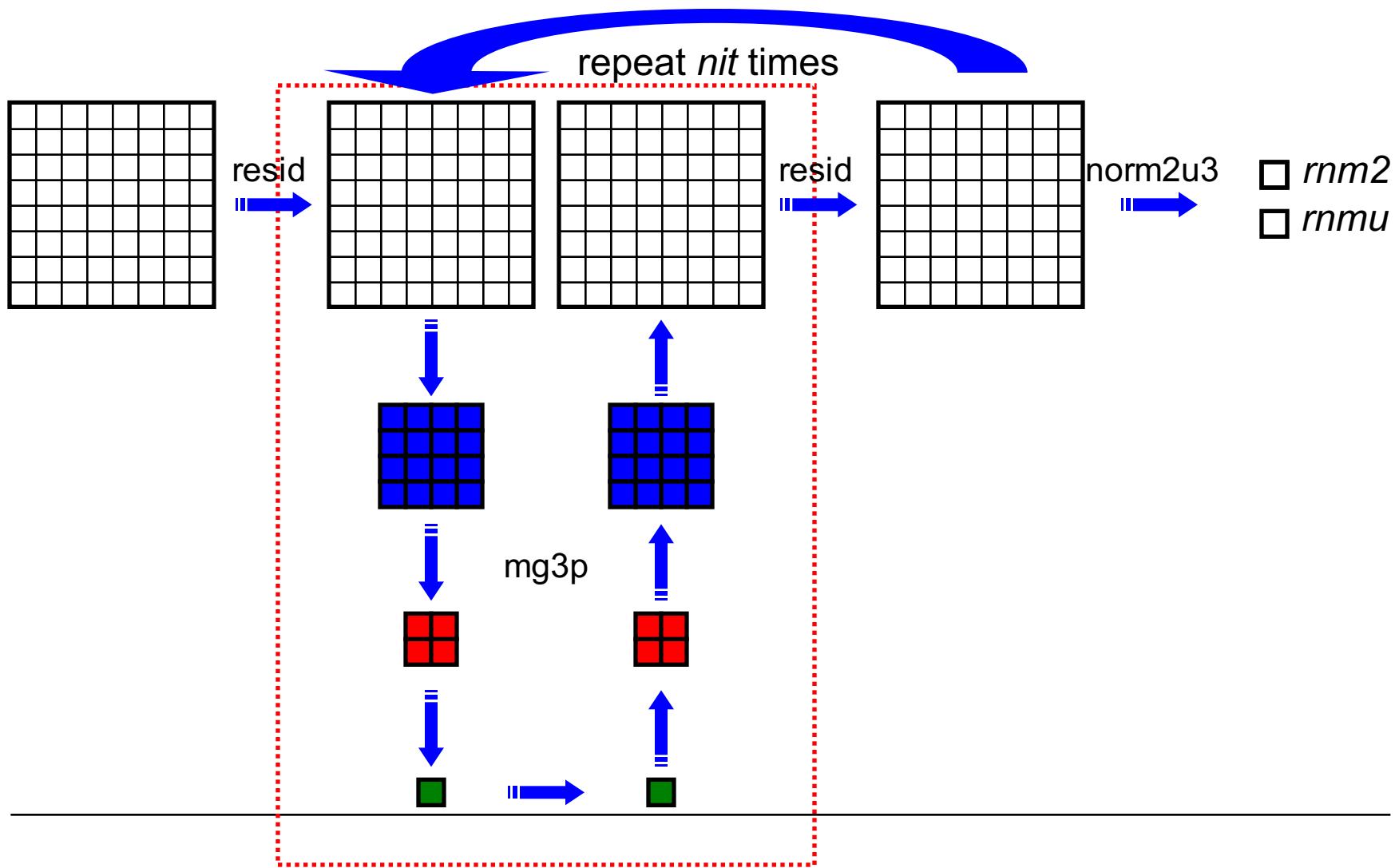


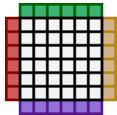
Distributed Hierarchical Arrays



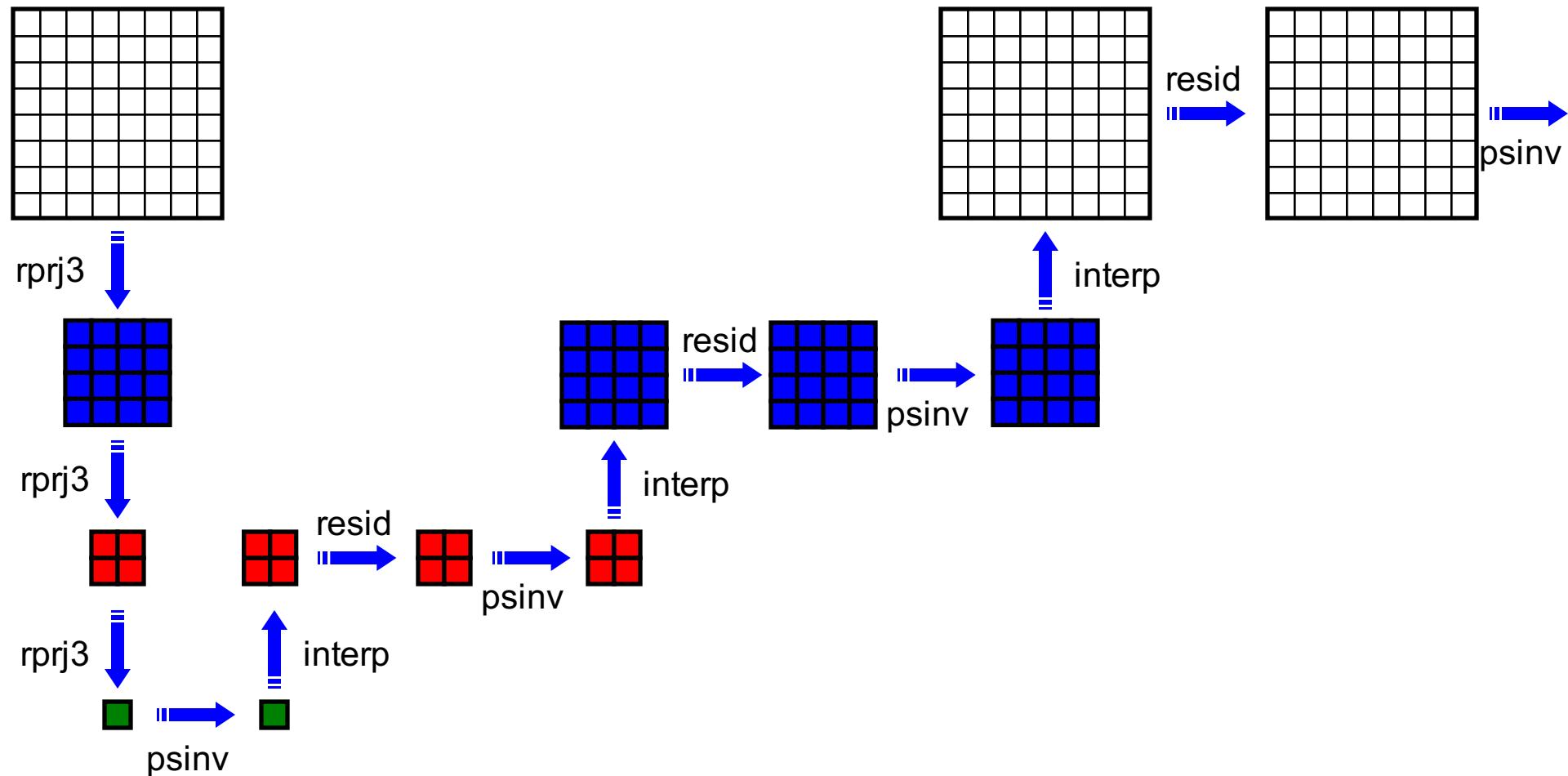


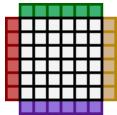
MG's Timed Portion



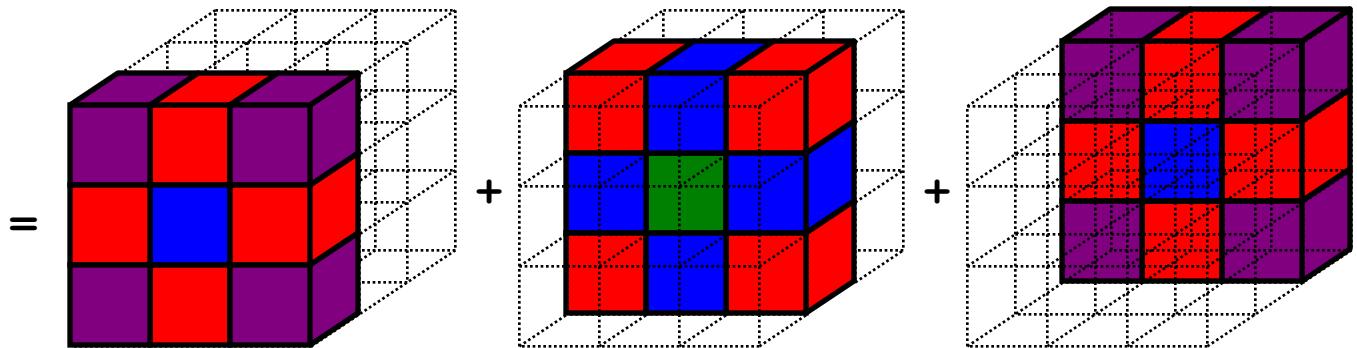
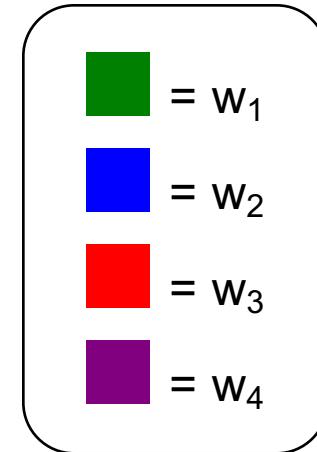
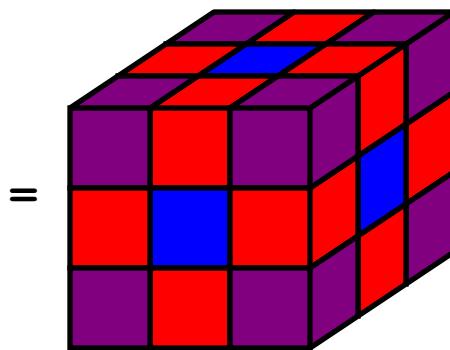
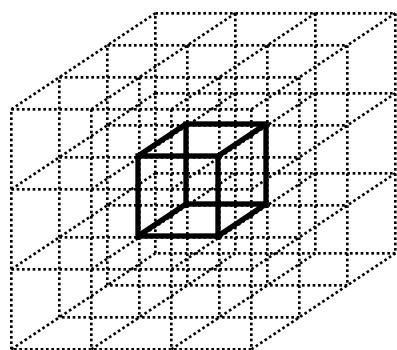


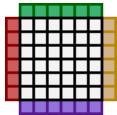
MG's Guts (*mg3P*)





27-point stencils





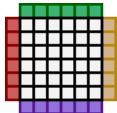
rprj3(S, R)

conceptually:

$$\begin{matrix} \begin{matrix} & & & \\ & & & \\ & & & \\ & & & \\ & & & \end{matrix} & = & \text{convolve}\left(\begin{matrix} & & & \\ & & & \\ & & \text{blue} & \\ & & & \\ & & & \end{matrix}, \begin{matrix} & & & \\ & & & \\ & & & \\ & & & \\ & & & \end{matrix}\right) \\ S & & R \end{matrix}$$

*strided
indexing:*

$$\begin{matrix} \begin{matrix} & & & \\ & & & \\ & \text{gray} & & \\ & & & \\ & & & \end{matrix} & = & \sum \begin{matrix} & & & \\ & & & \\ & & \text{blue} & \\ & & & \\ & & & \end{matrix} \\ S & & R \end{matrix}$$



rprj3 at other levels

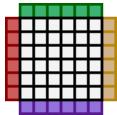
conceptually:

$$\begin{array}{|c|c|} \hline \text{gray} & \text{white} \\ \hline \text{white} & \text{white} \\ \hline \end{array} = \sum \begin{array}{|c|c|c|c|} \hline \text{purple} & \text{red} & \text{purple} & \text{white} \\ \hline \text{red} & \text{blue} & \text{red} & \text{white} \\ \hline \text{purple} & \text{red} & \text{purple} & \text{white} \\ \hline \text{white} & \text{white} & \text{white} & \text{white} \\ \hline \end{array}$$

*strided
indexing:*

$$\begin{array}{|c|c|c|c|} \hline \text{---} & \text{---} & \text{---} & \text{---} \\ \hline \text{---} & \text{---} & \text{---} & \text{---} \\ \hline \text{---} & \text{---} & \text{---} & \text{---} \\ \hline \text{---} & \text{---} & \text{---} & \text{---} \\ \hline \text{---} & \text{---} & \text{---} & \text{---} \\ \hline \end{array} = \sum \begin{array}{|c|c|c|c|} \hline \text{purple} & \text{red} & \text{purple} & \text{white} \\ \hline \text{red} & \text{blue} & \text{red} & \text{white} \\ \hline \text{purple} & \text{red} & \text{purple} & \text{white} \\ \hline \text{white} & \text{white} & \text{white} & \text{white} \\ \hline \end{array}$$

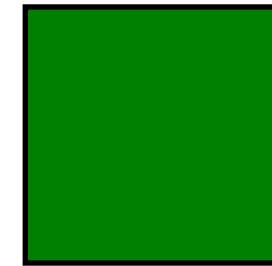
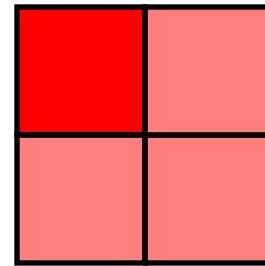
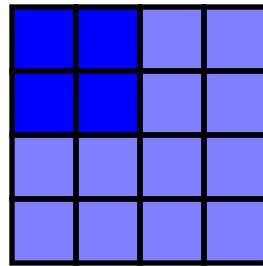
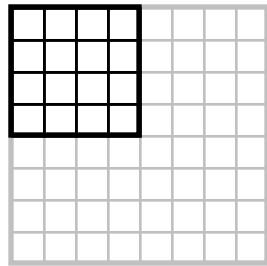
S *R*



Per-processor Data Allocation

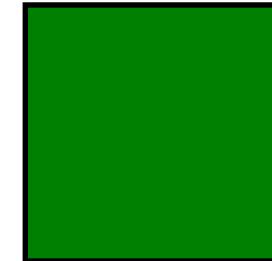
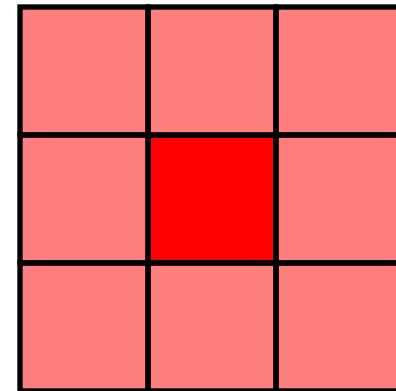
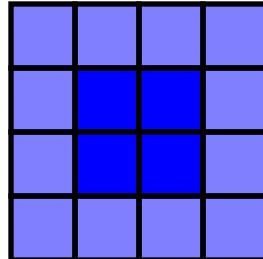
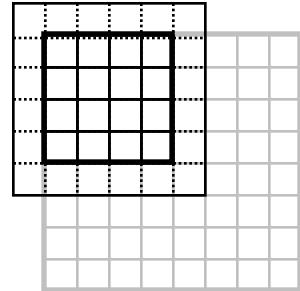
In addition to its local block of values...

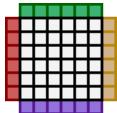
A



...each processor allocates ghost cells to cache neighboring values

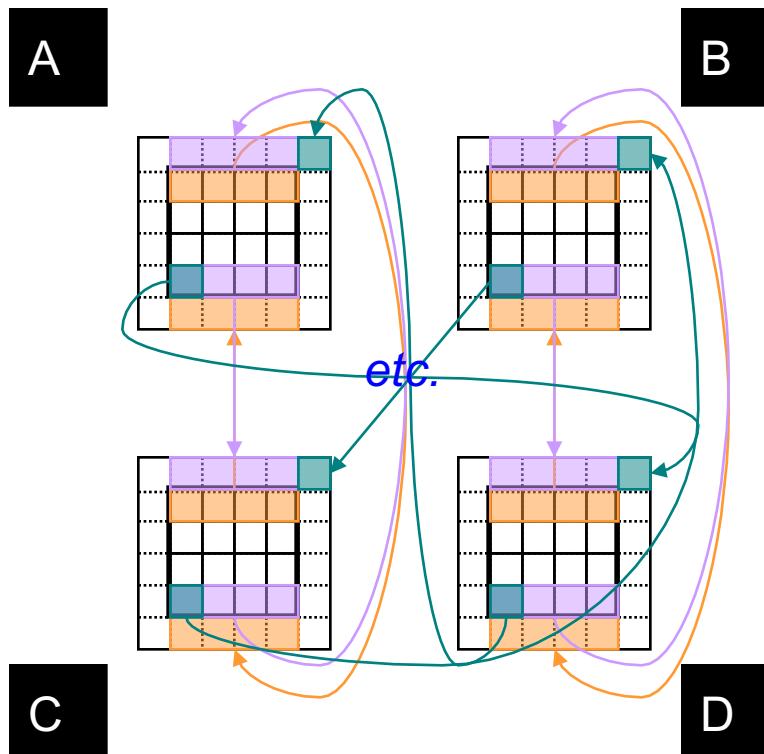
A





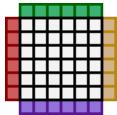
Stencil Communication

Prior to computing a stencil, communication is typically required to refresh the ghost cells



Notes:

- Lots of optimization opportunities (e.g., comm/comp overlap, bulk transfers)
- Have to eventually start skipping processors at coarser levels



Distributed *rprj3* in Fortran + MPI

```
subroutine rprj3(r,m1k,m2k,m3k,s,m1j,m2j,m3j,k)
implicit none
include 'cafnpb.h'
include 'globals.h'

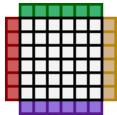
integer m1k, m2k, m3k, m1j, m2j, m3j, k
double precision r(m1k,m2k,m3k), s(m1j,m2j,m3j)    >
integer j3, j2, j1, i3, i2, i1, d1, d2, d3, j          >
double precision x1(m), y1(m), x2,y2                  >

if(m1k.eq.3)then
  d1 = 2
else
  d1 = 1
endif

if(m2k.eq.3)then
  d2 = 2
else
  d2 = 1
endif

if(m3k.eq.3)then
  d3 = 2
else
  d3 = 1
endif

do   j3=2,m3j-1
  i3 = 2*j3-d3
  do   j2=2,m2j-1
    i2 = 2*j2-d2
    do   j1=2,m1j
      i1 = 2*j1-d1
      x1(i1-1) = r(i1-1,i2-1,i3 ) + r(i1-1,i2+1,i3 )
                     + r(i1-1,i2, i3-1) + r(i1-1,i2, i3+1)
      y1(i1-1) = r(i1-1,i2-1,i3-1) + r(i1-1,i2-1,i3+1)
                     + r(i1-1,i2+1,i3-1) + r(i1-1,i2+1,i3+1)
    enddo
    do   j1=2,m1j-1
      i1 = 2*j1-d1
      y2 = r(i1, i2-1,i3-1) + r(i1, i2-1,i3+1)
                     + r(i1, i2+1,i3-1) + r(i1, i2+1,i3+1)
      x2 = r(i1, i2-1,i3 ) + r(i1, i2+1,i3 )
                     + r(i1, i2, i3-1) + r(i1, i2, i3+1)
      s(j1,j2,j3) =
        0.5D0 * r(i1,i2,i3)
        + 0.25D0 * (r(i1-1,i2,i3) + r(i1+1,i2,i3) + x2)
        + 0.125D0 * ( x1(i1-1) + x1(i1+1) + y2)
        + 0.0625D0 * ( y1(i1-1) + y1(i1+1) )
    enddo
  enddo
enddo
j = k-1
call comm3(s,m1j,m2j,m3j,j)
return
end
```



Local-view *rprj3* in Fortran + MPI

```
subroutine rprj3(r,m1k,m2k,m3k,s,m1j,m2j,m3j,k)
implicit none
include 'cafnpb.h'
include 'globals.h'

integer m1k, m2k, m3k, m1j, m2j, m3j, k
double precision r(m1k,m2k,m3k), s(m1j,m2j,m3j) >
integer j3, j2, j1, i3, i2, i1, d1, d2, d3, j >
double precision x1(m), y1(m), x2,y2 >

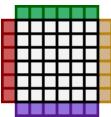
if(m1k.eq.3)then
  d1 = 2
else
  d1 = 1
endif

if(m2k.eq.3)then
  d2 = 2
else
  d2 = 1
endif

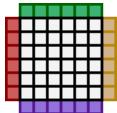
if(m3k.eq.3)then
  d3 = 2
else
  d3 = 1
endif

do j3=2,m3j-1
  i3 = 2*j3-d3
  do j2=2,m2j-1
    i2 = 2*j2-d2
    do j1=2,m1j
      i1 = 2*j1-d1
      x1(i1-1) = r(i1-1,i2-1,i3) + r(i1-1,i2+1,i3)
      & + r(i1-1,i2, i3-1) + r(i1-1,i2, i3+1)
      y1(i1-1) = r(i1-1,i2-1,i3-1) + r(i1-1,i2-1,i3+1)
      & + r(i1-1,i2+1,i3-1) + r(i1-1,i2+1,i3+1)
    enddo
    do j1=2,m1j-1
      i1 = 2*j1-d1
      y2 = r(i1, i2-1,i3-1) + r(i1, i2-1,i3+1)
      & + r(i1, i2+1,i3-1) + r(i1, i2+1,i3+1)
      x2 = r(i1, i2-1,i3) + r(i1, i2+1,i3)
      & + r(i1, i2, i3-1) + r(i1, i2, i3+1)
      s(j1,j2,j3) =
        0.5D0 * r(i1,i2,i3)
        & + 0.25D0 * (r(i1-1,i2,i3) + r(i1+1,i2,i3) + x2)
        & + 0.125D0 * ( x1(i1-1) + x1(i1+1) + y2)
        & + 0.0625D0 * ( y1(i1-1) + y1(i1+1) )
    enddo
  enddo
enddo
j = k-1
call comm3(s,m1j,m2j,m3j,j)
return
end
```





comm3: Communication in MPI

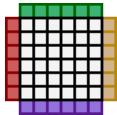


Global-view *rprj3* in ZPL

```

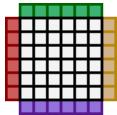
procedure rprj3(var S,R: [, , ] double;
                d: array [] of direction);
begin
  S := 0.5000 * R +
        0.2500 * (R@^d[ 1, 0, 0] + R@^d[ 0, 1, 0] + R@^d[ 0, 0, 1] +
                   R@^d[ -1, 0, 0] + R@^d[ 0, -1, 0] + R@^d[ 0, 0, -1] +
        0.1250 * (R@^d[ 1, 1, 0] + R@^d[ 1, 0, 1] + R@^d[ 0, 1, 1] +
                   R@^d[ 1, -1, 0] + R@^d[ 1, 0, -1] + R@^d[ 0, 1, -1] +
                   R@^d[ -1, 1, 0] + R@^d[ -1, 0, 1] + R@^d[ 0, -1, 1] +
                   R@^d[ -1, -1, 0] + R@^d[ -1, 0, -1] + R@^d[ 0, -1, -1]) +
        0.0625 * (R@^d[ 1, 1, 1] + R@^d[ 1, 1, -1] +
                   R@^d[ 1, -1, 1] + R@^d[ 1, -1, -1] +
                   R@^d[ -1, 1, 1] + R@^d[ -1, 1, -1] +
                   R@^d[ -1, -1, 1] + R@^d[ -1, -1, -1]);
end;

```



rprj3 kernel in Fortran, naively

```
do j3=2,m3j-1
  i3 = 2*j3-d3
  do j2=2,m2j-1
    i2 = 2*j2-d2
    do j1=2,m1j-1
      i1 = 2*j1-d1
      s(j1,j2,j3) =
>        0.5D0 * r(i1,i2,i3)
>        + 0.25D0 * (r(i1-1,i2,i3) + r(i1+1,i2,i3)
>                      + r(i1, i2-1,i3 ) + r(i1, i2+1,i3 )
>                      + r(i1, i2, i3-1) + r(i1, i2, i3+1))
>        + 0.125D0 * (r(i1-1,i2-1,i3 ) + r(i1-1,i2+1,i3 )
>                      + r(i1-1,i2, i3-1) + r(i1-1,i2 ,i3+1)
>                      + r(i1+1,i2-1,i3 ) + r(i1+1,i2+1,i3 )
>                      + r(i1+1,i2, i3-1) + r(i1+1,i2 ,i3+1))
>                      + r(i1, i2-1,i3-1) + r(i1, i2-1,i3+1)
>                      + r(i1, i2+1,i3-1) + r(i1, i2+1,i3+1))
>        + 0.0625D0 * (r(i1-1,i2-1,i3-1) + r(i1-1,i2-1,i3+1)
>                      + r(i1-1,i2+1,i3-1) + r(i1-1,i2+1,i3+1)
>                      + r(i1+1,i2-1,i3-1) + r(i1+1,i2-1,i3+1)
>                      + r(i1+1,i2+1,i3-1) + r(i1+1,i2+1,i3+1) )
      enddo
    enddo
  enddo
```



Actual *rprj3* Fortran code

```
subroutine rprj3(r,m1k,m2k,m3k,s,m1j,
implicit none
include 'cafnpb.h'
include 'globals.h'

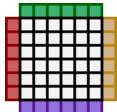
integer m1k, m2k, m3k, m1j, m2j, m3j,
double precision r(m1k,m2k,m3k), s(m1
integer j3, j2, j1, i3, i2, i1, d1, c
double precision x1(m), y1(m), x2,y2

if(m1k.eq.3)then
  d1 = 2
else
  d1 = 1
endif

if(m2k.eq.3)then
  d2 = 2
else
  d2 = 1
endif

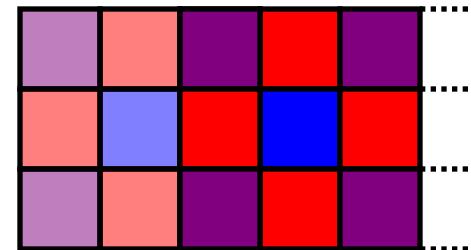
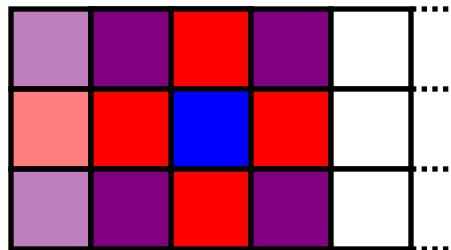
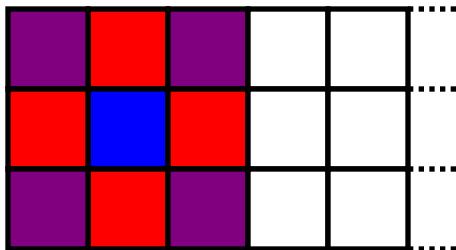
if(m3k.eq.3)then
  d3 = 2
else
  d3 = 1
endif

do    j3=2,m3j-1
      i3 = 2*j3-d3
      do    j2=2,m2j-1
            i2 = 2*j2-d2
            do j1=2,m1j
              i1 = 2*j1-d1
              x1(i1-1) = r(i1-1,i2-1,i3) + r(i1-1,i2+1,i3)
                         + r(i1-1,i2,   i3-1) + r(i1-1,i2,   i3+1)
              y1(i1-1) = r(i1-1,i2-1,i3-1) + r(i1-1,i2-1,i3+1)
                         + r(i1-1,i2+1,i3-1) + r(i1-1,i2+1,i3+1)
            enddo
            do j1=2,m1j-1
              i1 = 2*j1-d1
              y2 = r(i1,   i2-1,i3-1) + r(i1,   i2-1,i3+1)
                         + r(i1,   i2+1,i3-1) + r(i1,   i2+1,i3+1)
              x2 = r(i1,   i2-1,i3)  + r(i1,   i2+1,i3)
                         + r(i1,   i2,   i3-1) + r(i1,   i2,   i3+1)
              s(j1,j2,j3) =
                0.5D0 * r(i1,i2,i3)
                + 0.25D0 * (r(i1-1,i2,i3) + r(i1+1,i2,i3) + x2)
                + 0.125D0 * ( x1(i1-1) + x1(i1+1) + y2)
                + 0.0625D0 * ( y1(i1-1) + y1(i1+1) )
            enddo
          enddo
        enddo
```

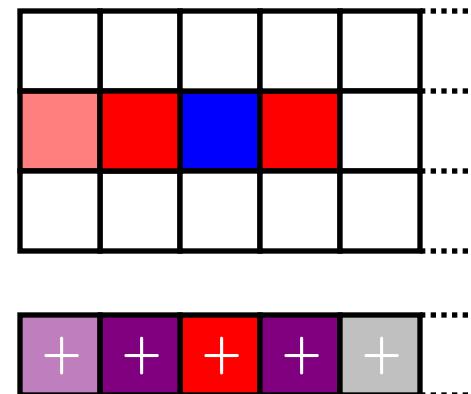
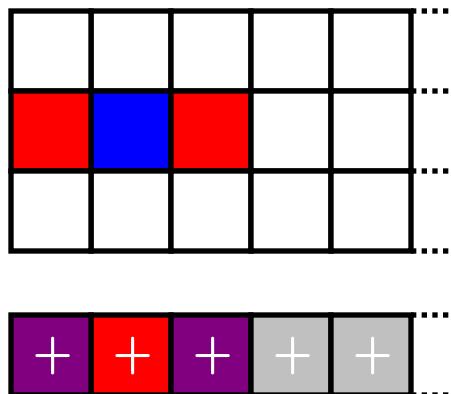
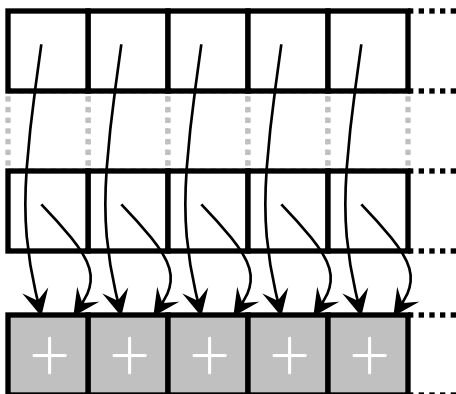


Stencil Optimization (2D)

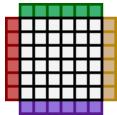
- Adjacent stencils use common subexpressions:



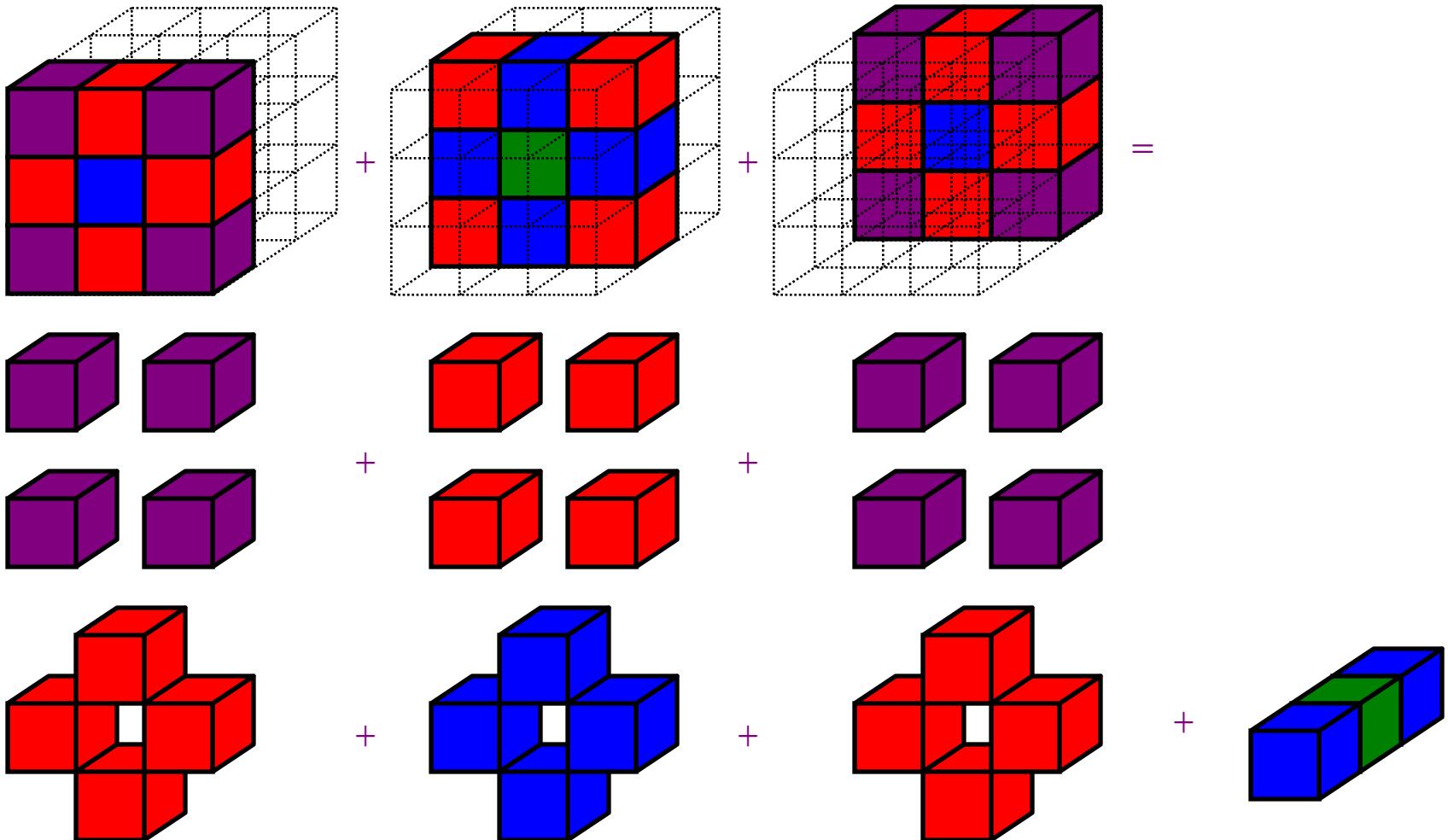
- Observation: Cache partial sums for reuse...

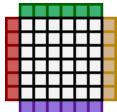


- Benefits are greater for 3D stencils...

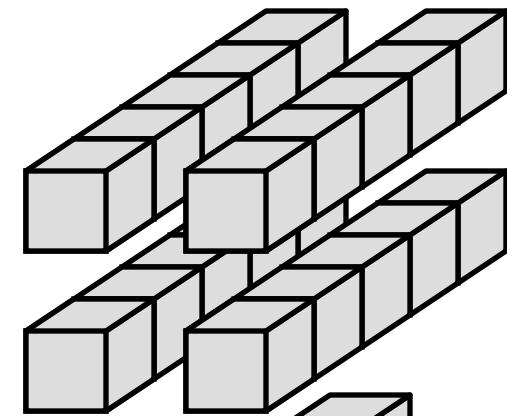


MG Stencil Optimization

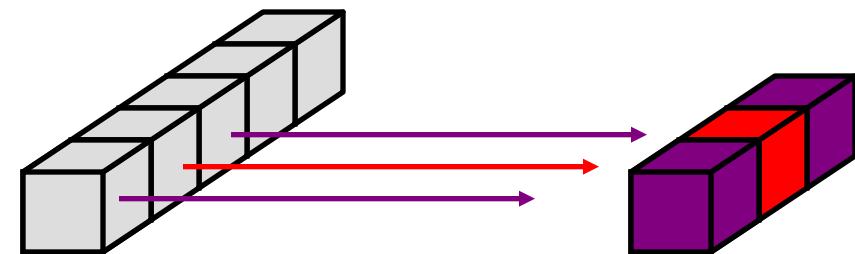




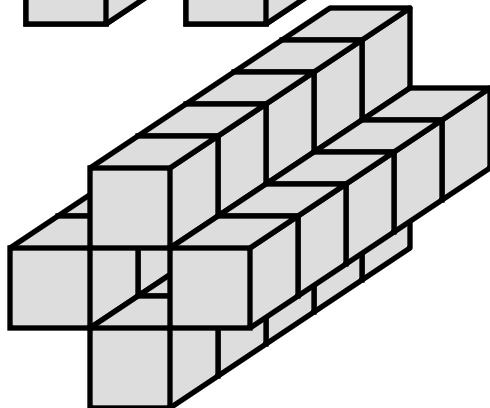
MG Stencil Optimization



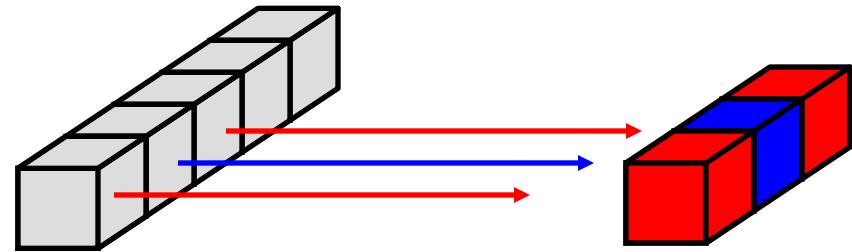
= +



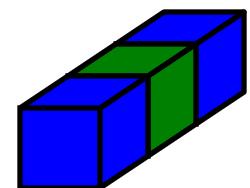
+

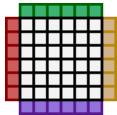


= +



+

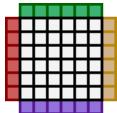




Optimized stencil in Fortran

```
subroutine rprj3(r,m1k,m2k,m3k,s,m1j,  
implicit none  
include 'cafnpb.h'  
include 'globals.h'  
  
integer m1k, m2k, m3k, m1j, m2j, m3j,  
  
double precision r(m1k,m2k,m3k), s(m1  
integer j3, j2, j1, i3, i2, i1, d1, c  
double precision x1(m), y1(m), x2,y2  
  
if(m1k.eq.3)then  
  d1 = 2  
else  
  d1 = 1  
endif  
  
if(m2k.eq.3)then  
  d2 = 2  
else  
  d2 = 1  
endif  
  
if(m3k.eq.3)then  
  d3 = 2  
else  
  d3 = 1  
endif
```

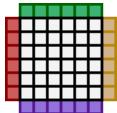
```
do    j3=2,m3j-1  
  i3 = 2*j3-d3  
  do   j2=2,m2j-1  
    i2 = 2*j2-d2  
    do  j1=2,m1j  
      i1 = 2*j1-d1  
      x1(i1-1) = r(i1-1,i2-1,i3) + r(i1-1,i2+1,i3)  
                  + r(i1-1,i2, i3-1) + r(i1-1,i2, i3+1)  
      y1(i1-1) = r(i1-1,i2-1,i3-1) + r(i1-1,i2-1,i3+1)  
                  + r(i1-1,i2+1,i3-1) + r(i1-1,i2+1,i3+1)  
    enddo  
    do  j1=2,m1j-1  
      i1 = 2*j1-d1  
      y2 = r(i1, i2-1,i3-1) + r(i1, i2-1,i3+1)  
          + r(i1, i2+1,i3-1) + r(i1, i2+1,i3+1)  
      x2 = r(i1, i2-1,i3) + r(i1, i2+1,i3)  
          + r(i1, i2, i3-1) + r(i1, i2, i3+1)  
      s(j1,j2,j3) =  
        0.5D0 * r(i1,i2,i3)  
        + 0.25D0 * (r(i1-1,i2,i3) + r(i1+1,i2,i3) + x2)  
        + 0.125D0 * ( x1(i1-1) + x1(i1+1) + y2)  
        + 0.0625D0 * ( y1(i1-1) + y1(i1+1) )  
    enddo  
  enddo  
enddo
```



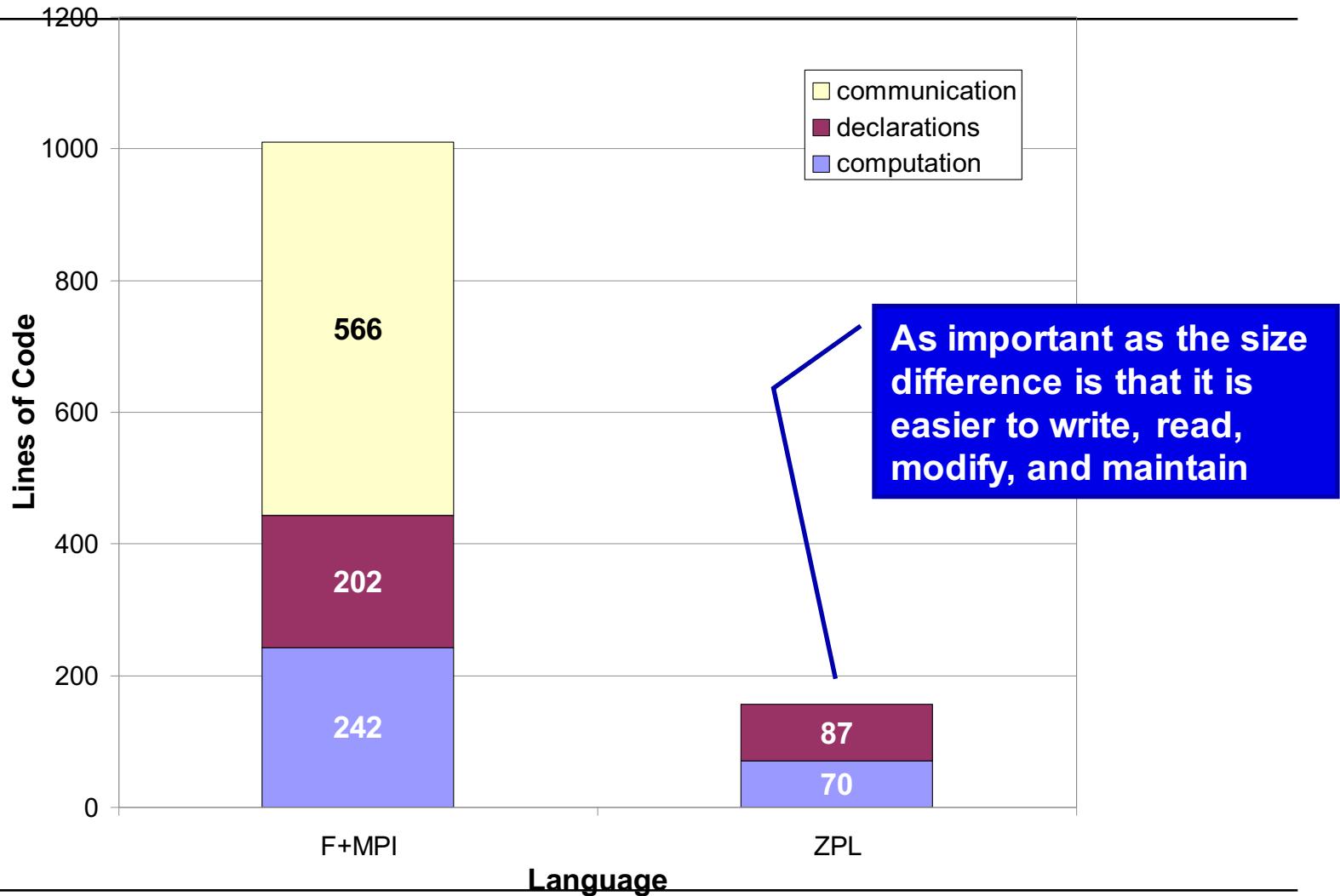
Optimized stencil in ZPL

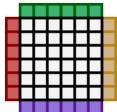
```
procedure rprj3(var S,R: [,,] double;
                 d: array [] of direction);
begin
  S := 0.5000 * R +
        0.2500 * (R@^d[ 1, 0, 0] + R@^d[ 0, 1, 0] + R@^d[ 0, 0, 1] +
                   R@^d[-1, 0, 0] + R@^d[ 0,-1, 0] + R@^d[ 0, 0,-1] +
        0.1250 * (R@^d[ 1, 1, 0] + R@^d[ 1, 0, 1] + R@^d[ 0, 1, 1] +
                   R@^d[ 1,-1, 0] + R@^d[ 1, 0,-1] + R@^d[ 0, 1,-1] +
                   R@^d[-1, 1, 0] + R@^d[-1, 0, 1] + R@^d[ 0,-1, 1] +
                   R@^d[-1,-1, 0] + R@^d[-1, 0,-1] + R@^d[ 0,-1,-1]) +
        0.0625 * (R@^d[ 1, 1, 1] + R@^d[ 1, 1,-1] +
                   R@^d[ 1,-1, 1] + R@^d[ 1,-1,-1] +
                   R@^d[-1, 1, 1] + R@^d[-1, 1,-1] +
                   R@^d[-1,-1, 1] + R@^d[-1,-1,-1]);
end;
```

Compiler-optimized, thanks to rich semantic information about arrays
(esp. relationship between hierarchical arrays and offsets)

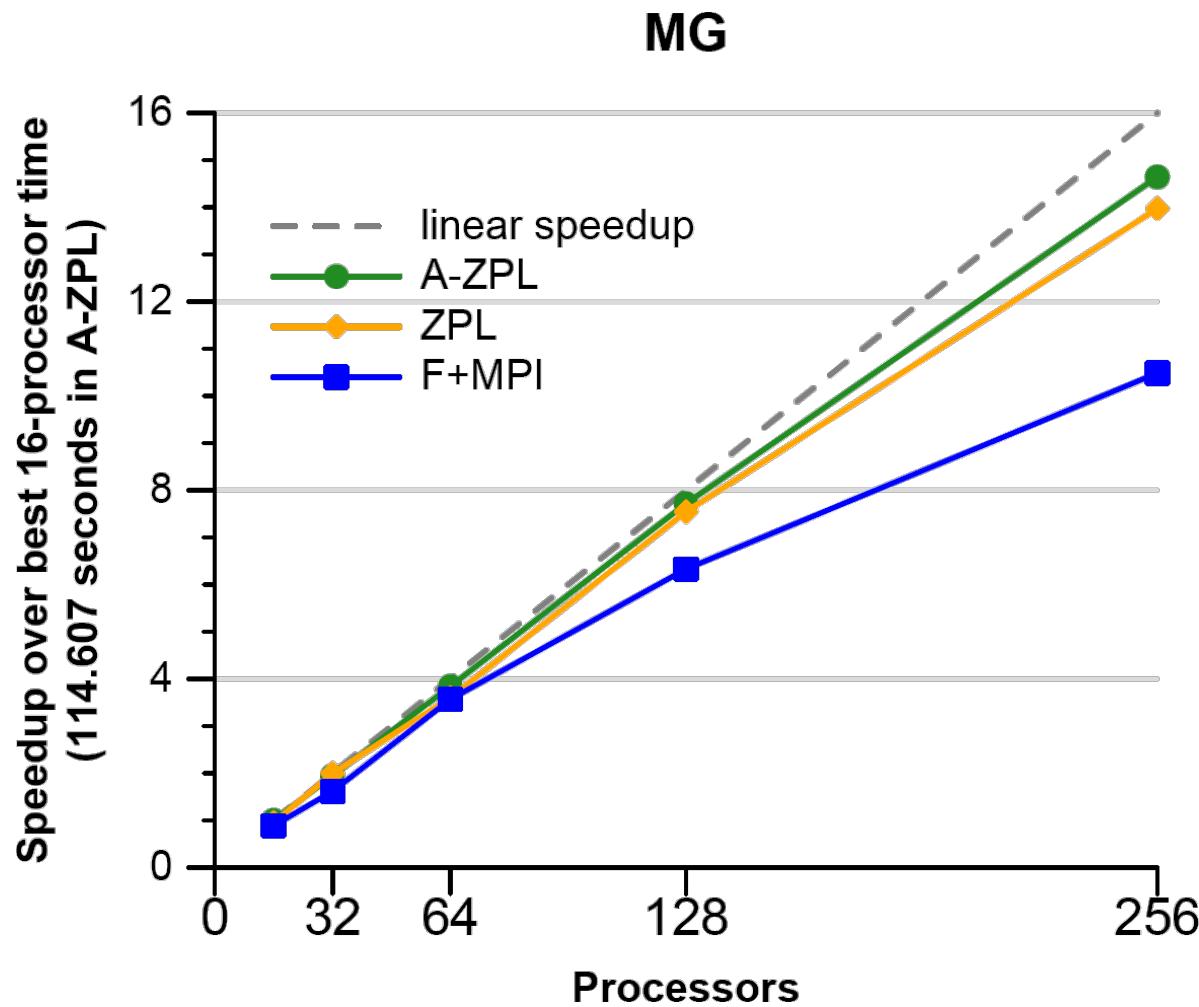


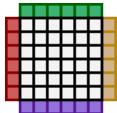
Code Size Comparison





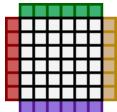
NAS MG Speedup: Cray T3E



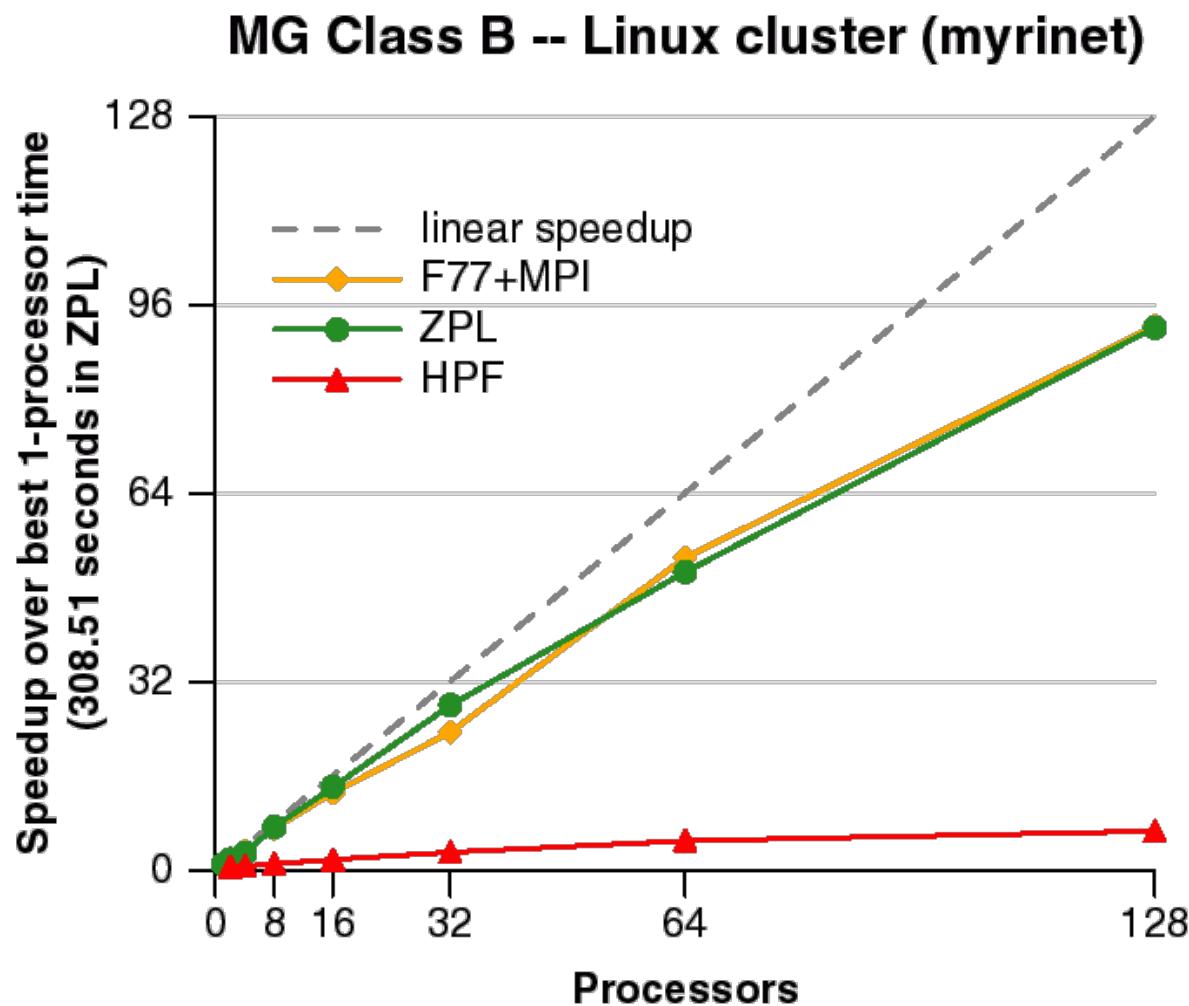


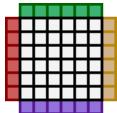
How did ZPL outperform MPI?

- MPI embeds specific communication idioms
 - non-blocking sends / receives
 - carries buffering & synchronization assumptions
 - ZPL only expresses computation's intent
 - permits implementation to map to puts / gets
 - RDMA is the optimal choice on this Cray T3E
 - Of course, MPI could use RDMA as well...
 - ...but only via modifications to the code...
 - ...and what would happen on non-RDMA systems?
 - Meanwhile, ZPL can target MPI on clusters...
-

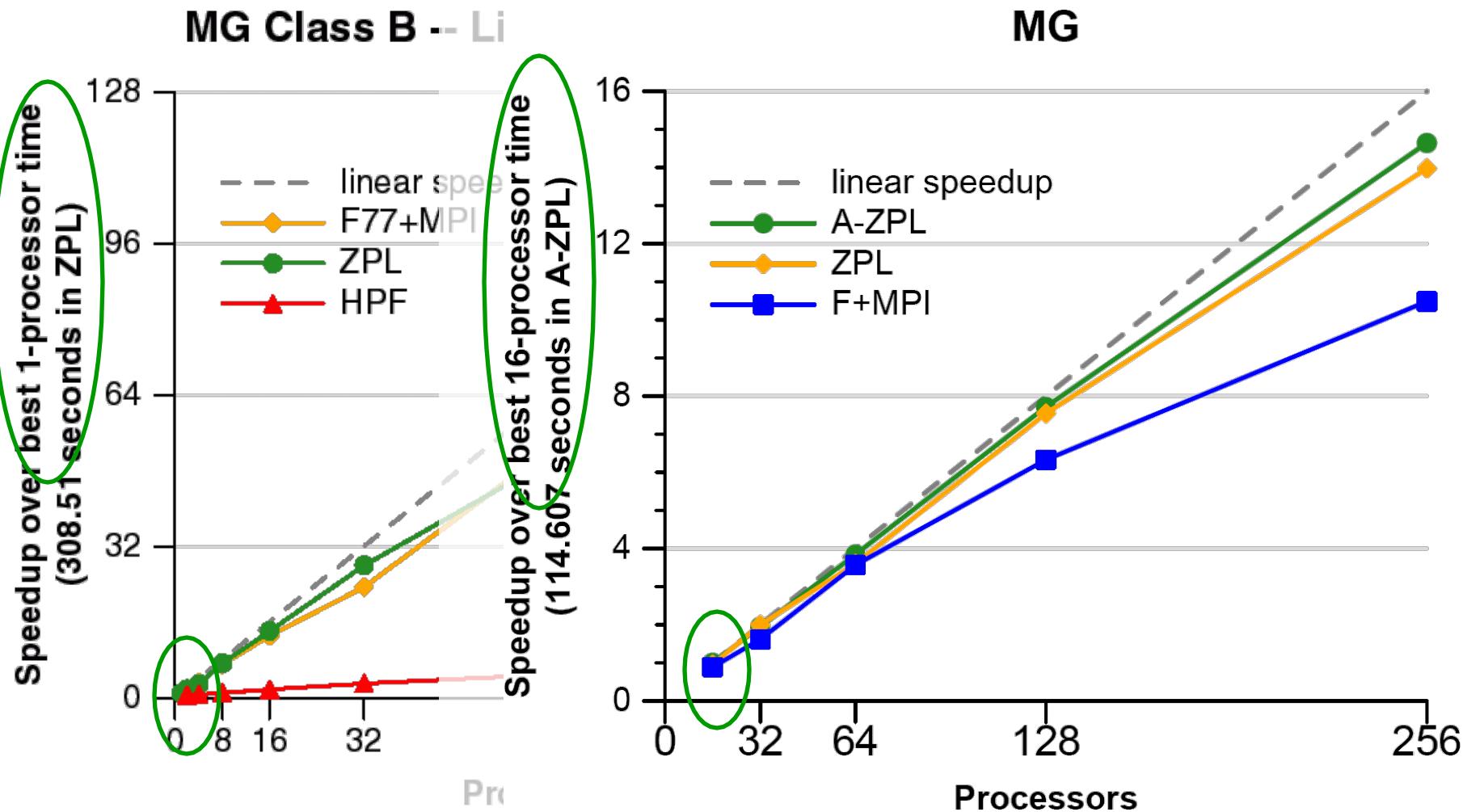


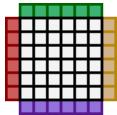
NAS MG Speedup: Myrinet cluster





ZPL was also fastest at small-scale





Code [In]Flexibility

The Fortran+MPI version...

...only supports 2^k problem sizes

...only supports running on 2^p compute nodes

- moreover, both values must be specified at compile-time

...only supports a single 3D data decomposition

...could be rewritten to avoid these assumptions...

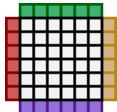
...but at what cost in terms of level of effort? code clarity?

In contrast, the ZPL version...

...supports arbitrary problem sizes and node counts

- and permits them to be specified at run-time

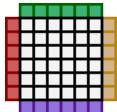
...supports decomposing in 1, 2, or all 3 dimensions



NAS MG in ZPL: Summary

A resounding success for array programming!

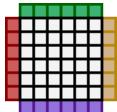
- global-view of computation
 - ability to reason about communication needs
 - clear, concise, compact code
 - optimized stencil computations
 - system-specific communication idioms
 - optimized communication (not described here)
 - flexible parameterization (problem size, grid, ...)
-



NAS MG in ZPL: Summary

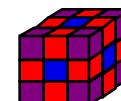
But also a significant downside:

- expression of stencil required $O(points)$ code
 - OK for 27-point stencils
 - less so for, say, 216-point stencils in FMM
-



rprj3 stencil in Chapel

```
proc rprj3(S: [?SD], R) {
    const Stencil = {-1..1, -1..1, -1..1},
          w = (0.5, 0.25, 0.125, 0.0625),
          w3d: [Stencil] real
            = [(i,j,k) in Stencil]
              w((i!=0) + (j!=0) + (k!=0));
    forall ijk in SD do
        S[ijk] = + reduce (for offset in Stencil do
            (w3d[offset] * R[ijk + offset*R.stride]));
}
```



ZPL's Greatest Hits: Sparse Arrays in NAS CG



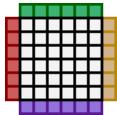
COMPUTE

|

STORE

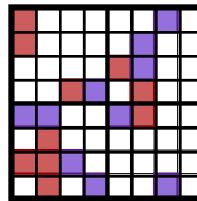
|

ANALYZE

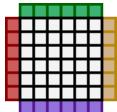


Sparse Arrays

- Good sparse arrays are a must for scientific computation
 - should be built-in
 - should be semantically similar to dense arrays



- NAS CG in a nutshell:
 - lots of sparse matrix-vector multiplications in a loop
-

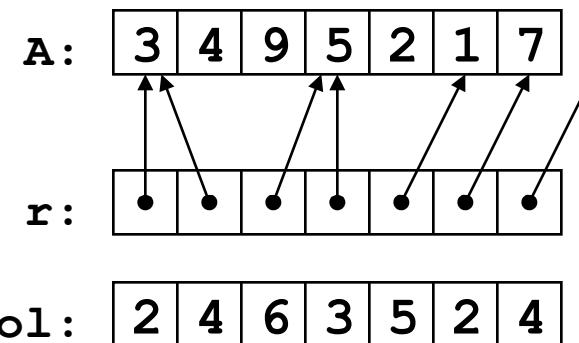


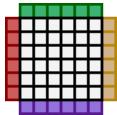
Compressed Sparse Row (CSR) Format

$A:$

| | | | | | |
|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 3 | 0 | 4 | 0 | 9 |
| 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 5 | 0 | 2 | 0 |
| 0 | 1 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 7 | 0 | 0 |

- = dense data vector
- + structure information





Fortran Mat-Vect Multiplication

Dense Matrix-Vector
Multiplication:

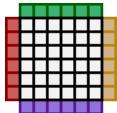
```
integer n
real*8 A(n,n)
real*8 t, V(n), S(n)

do i = 1,n
    t = 0.d0
    do j = 1,n
        t = t + A(i,j)*V(j)
    enddo
    S(i) = t
enddo
```

Sparse Matrix-Vector
Multiplication:

```
integer n, nnz
real*8 A(nnz)
real*8 t, V(n), S(n)
integer r(n+1), col(nnz)

do i = 1,n
    t = 0.d0
    do j = r(i),r(i+1)-1
        t = t + A(j)*V(col(j))
    enddo
    S(i) = t
enddo
```

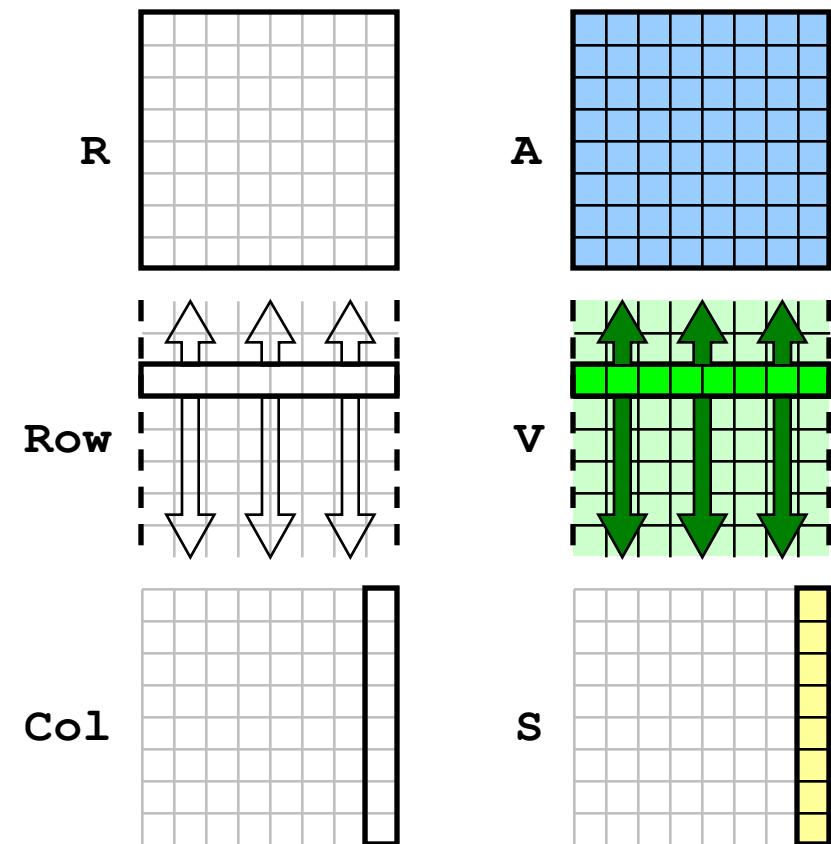


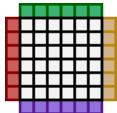
ZPL Mat-Vect Multiplication

declarations:

```
region R = [1..n,1..n];  
Row = [* ,1..n];  
Col = [1..n,n];
```

```
var A: [R] double;  
V: [Row] double;  
S: [Col] double;
```

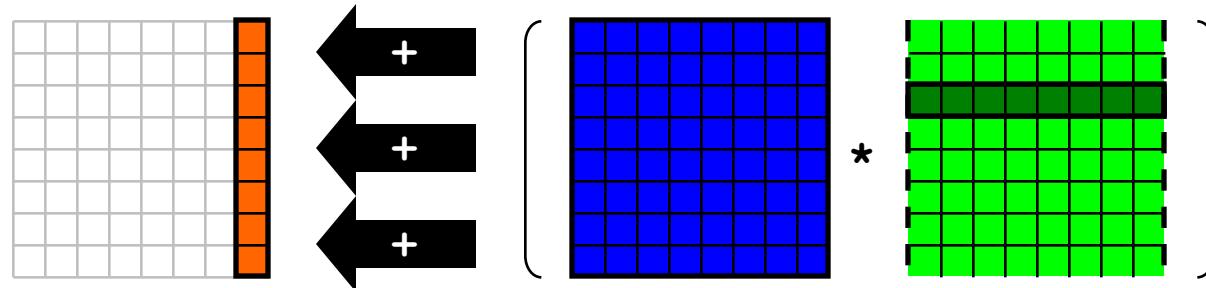




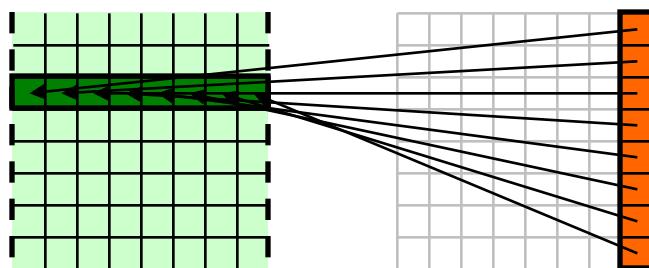
ZPL Mat-Vect Multiplication

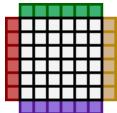
computation:

[Col] $S := + << [R] (A^*V);$



[Row] $V := S \# [n, Index1];$

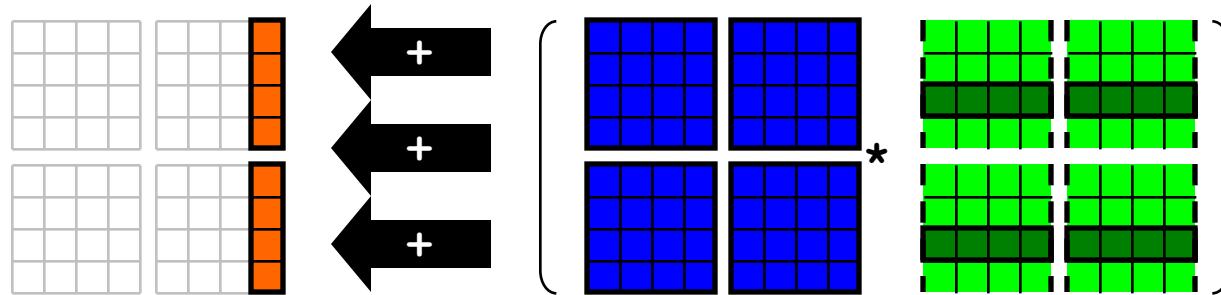




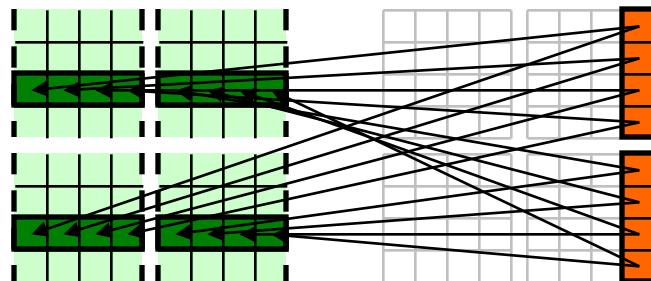
ZPL Mat-Vect Multiplication

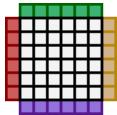
computation (in parallel):

[Col] $S := + << [R] (A^*V);$



[Row] $V := S \# [n, Index1];$

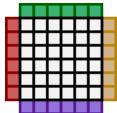




ZPL Mat-Vect Multiplication

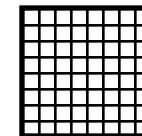
Dense Matrix-Vector
Multiplication:

```
region R = [1..n, 1..n];  
          Row = [* , 1..n];  
          Col = [1..n, n];  
  
var A: [R] double;  
        V: [Row] double;  
        S: [Col] double;  
  
[Col] S := +<< [R] (A*V);
```

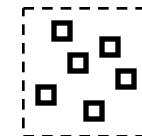


Sparse Regions and Arrays

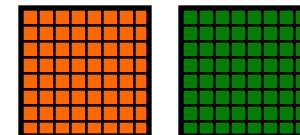
```
region Rd = [1..n,1..n];
```



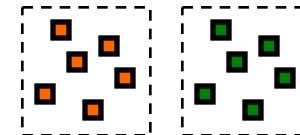
```
region Rs = Rd where <pattern>;
```

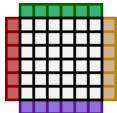


```
var Ad, Bd: [Rd] double;
```



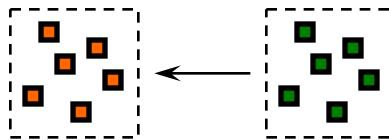
```
As, Bs: [Rs] double;
```



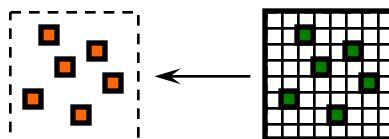
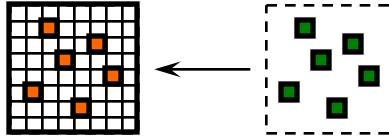


Sparse Assignments

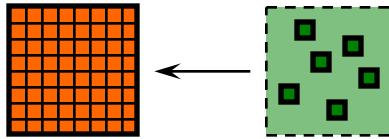
- Sparse assignment

$$[Rs] \quad As := Bs;$$


- Sparse assignment with dense array

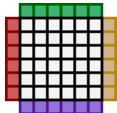
$$[Rs] \quad As := Bd;$$

$$[Rs] \quad Ad := Bs;$$


- Dense read of sparse array

$$[Rd] \quad Ad := Bs;$$


- Dense assignment of sparse array – *illegal*

~~$$[Rd] \quad As := Bd;$$~~



ZPL Mat-Vect Multiplication

Dense Matrix-Vector
Multiplication:

```
region R = [1..n, 1..n];
           Row = [*, 1..n];
           Col = [1..n, n];

var A: [R] double;
     V: [Row] double;
     S: [Col] double;

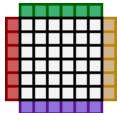
[Col] S := +<<[R] (A*V);
```

Sparse Matrix-Vector
Multiplication:

```
region R = [1..n, 1..n];
           Row = [*, 1..n];
           Col = [1..n, n];
           RS = R where ...;

var A: [RS] double;
     V: [Row] double;
     S: [Col] double;

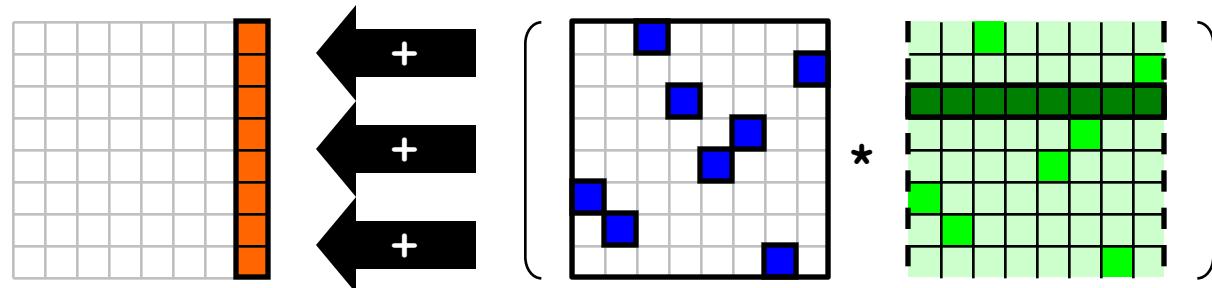
[Col] S := +<<[RS] (A*V);
```



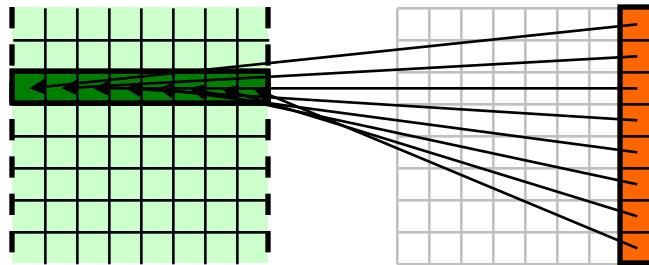
ZPL Mat-Vect Multiplication

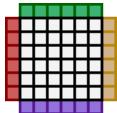
Sparse Matrix-Vector Multiplication:

[Col] $S := + << [Rs] (A^*V) ;$



[Row] $V := S \# [n, Index1] ;$





Sparse Arrays in ZPL

sparse array...

$A:$

| | | | | | |
|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 3 | 0 | 4 | 0 | 9 |
| 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 5 | 0 | 2 | 0 |
| 0 | 1 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 7 | 0 | 0 |

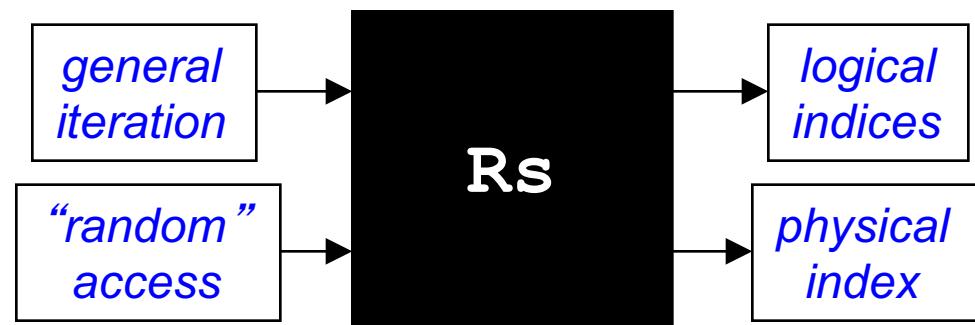
= 1D dense array

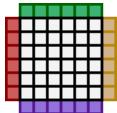
+

sparse region

$A:$

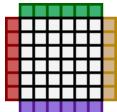
| | | | | | | | |
|---|---|---|---|---|---|---|---|
| 0 | 3 | 4 | 9 | 5 | 2 | 1 | 7 |
|---|---|---|---|---|---|---|---|



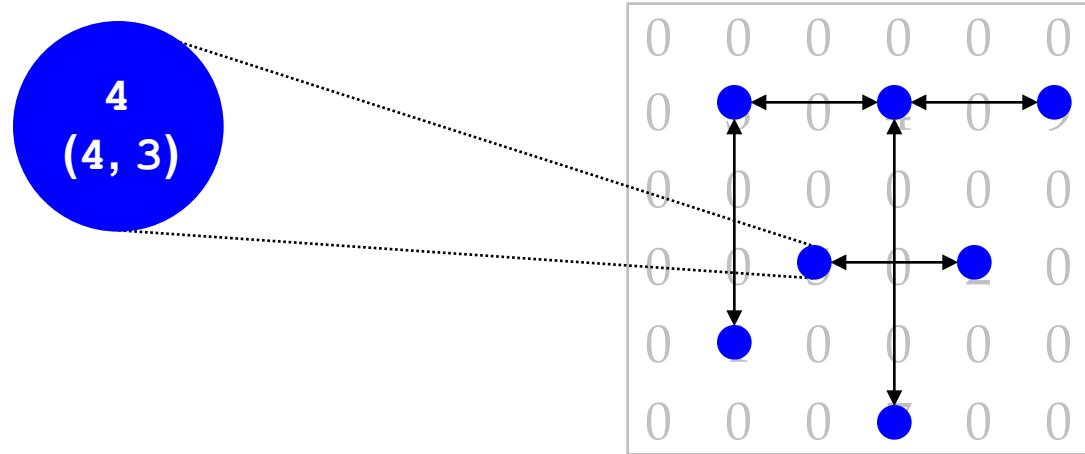


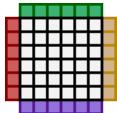
General Sparse Region Format

| | | | | | |
|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 3 | 0 | 4 | 0 | 9 |
| 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 5 | 0 | 2 | 0 |
| 0 | 1 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 7 | 0 | 0 |

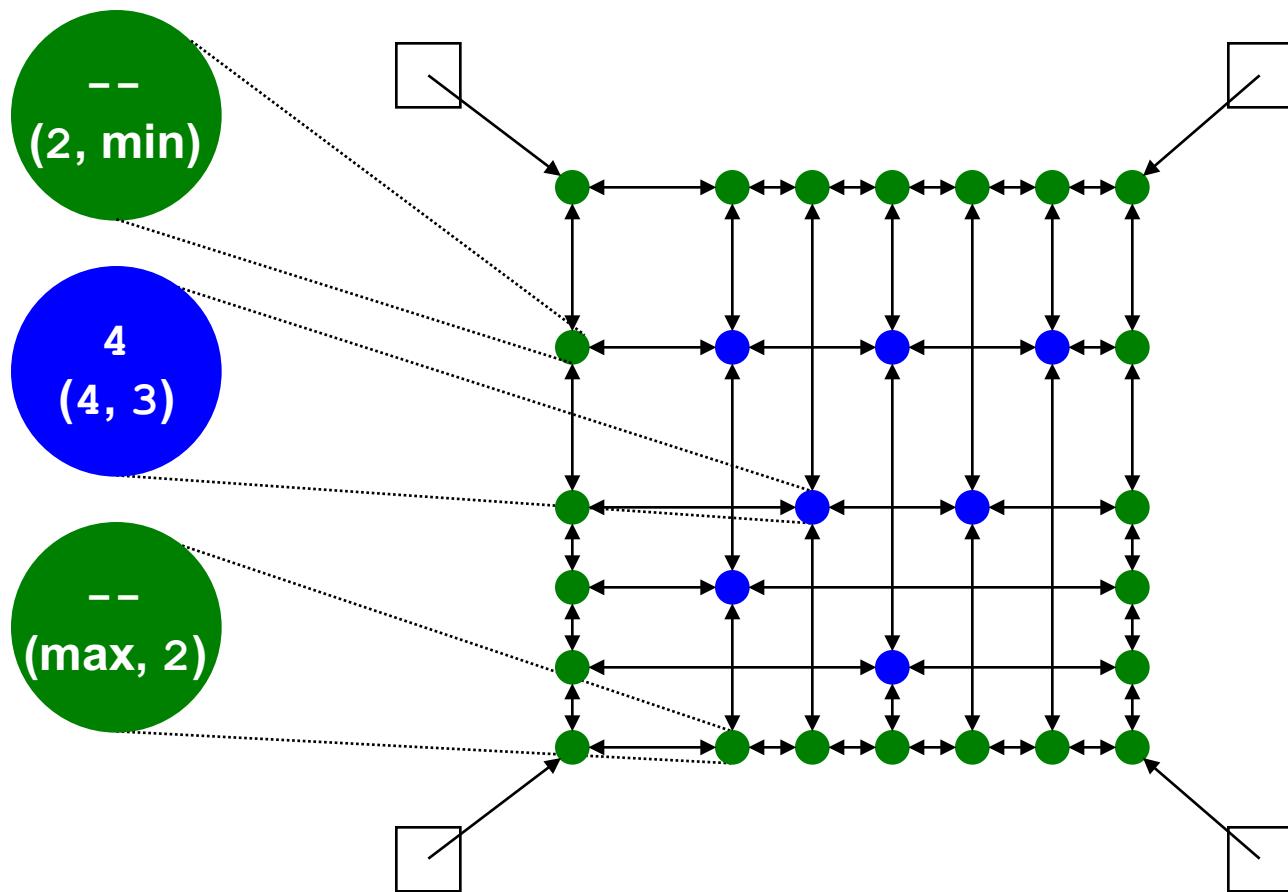


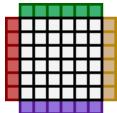
General Sparse Region Format



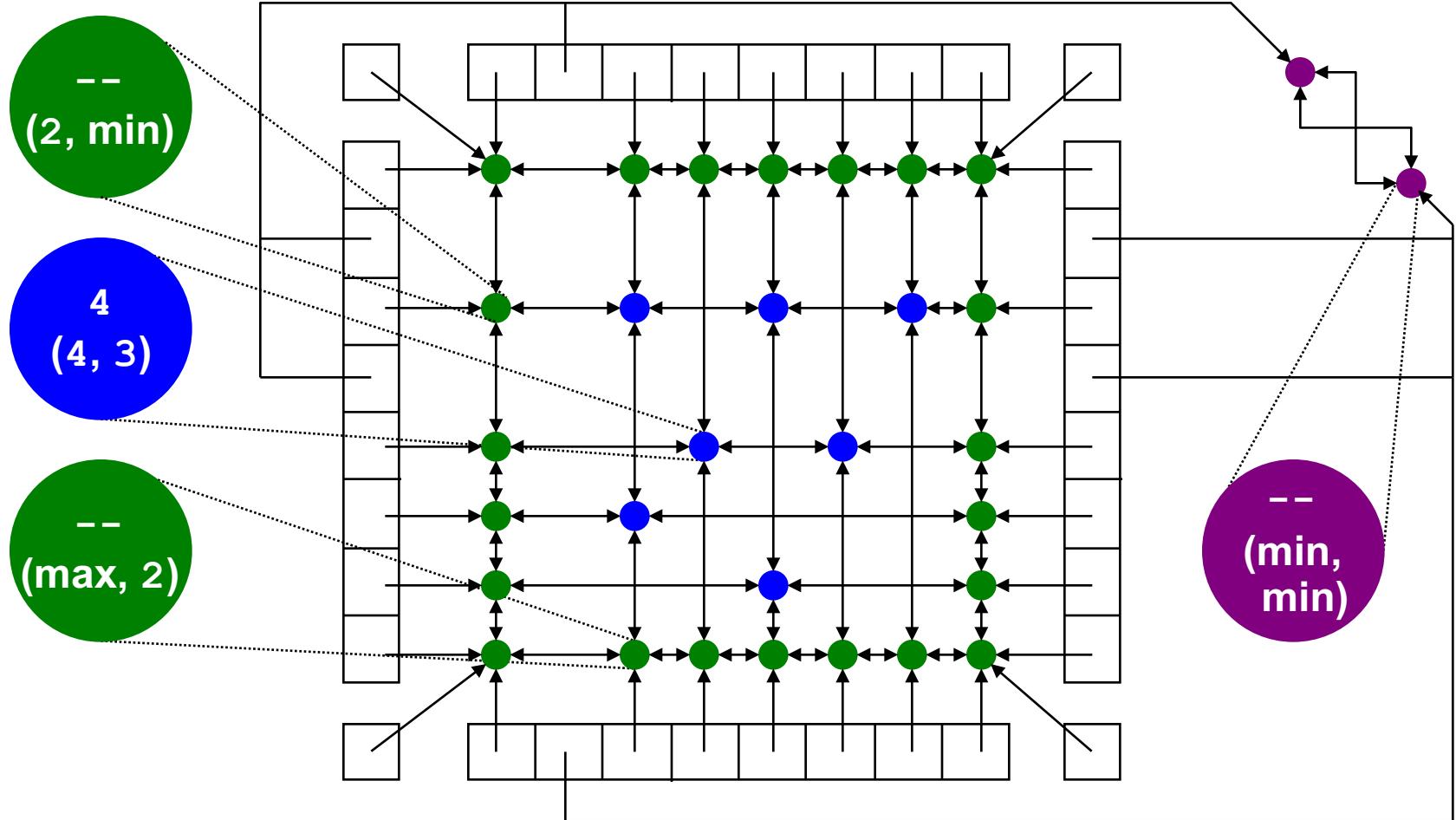


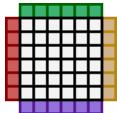
General Sparse Region Format



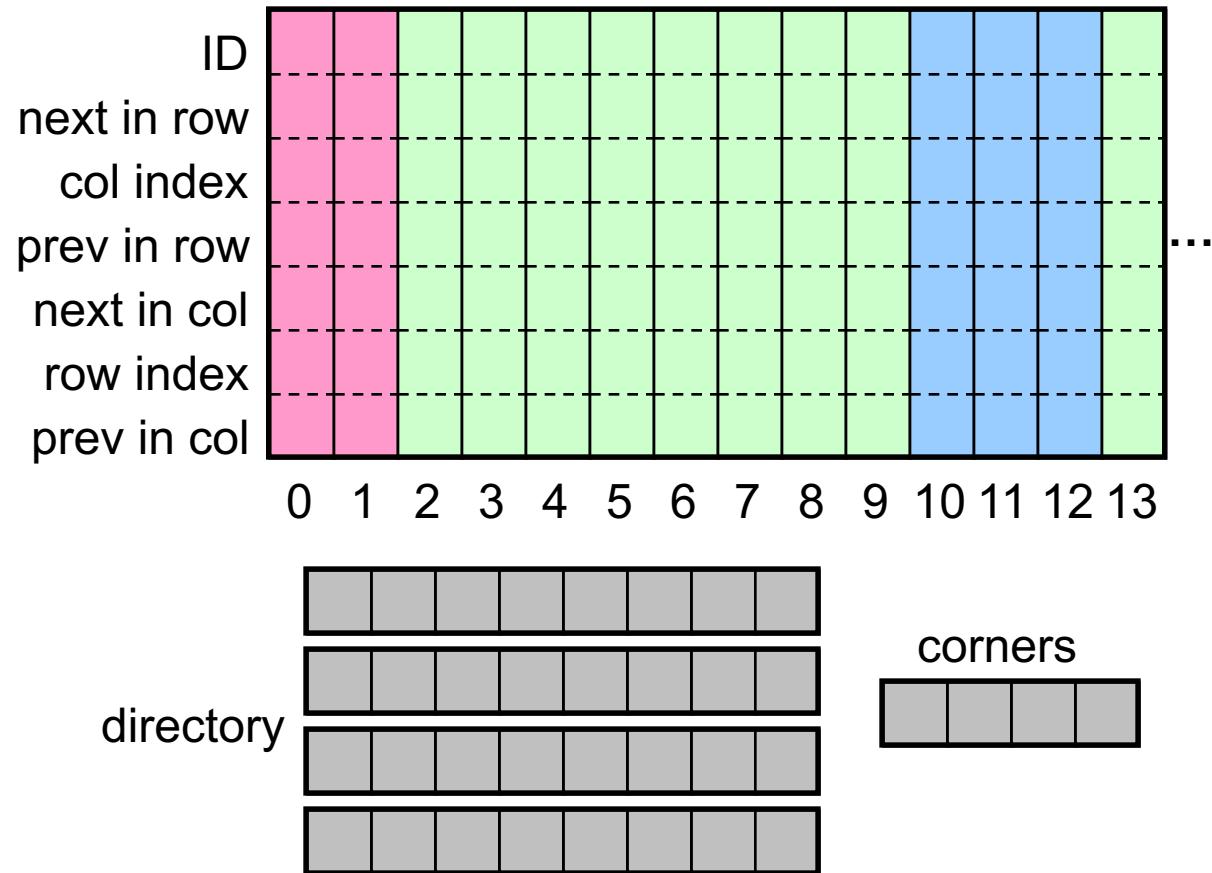
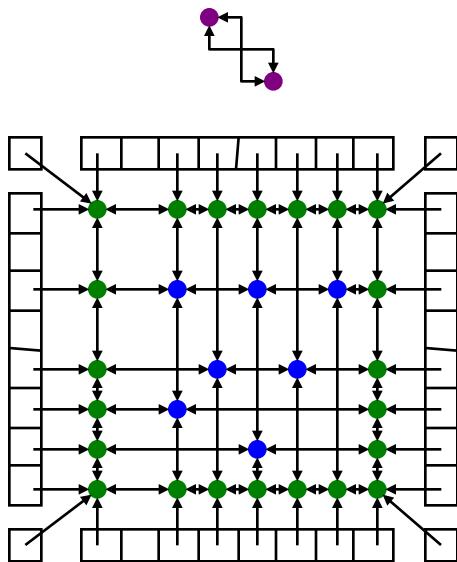


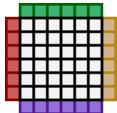
General Sparse Region Format



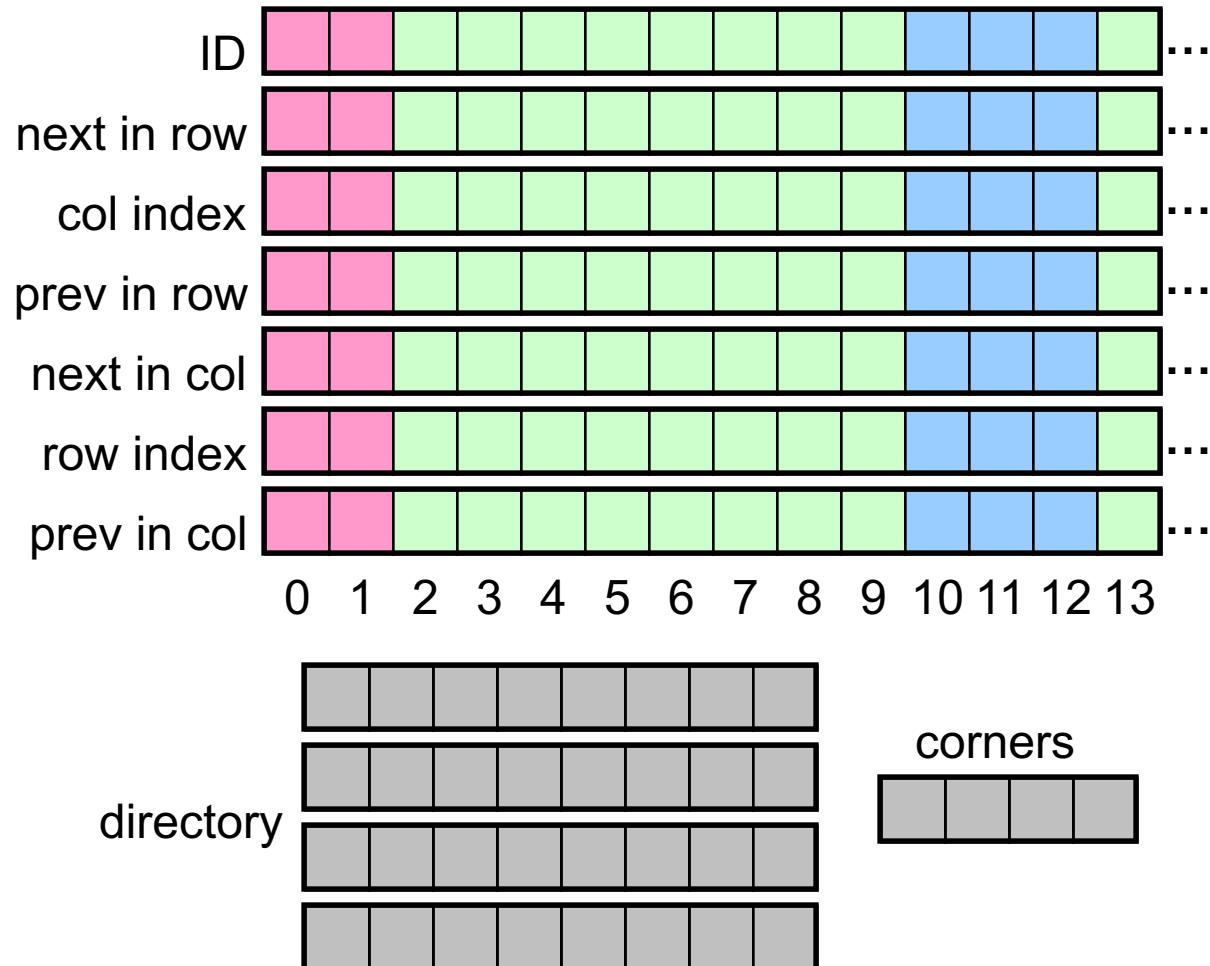
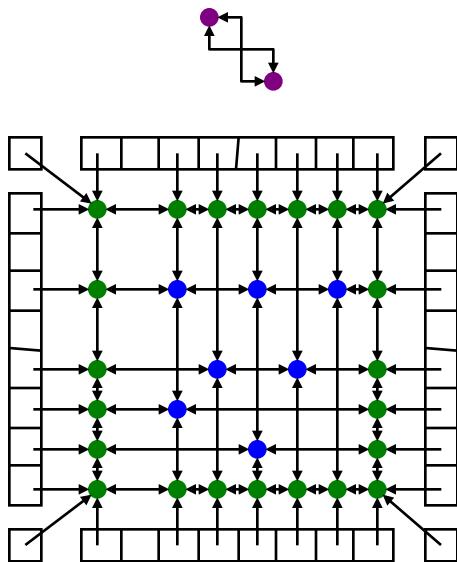


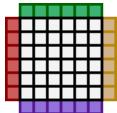
Sparse Format: Array of Records



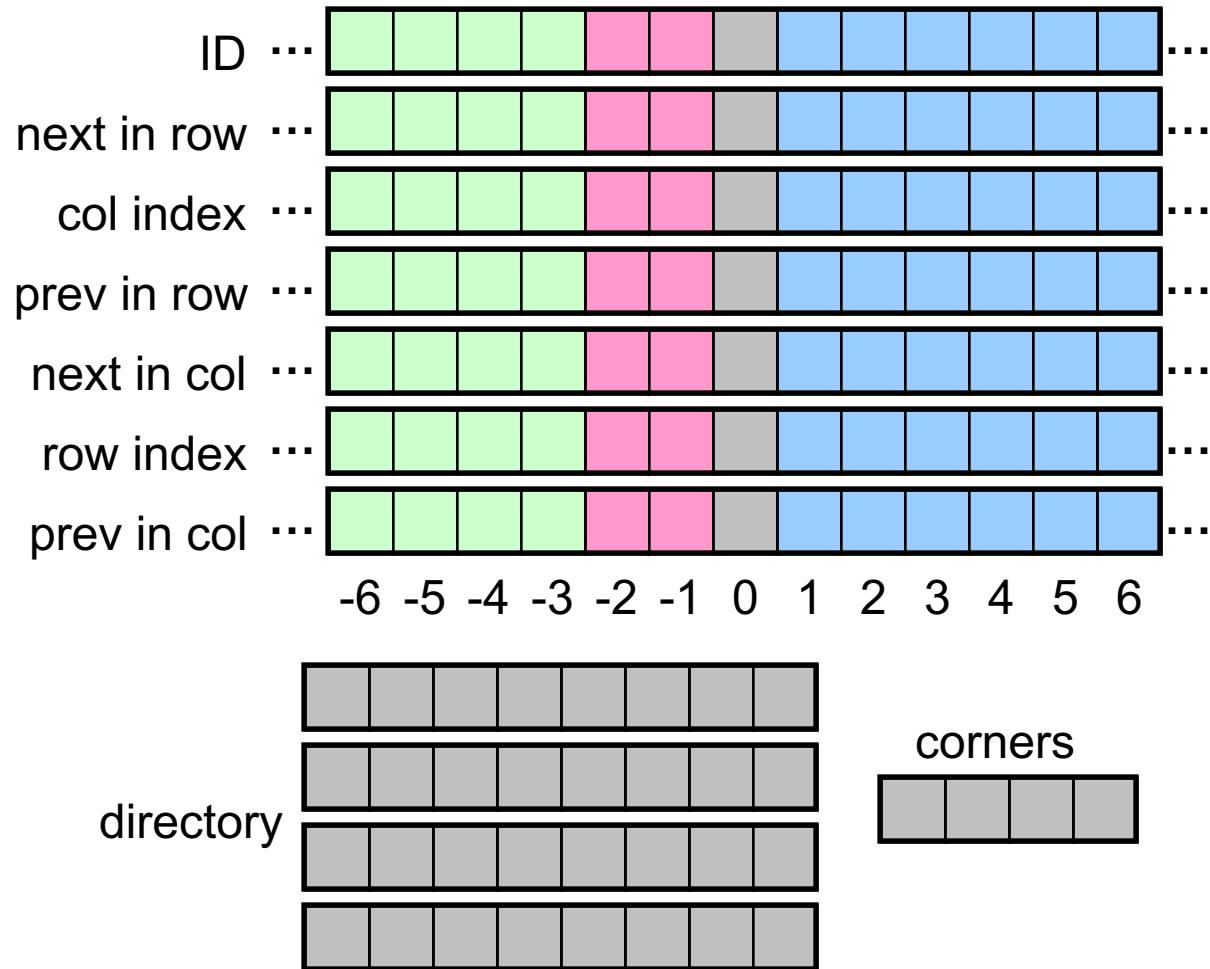
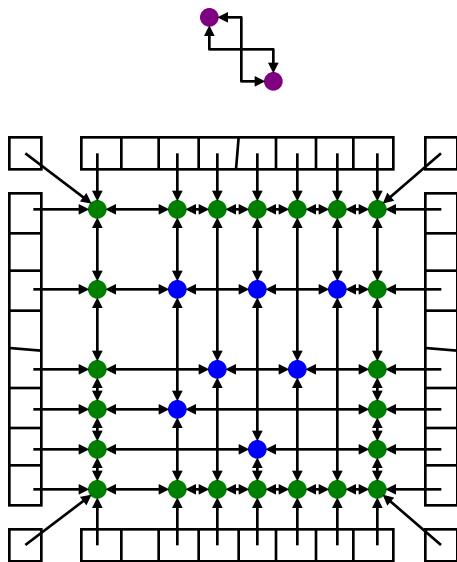


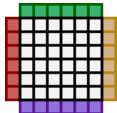
Sparse Format: Record of Arrays



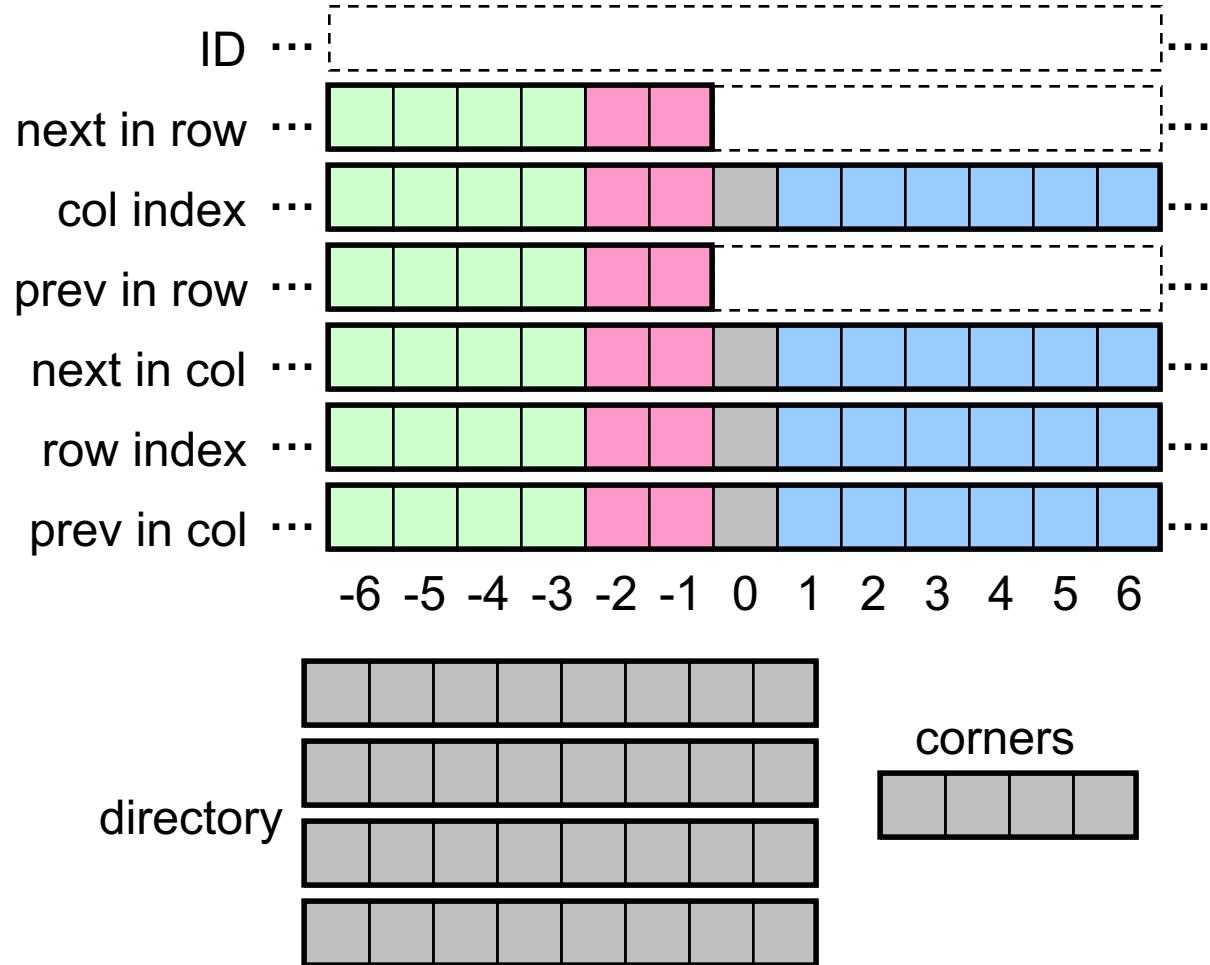
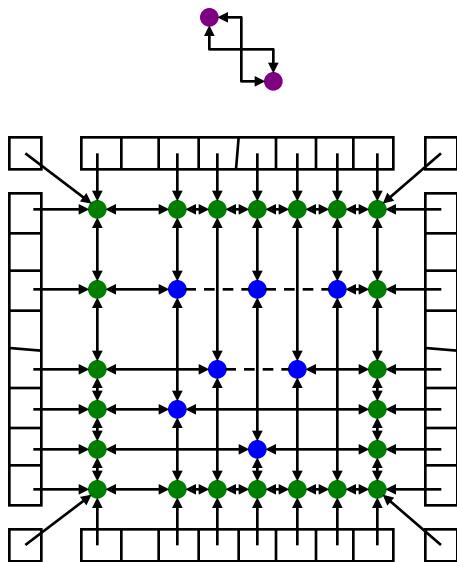


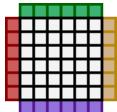
Sparse Format: Reordered



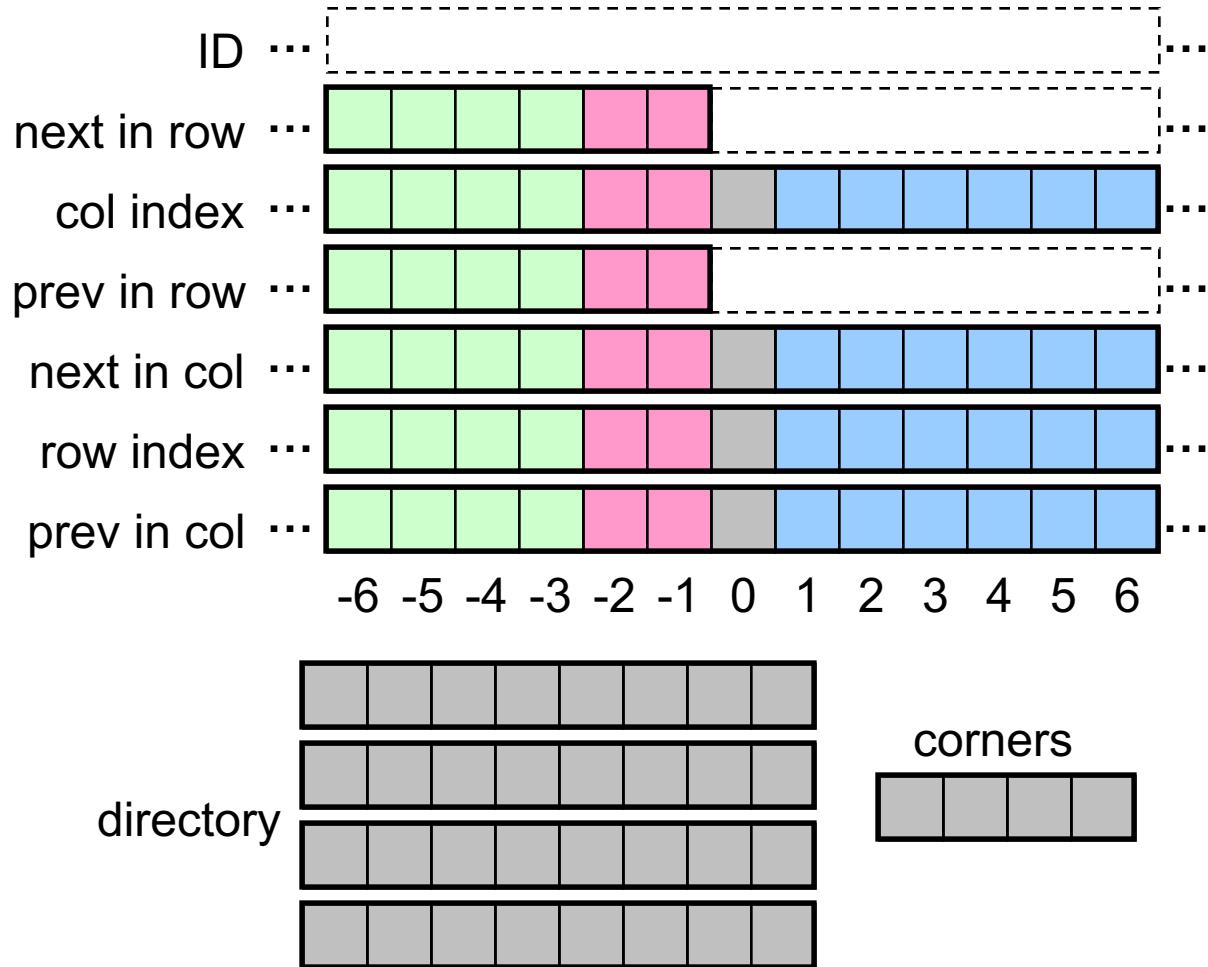
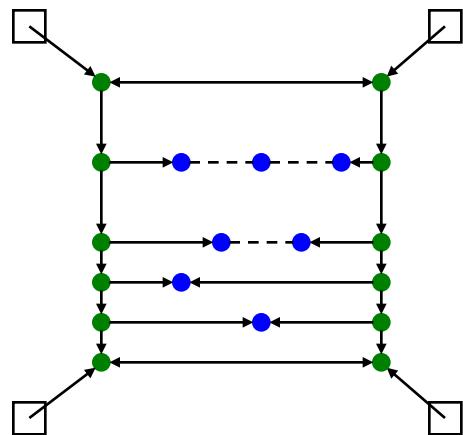


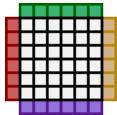
Sparse Format: Optimized



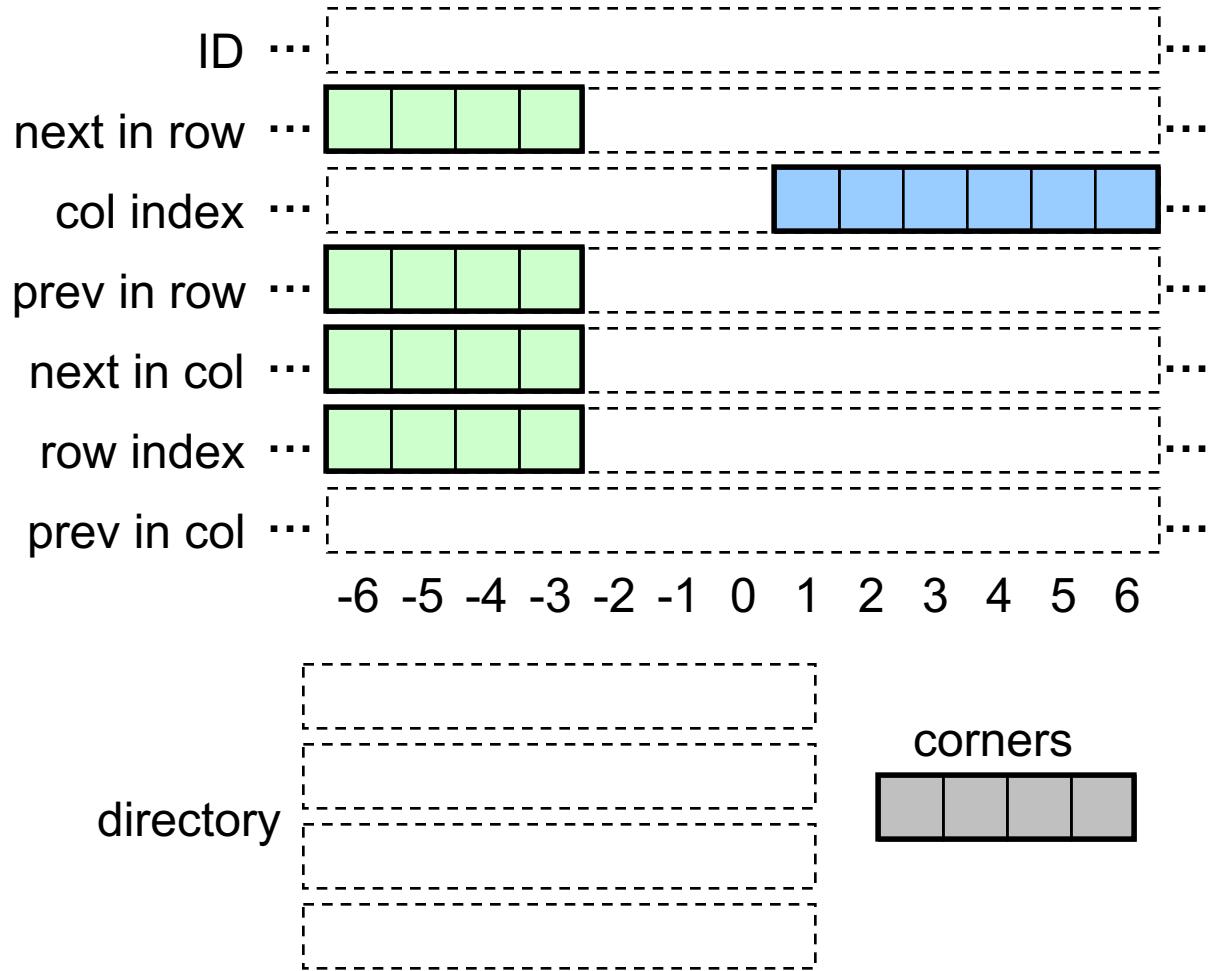
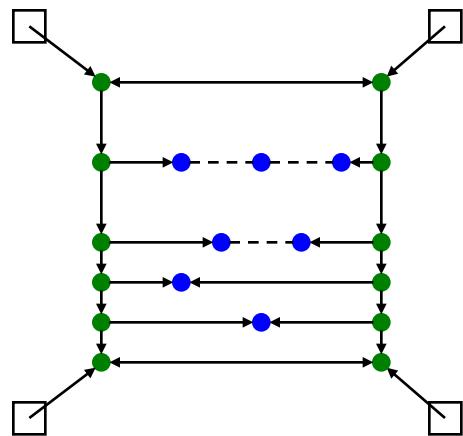


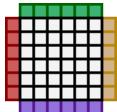
Sparse Format: True Requirements





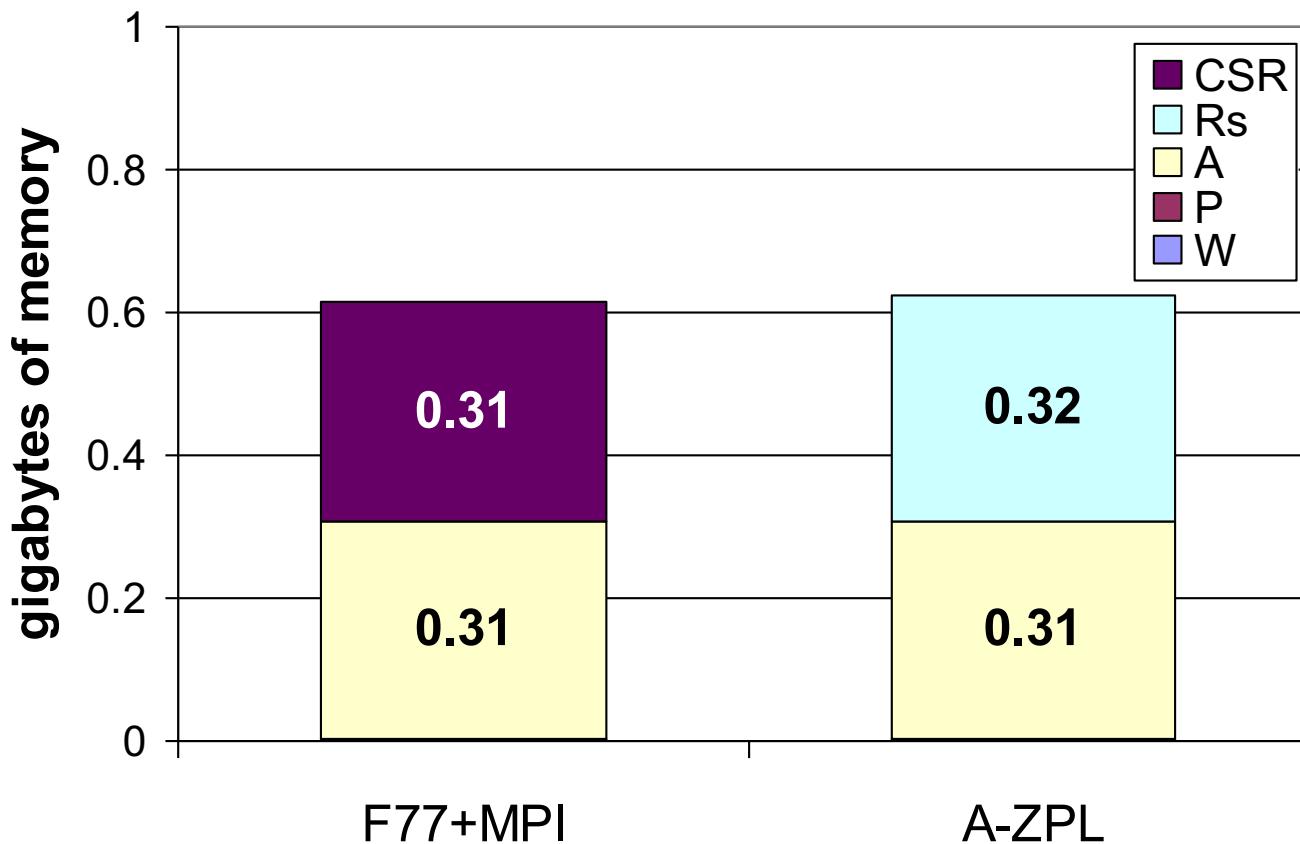
Sparse Format: Fully Optimized

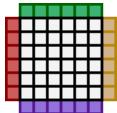




CG Memory Requirements

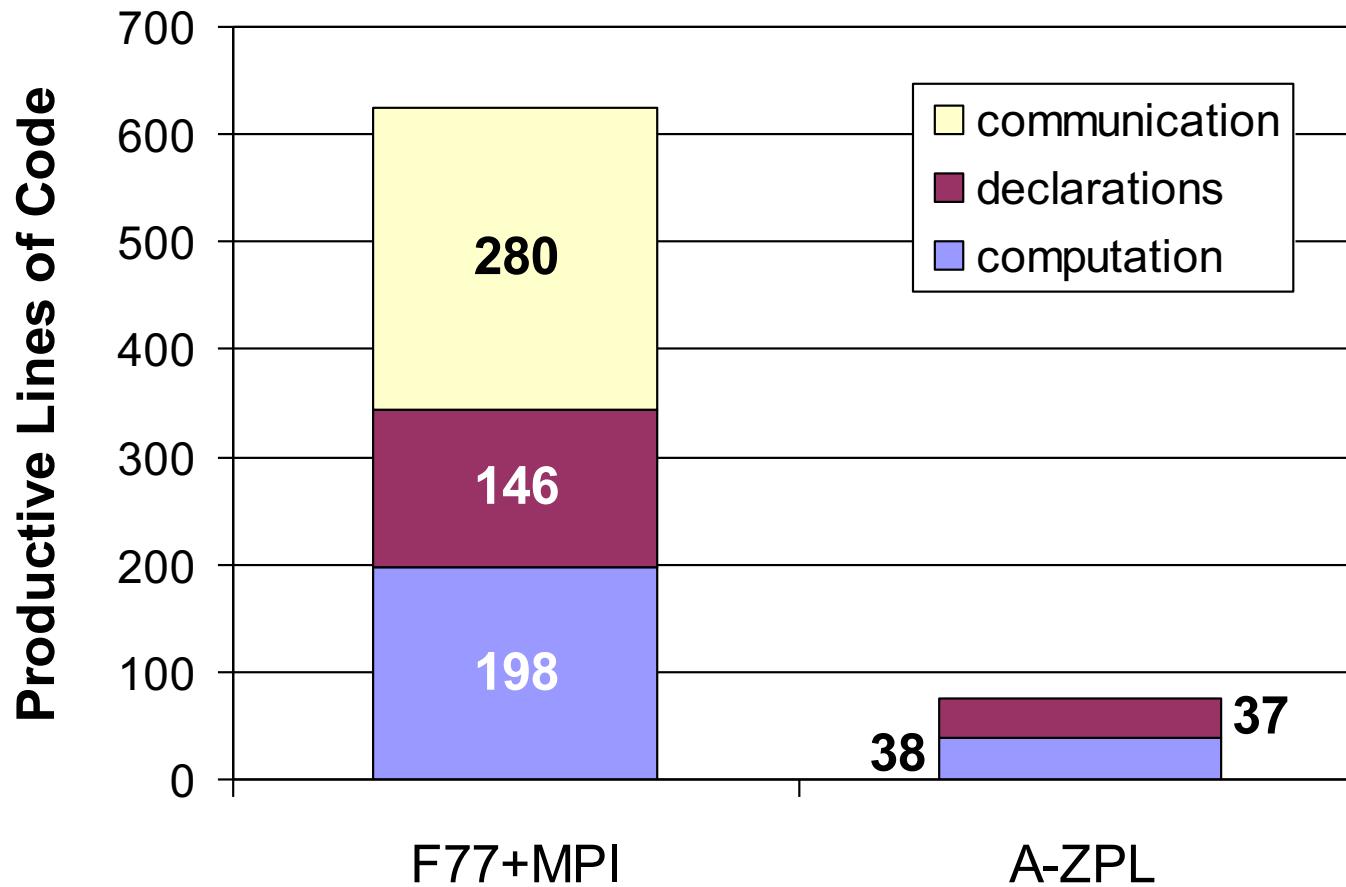
CG Class C -- memory usage

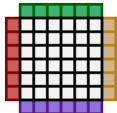




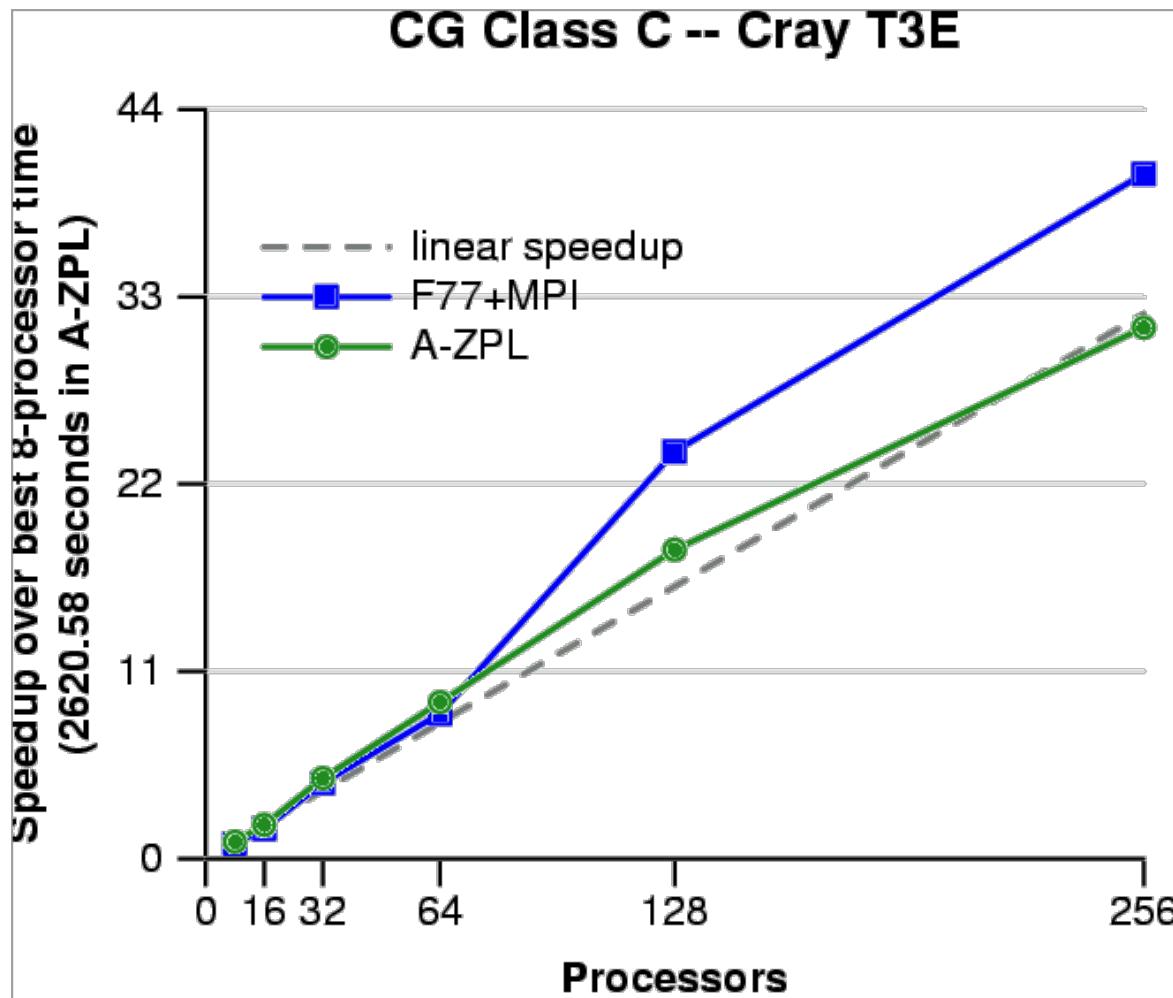
CG Code Size

CG Line Counts

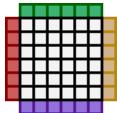




NAS CG Speedup: Cray T3E

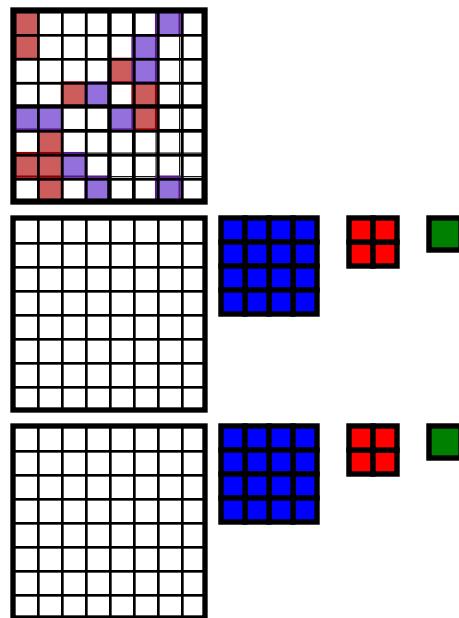


though ZPL's sparsity pattern performed well at small node counts and scaled well, it couldn't beat hand-coded CSR at scale...

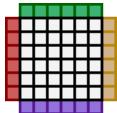


Sparse Arrays in MG

- MG's input array, V , has 20 non-zeroes regardless of problem size

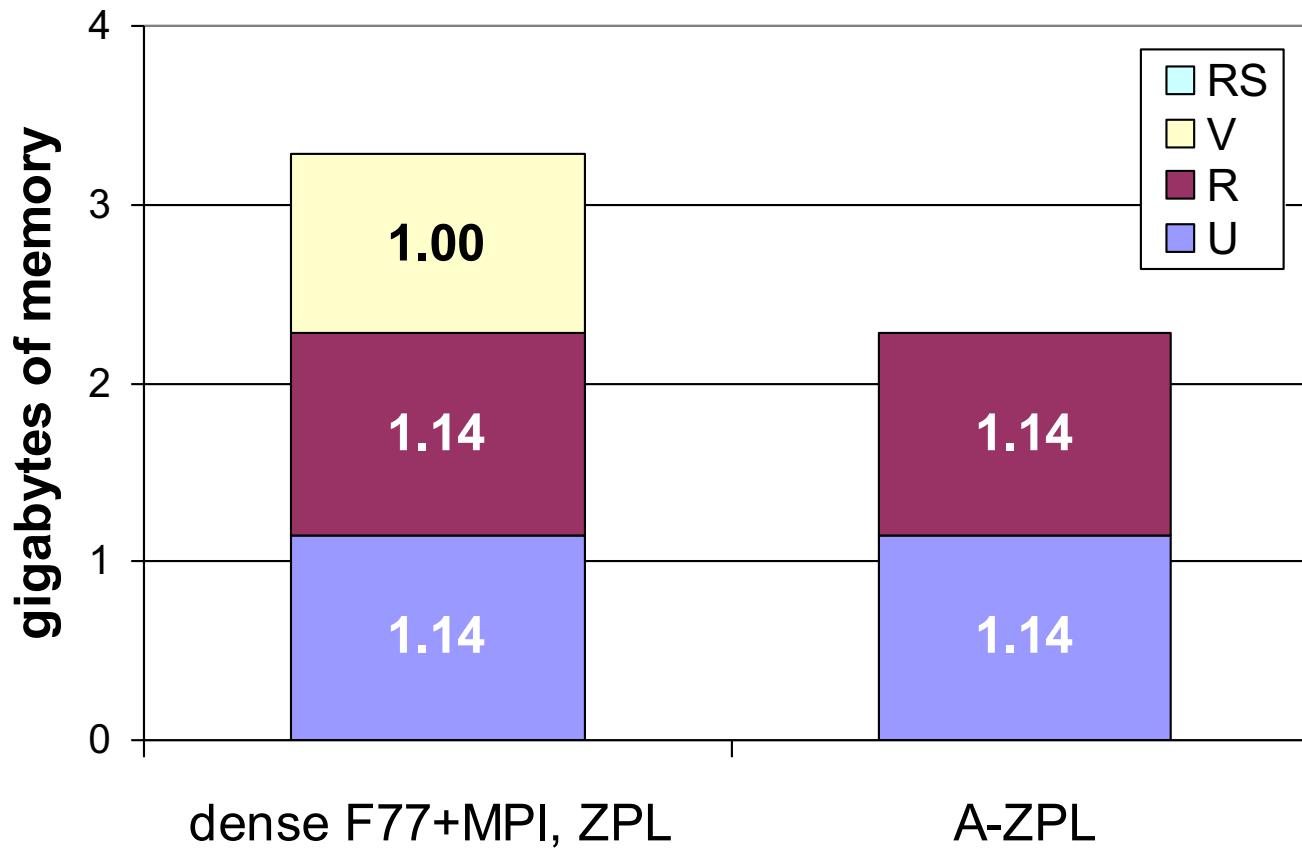


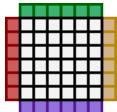
- Computes resid against V twice per iteration
- Wasted time and space



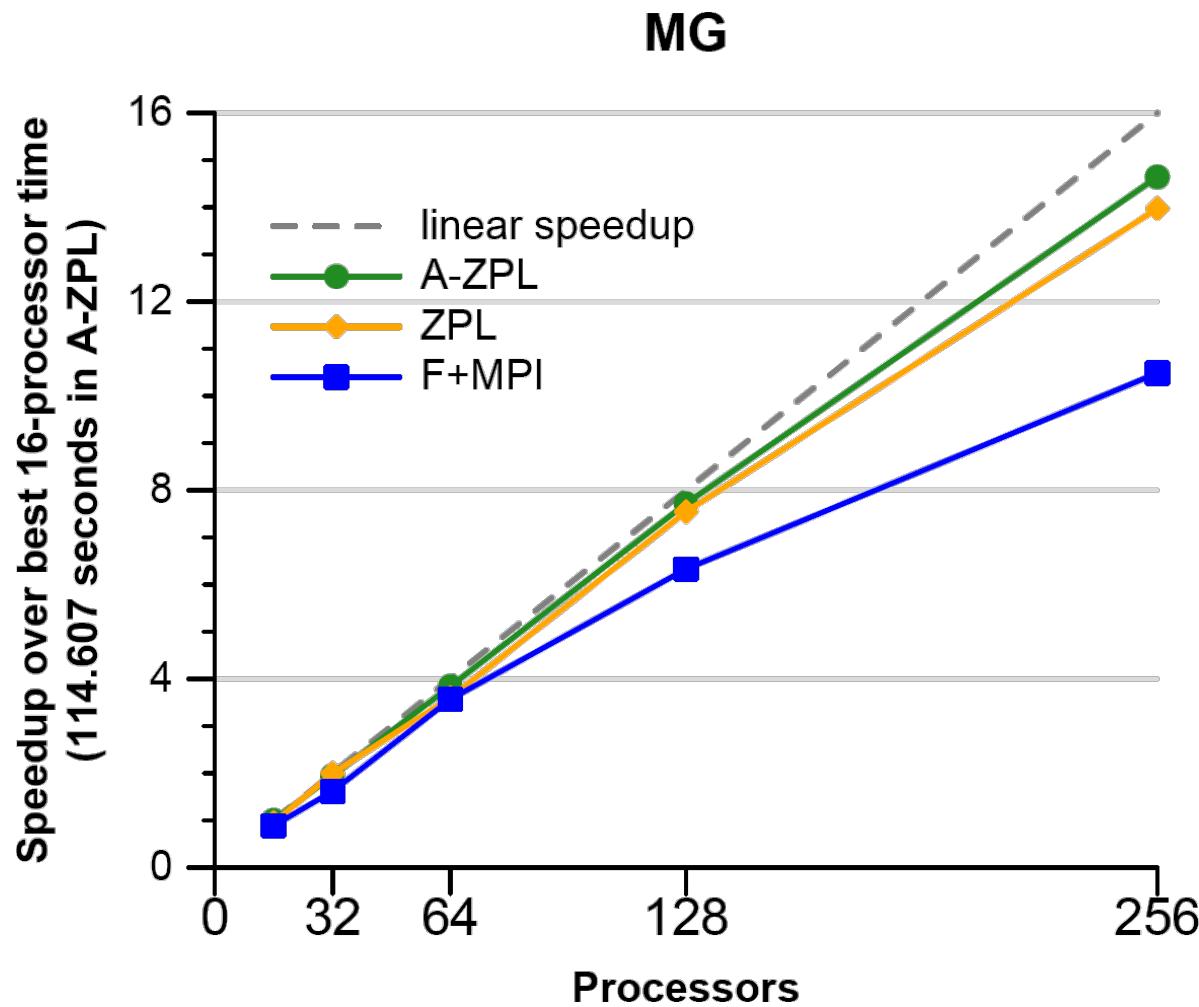
MG Memory Usage

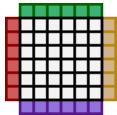
MG Class C -- memory usage





NAS MG Speedup: Cray T3E





Another victory for arrays!

- Sparse computation expressed like dense
- Compact, clean, comprehensible code again
(not seen in this presentation)
- Code expresses algorithm, not implementation
 - compiler optimizes implementation based on need

ZPL Summary

- **First-class concept for representing index sets**

- makes clouds of scalars in array declarations and loops concrete
- supports global-view of data and control; improved productivity
- useful abstraction for user and compiler

The Design and Implementation of a Region-Based Parallel Language. Bradford L. Chamberlain.
PhD thesis, University of Washington, November 2001

- **Semantics constraining alignment of interacting arrays**

- communication requirements visible to user and compiler in syntax
- ZPL's WYSIWYG performance model.** Bradford L. Chamberlain, Sung-Eun Choi, E Christopher Lewis, Calvin Lin, Lawrence Snyder, and W. Derrick Weathersby. In *Proceedings of the IEEE Workshop on High-Level Parallel Programming Models and Supportive Environments*, 1998.

- **Implementation-neutral expression of communication**

- supports implementation on each architecture using best paradigm
- A compiler abstraction for machine independent parallel communication generation.** Bradford L. Chamberlain, Sung-Eun Choi, and Lawrence Snyder. In *Proceedings of the Workshop on Languages and Compilers for Parallel Computing*, 1997.



ZPL's Drawbacks

1) ZPL only supports one level of data parallelism

- No task parallelism / concurrent programming
- No nested parallelism (data or otherwise)
- ZPL's parallelism can never be very dynamic / unpredictable
 - single-threaded SPMD only

Takeaway:

*Users want more general forms of parallelism
(as do modern architectures and algorithms)*

Challenge:

*What would it take to meaningfully support general parallel
programming with ZPL-like regions and arrays?*



ZPL's Drawbacks

2) WYSIWYG depends on having two distinct array types:

- i. parallel arrays, which you've been hearing about
- ii. traditional arrays which support indexing, yet are serial / local only

```
var ThreeParArrs:      array [1..3] of [R] double;
```

```
var ParArrofTriples: [R] array [1..3] of double;
```

```
[R] TheeParArrs[2] := ParArrofTriples[2];
```

ZPL's Drawbacks

2) WYSIWYG depends on having two distinct array types:

- i. parallel arrays, which you've been hearing about
- ii. traditional arrays which support indexing, yet are serial / local only

```
var ThreeParArrs:      array [1..3] of [R] double;  
var ParArrofTriples: [R] array [1..3] of double;
```

- this breaks code reuse and results in unfortunate code clones
 - “I need to rewrite this operation twice, once for each array type”
 - (or 2^k times for k array arguments?)
- there’s a real tension here: WYSIWYG would be lost if...
 - ...parallel arrays supported indexing
 - ...serial arrays supported array operators



ZPL's Drawbacks

2) WYSIWYG depends on having two distinct array types:

- i. parallel arrays, which you've been hearing about
- ii. traditional arrays which support indexing, yet are serial / local only

```
var ThreeParArrs:      array [1..3] of [R] double;  
var ParArrofTriples: [R] array [1..3] of double;
```

Takeaway:

Having distinct types for parallel vs. serial arrays is regrettable

Challenge:

How can ZPL's region/array benefits best be carried forward?



ZPL's Drawbacks

3) ZPL only supports Block-distributed arrays

- real algorithms may want other distributions: block-cyclic, MRB, ...
- distribution baked into the compiler, not extensible
- memory layouts are also hard-coded
 - RMO for dense arrays
 - special ZPL format for sparse arrays

Takeaway:

*While block is an important common case, it's not a panacea.
Inability to get CSR sparse arrays hurt CG performance.*

Challenge:

How to support more general distributions and layouts without giving up performance?



ZPL's Drawbacks

4) Dated in several respects

- syntactically follows Modula rather than C (say)
- no support for OOP
- ...
- **a good example of academic vs. practical language design**
 - for academic work, such things may not matter (they didn't for ZPL)
 - for practical adoption, they can be show-stoppers (they were for ZPL)

Takeaway:

Users value attractive, modern, feature-rich language design.

Challenge:

How to keep the kitchen sink from dragging down a sleek design.



Main ZPL Sacrifice in moving to Chapel

Q: Any guesses?

A: Chapel has no WYSIWYG model

- Chapel has one type of array for simplicity, code re-use
 - parallelism is a property of operators / loops, not arrays
 - distributed arrays support indexing
- Interacting arrays need not be distributed identically

```
var ThreeParArrs: [1..3] [R] real;  
var ParArrofTriples: [R] [1..3] real;
```

// ambiguous:

~~[1..3][i, 1..n] ThreeParArrs = ParArrofTriples;~~

// unless we use a tag to distinguish:

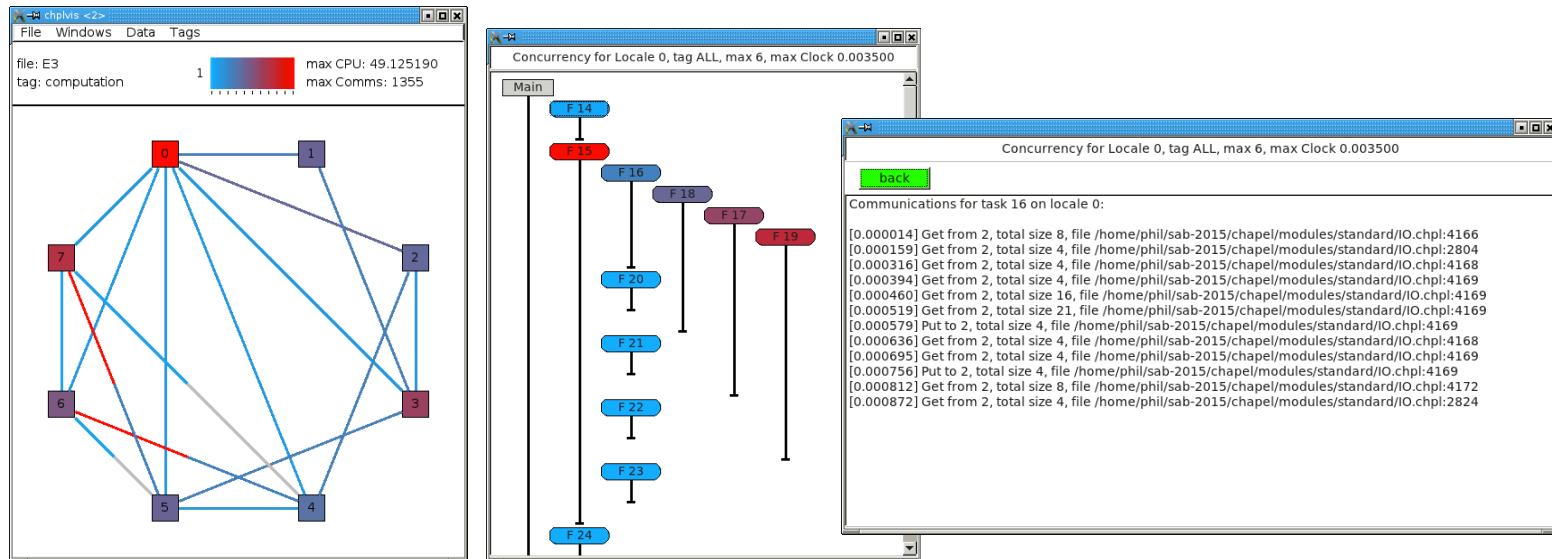
```
[i in 1..3] [jk in {i, 1..n}]  
    ThreeParArrs[i][jk] = ParArrOfTriples[jk][i];
```

// which is essentially an index...



Life without WYSIWYG

- Yet, Chapel users can still reason about communication
 - semantic model is explicit about where data is placed / tasks execute
 - execution-time queries support reasoning about locality
 - `here` – where is this task running?
 - `x.locale` – where is x stored?
 - new **chplvis** tool supports visualization of communication
 - developed by Phil Nelson, WWU



ZPL vs. Chapel: Other Differences

ZPL

- ◆ data parallel only
- ◆ built-in data distributions
- ◆ designed in an evolutionary manner “what can we do well today, tomorrow?”
- ◆ academic focus: pick one problem to address (array-based data parallelism)
- ◆ single-threaded, distributed-memory execution model
- ◆ create something that matches today’s architectures

Chapel

- ◆ task-, nested parallelism
- ◆ user-defined data distributions
- ◆ designed in a blue-sky manner: “what would an ideal parallel language support?”
- ◆ market focus: what does a general, broad-market language require?
- ◆ multithreaded, shared address space execution model
- ◆ create something productive; unproductive architectures may suffer





Chapel



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What is Chapel?

Chapel: An emerging parallel programming language

- portable
- open-source
- a collaborative effort
- a work-in-progress

Goals:

- Support general parallel programming
 - “any parallel algorithm on any parallel hardware”
- Make parallel programming far more productive
- Designed for practical adoption, not publications

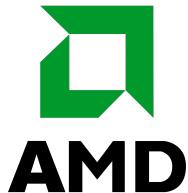


The Chapel Team at Cray (May 2016)





Chapel Community R&D Efforts



THE GEORGE
WASHINGTON
UNIVERSITY
WASHINGTON, DC



Lawrence Berkeley
National Laboratory



HAVERFORD
COLLEGE

(and several others, some of whom you will hear from today...)

<http://chapel.cray.com/collaborations.html>

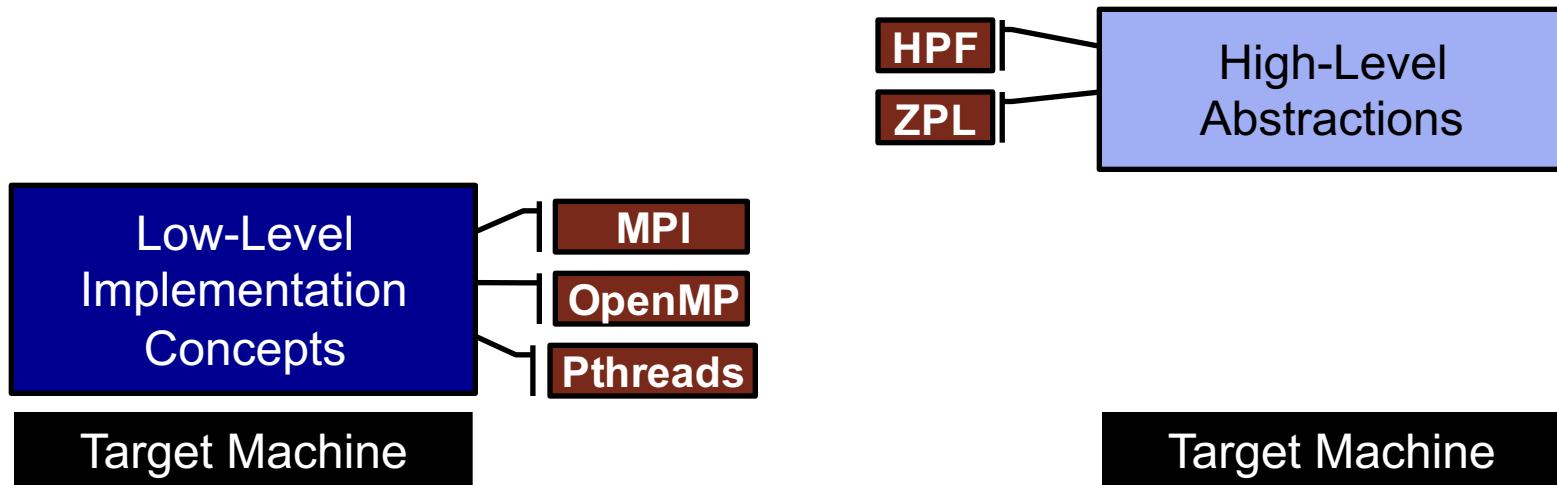


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Chapel's Multiresolution Design: Motivation



“Why is everything so tedious/difficult?”

*“Why don’t my programs trivially
port
to new systems?”*

“Why don’t I have more control?”



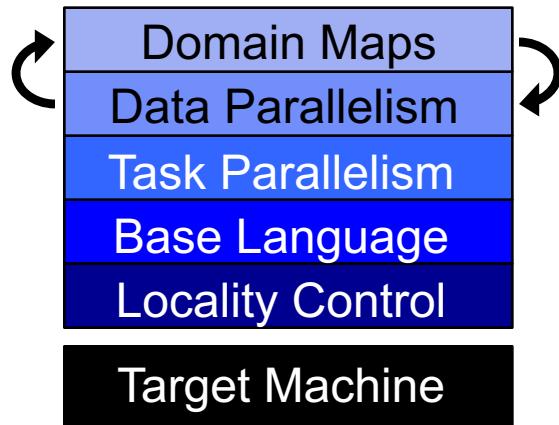
Chapel's Multiresolution Design



Multiresolution Design: Support multiple tiers of features

- higher levels for programmability, productivity
- lower levels for greater degrees of control

Chapel language concepts



- build the higher-level concepts in terms of the lower
- permit the user to intermix layers arbitrarily

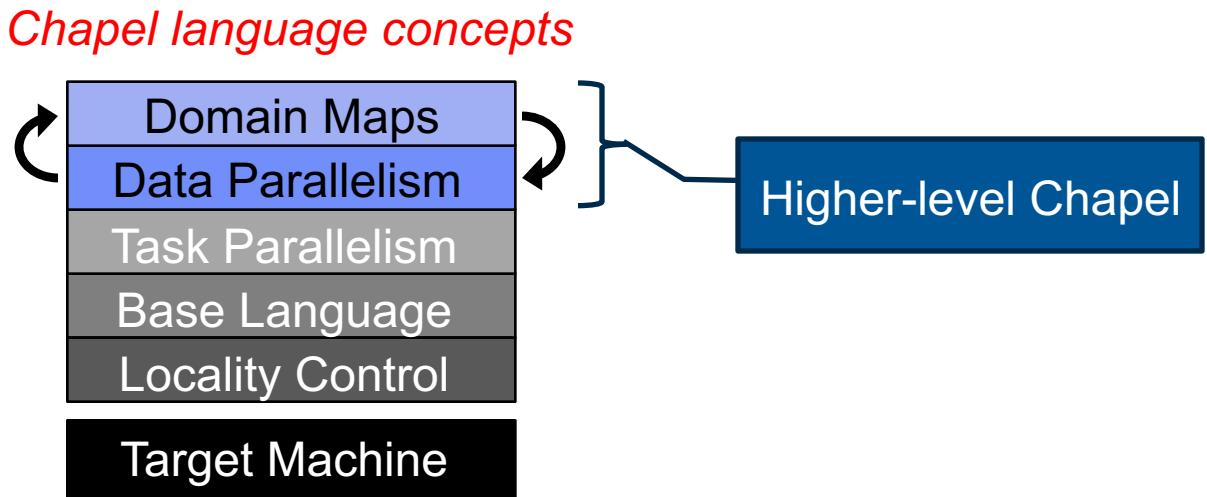


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Higher-Level Features



Data Parallelism, by example

dataParallel.chpl

```
config const n = 1000;
var D = {1..n, 1..n};

var A: [D] real;
forall (i,j) in D do
    A[i,j] = i + (j - 0.5)/n;
writeln(A);
```

```
prompt> chpl dataParallel.chpl -o dataParallel
prompt> ./dataParallel --n=5
1.1 1.3 1.5 1.7 1.9
2.1 2.3 2.5 2.7 2.9
3.1 3.3 3.5 3.7 3.9
4.1 4.3 4.5 4.7 4.9
5.1 5.3 5.5 5.7 5.9
```



Data Parallelism, by example

Domains (Chapel's *regions*)

dataParallel.chpl

```
config const n = 1000;
var D = {1..n, 1..n};

var A: [D] real;
forall (i,j) in D do
    A[i,j] = i + (j - 0.5)/n;
writeln(A);
```

```
prompt> chpl dataParallel.chpl -o dataParallel
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1.1 1.3 1.5 1.7 1.9
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3.1 3.3 3.5 3.7 3.9
4.1 4.3 4.5 4.7 4.9
5.1 5.3 5.5 5.7 5.9
```



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Data Parallelism, by example

Arrays

dataParallel.chpl

```
config const n = 1000;  
var D = {1..n, 1..n};  
  
var A: [D] real;  
forall (i,j) in D do  
    A[i,j] = i + (j - 0.5)/n;  
writeln(A);
```

```
prompt> chpl dataParallel.chpl -o dataParallel  
prompt> ./dataParallel --n=5  
1.1 1.3 1.5 1.7 1.9  
2.1 2.3 2.5 2.7 2.9  
3.1 3.3 3.5 3.7 3.9  
4.1 4.3 4.5 4.7 4.9  
5.1 5.3 5.5 5.7 5.9
```



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Data Parallelism, by example

Data-Parallel Forall Loops

dataParallel.chpl

```
config const n = 1000;
var D = {1..n, 1..n};

var A: [D] real;
forall (i,j) in D do
    A[i,j] = i + (j - 0.5)/n;
writeln(A);
```

```
prompt> chpl dataParallel.chpl -o dataParallel
prompt> ./dataParallel --n=5
1.1 1.3 1.5 1.7 1.9
2.1 2.3 2.5 2.7 2.9
3.1 3.3 3.5 3.7 3.9
4.1 4.3 4.5 4.7 4.9
5.1 5.3 5.5 5.7 5.9
```



Distributed Data Parallelism, by example

Domain Maps
(Map Data Parallelism to the System)

dataParallel.chpl

```
use CyclicDist;
config const n = 1000;
var D = {1..n, 1..n}
      dmapped Cyclic(startIdx = (1,1));
var A: [D] real;
forall (i,j) in D do
  A[i,j] = i + (j - 0.5)/n;
writeln(A);
```

```
prompt> chpl dataParallel.chpl -o dataParallel
prompt> ./dataParallel --n=5 --numLocales=4
1.1 1.3 1.5 1.7 1.9
2.1 2.3 2.5 2.7 2.9
3.1 3.3 3.5 3.7 3.9
4.1 4.3 4.5 4.7 4.9
5.1 5.3 5.5 5.7 5.9
```



Distributed Data Parallelism, by example

dataParallel.chpl

```
use CyclicDist;
config const n = 1000;
var D = {1..n, 1..n}
        dmapped Cyclic(startIdx = (1,1));
var A: [D] real;
forall (i,j) in D do
    A[i,j] = i + (j - 0.5)/n;
writeln(A);
```

```
prompt> chpl dataParallel.chpl -o dataParallel
prompt> ./dataParallel --n=5 --numLocales=4
1.1 1.3 1.5 1.7 1.9
2.1 2.3 2.5 2.7 2.9
3.1 3.3 3.5 3.7 3.9
4.1 4.3 4.5 4.7 4.9
5.1 5.3 5.5 5.7 5.9
```



Chapel Data Parallel Operations

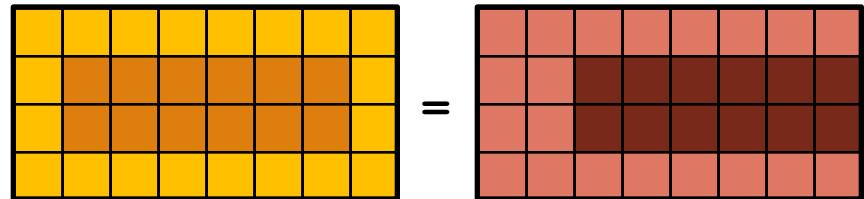
- Data Parallel Iteration

```
forall (i,j) in D do  
  A[i,j] = i + j/10.0;
```

| | | | | | | | |
|-----|-----|-----|-----|-----|-----|-----|-----|
| 1.1 | 1.2 | 1.3 | 1.4 | 1.5 | 1.6 | 1.7 | 1.8 |
| 2.1 | 2.2 | 2.3 | 2.4 | 2.5 | 2.6 | 2.7 | 2.8 |
| 3.1 | 3.2 | 3.3 | 3.4 | 3.5 | 3.6 | 3.7 | 3.8 |
| 4.1 | 4.2 | 4.3 | 4.4 | 4.5 | 4.6 | 4.7 | 4.8 |

- Array Slicing; Domain Algebra

```
A[InnerD] = B[InnerD+(0,1)];
```



- Promotion of Scalar Functions and Operators

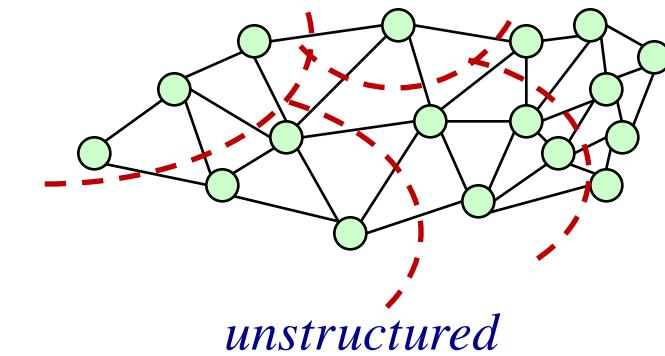
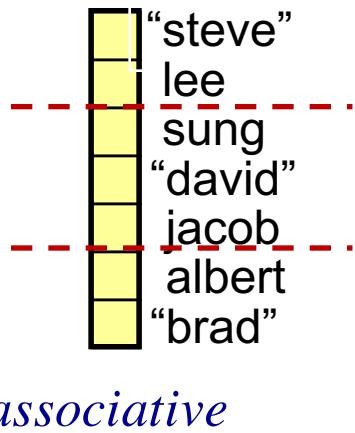
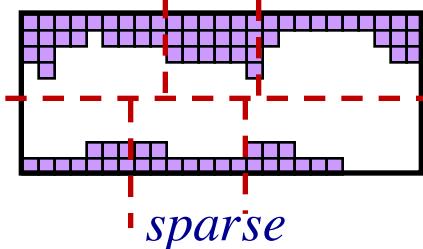
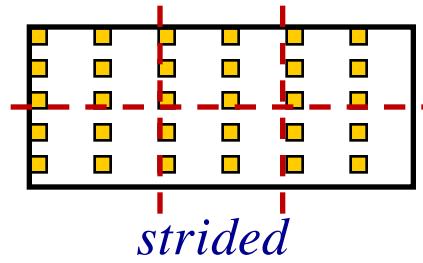
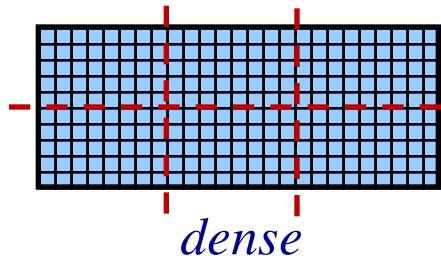
```
A = exp(B, C);
```

```
A = foo("hi", B, C);
```

```
A = B + alpha * C;
```

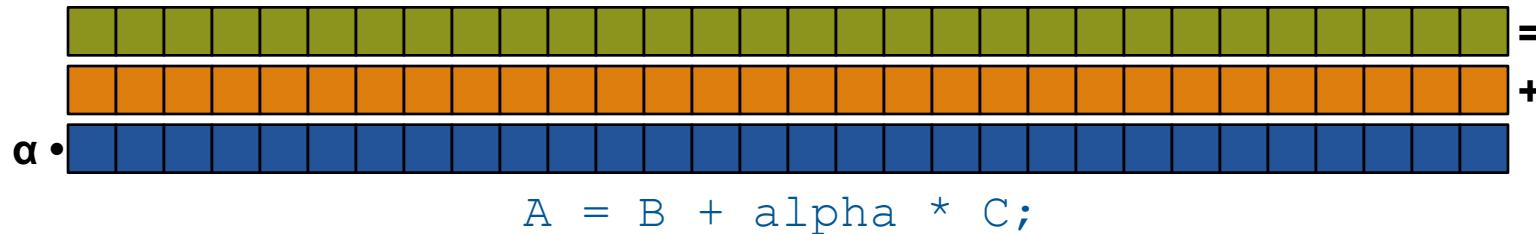
- And many others: reductions, scans, reallocation, reshaping, remapping, set operations, aliasing, ...

Chapel has Many Types of Domains/Arrays

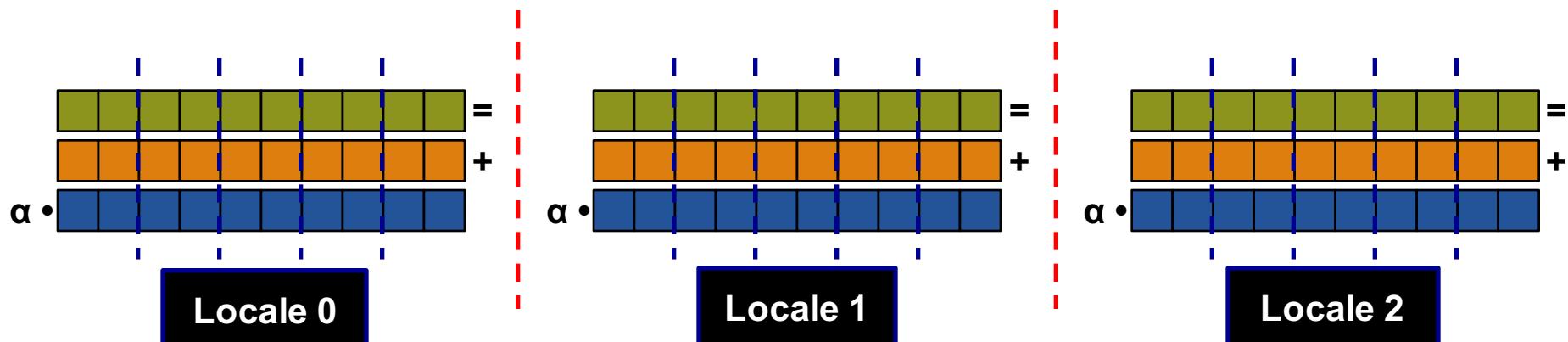


Domain Maps

Domain maps are “recipes” that instruct the compiler how to map the global view of a computation...



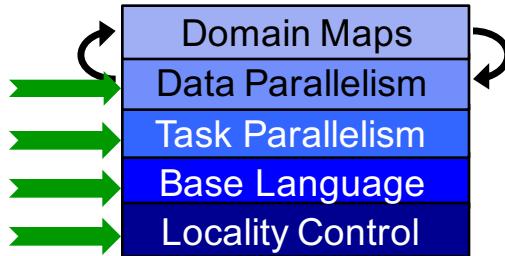
...to the target locales' memory and processors:



Chapel's Domain Map Philosophy

- 1. Chapel provides a library of standard domain maps**
 - to support common array implementations effortlessly

- 2. Expert users can write their own domain maps in Chapel**
 - to cope with any shortcomings in our standard library



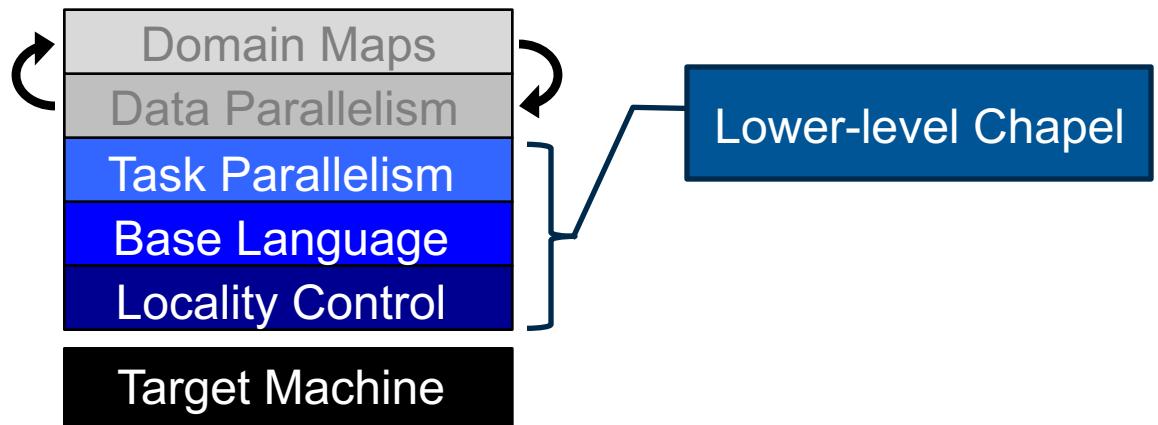
- 1. Chapel's standard domain maps are written using the same end-user framework**
 - to avoid a performance cliff between “built-in” and user-defined cases

Impacts of Chapel's Domain Map Philosophy

- **Chapel supports both global- and local-view programming**
 - domain maps form a gateway between the two worldviews
- **Our approach put us at a performance disadvantage**
 - all Chapel arrays are written as Chapel code
 - compiler has no built-in knowledge of arrays, as in ZPL, Fortran, C
 - a distinct performance handicap compared to those languages
 - this has slowed our start, but we don't think it's inherently problematic
 - that said, we have not achieved parity with ZPL yet at scale
 - (though admittedly, our focus has been different)
 - nor have we re-implemented many key ZPL optimizations in Chapel (yet)
 - e.g., communication optimizations, stencil optimization that helped NAS MG

Lower-Level Features

Chapel language concepts



Base Language Features, by example

```
iter fib(n) {
    var current = 0,
        next = 1;

    for i in 1..n {
        yield current;
        current += next;
        current <=> next;
    }
}
```

```
for (i,f) in zip(0..#n, fib(n)) do
    writeln("fib #", i, " is ", f);
```

```
fib #0 is 0
fib #1 is 1
fib #2 is 1
fib #3 is 2
fib #4 is 3
fib #5 is 5
fib #6 is 8
...
```

Base Language Features, by example

CLU-style iterators

```
iter fib(n) {
    var current = 0,
        next = 1;

    for i in 1..n {
        yield current;
        current += next;
        current <=gt; next;
    }
}
```

```
for (i,f) in zip(0..#n, fib(n)) do
    writeln("fib #", i, " is ", f);
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fib #0 is 0
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Base Language Features, by example

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iter fib(n) {
    var current = 0,
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    for i in 1..n {
        yield current;
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        current <=> next;
    }
}
```

built-in range types
and operators

```
for (i,f) in zip(0..#n, fib(n)) do
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fib #0 is 0
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Base Language Features, by example

```
iter fib(n) {
    var current = 0,
        next = 1;

    for i in 1..n {
        yield current;
        current += next;
        current <=> next;
    }
}
```

for (*i,f*) **in** **zip**(0..#*n*, fib(*n*)) **do**
 writeln("fib #", *i*, " is ", *f*);

```
fib #0 is 0
fib #1 is 1
fib #2 is 1
fib #3 is 2
fib #4 is 3
fib #5 is 5
fib #6 is 8
...
...
```

zippered iteration

Base Language Features, by example

```
iter fib(n) {
    var current = 0,
        next = 1;

    for i in 1..n {
        yield current;
        current += next;
        current <=> next;
    }
}
```

tuples

```
for (i,f) in zip(0..#n, fib(n)) do
    writeln("fib #", i, " is ", f);
```

```
fib #0 is 0
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fib #4 is 3
fib #5 is 5
fib #6 is 8
...
```

Base Language Features, by example

Static Type Inference for:

- arguments
- return types
- variables

```
iter fib(n) {
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    for i in 1..n {
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    }
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```

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for (i,f) in zip(0..#n, fib(n)) do
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...
```

Task Parallelism, Locality Control, by example

taskParallel.chpl

```
coforall loc in Locales do
    on loc {
        const numTasks = here.maxTaskPar;
        coforall tid in 1..numTasks do
            writef("Hello from task %n of %n "+
                "running on %s\n",
                tid, numTasks, here.name);
    }
}
```

```
prompt> chpl taskParallel.chpl -o taskParallel
prompt> ./taskParallel --numLocales=2
Hello from task 1 of 2 running on n1033
Hello from task 2 of 2 running on n1032
Hello from task 2 of 2 running on n1033
Hello from task 1 of 2 running on n1032
```



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Task Parallelism, Locality Control, by example

High-Level
Task Parallelism

taskParallel.chpl

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Task Parallelism, Locality Control, by example

Abstraction of System Resources

taskParallel.chpl

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Task Parallelism, Locality Control, by example

Control of Locality/Affinity

taskParallel.chpl

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Task Parallelism, Locality Control, by example

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Hello from task 1 of 2 running on n1032
```



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Task Parallelism, Locality Control, by example

Not seen here:

Data-centric task coordination
via atomic and full/empty vars

taskParallel.chpl

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coforall loc in Locales do
    on loc {
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        coforall tid in 1..numTasks do
            writef("Hello from task %n of %n "+
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Task Parallelism, Locality Control, by example

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Hello from task 2 of 2 running on n1033
Hello from task 1 of 2 running on n1032
```



Parallelism and Locality: Orthogonal in Chapel

- This is a **parallel**, but local program:

```
coforall i in 1..msgs do  
    writeln("Hello from task ", i);
```

- This is a **distributed**, but serial program:

```
writeln("Hello from locale 0!");  
on Locales[1] do writeln("Hello from locale 1!");  
on Locales[2] do writeln("Hello from locale 2!");
```

- This is a **distributed parallel** program:

```
coforall i in 1..msgs do  
    on Locales[i%numLocales] do  
        writeln("Hello from task ", i,  
               " running on locale ", here.id);
```



ZPL and Chapel Resources



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ZPL Resources

- **Project Page:**

<http://research.cs.washington.edu/zpl/home/index.html>

- **Recommended Reading:**

The Design and Development of ZPL. Lawrence Snyder. *HOPL III: Proceedings of the third ACM SIGPLAN conference on History of Programming Languages*, 8-1–8-37, 2007.

The Design and Implementation of a Region-Based Parallel Language. Bradford Chamberlain. *Ph.D. Thesis*, University of Washington, September 2001.



Chapel Websites

Project page: <http://chapel.cray.com>

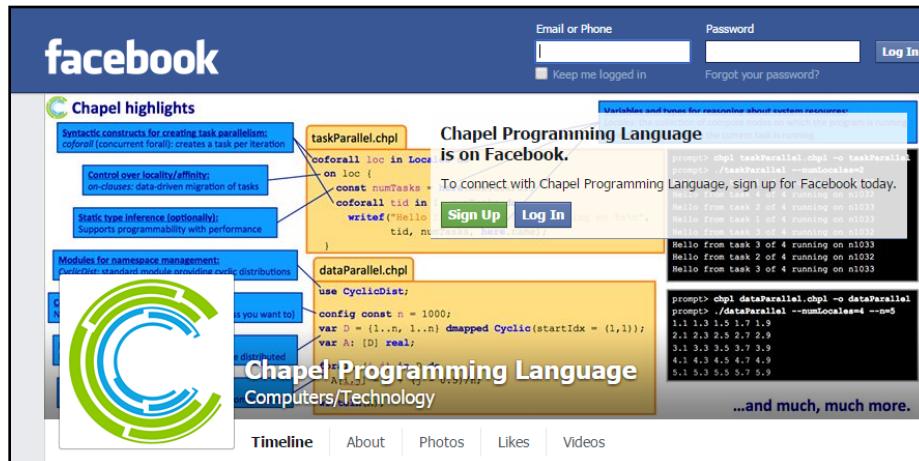
- overview, papers, presentations, language spec, ...

GitHub: <https://github.com/chapel-lang>

- download Chapel; browse source repository; contribute code

Facebook: <https://www.facebook.com/ChapelLanguage>

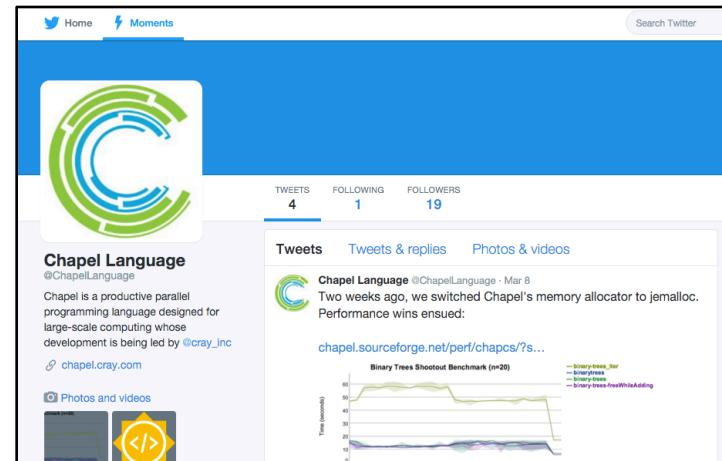
Twitter: <https://twitter.com/ChapelLanguage>



The screenshot shows the Chapel Programming Language Facebook page. It features a large green and blue 'C' logo. The page highlights include:

- Syntactic constructs for creating task parallelism: `coforall` (concurrent `forall`): creates a task per iteration.
- Control over locality/affinity: `onLoc`: data-driven migration of tasks.
- Static type inference (optionally): Supports programmability with performance.
- Modules for namespace management: `modDecl`: extends standard programming with distributions.
- `taskParallel.chpl`: `coforall loc in Loc {`
- `dataParallel.chpl`: `use CyclicDist;`

The timeline shows a post from the page itself: "Chapel Programming Language is on Facebook. To connect with Chapel Programming Language, sign up for Facebook today." Below the post are several snippets of Chapel code and their corresponding execution outputs.



The screenshot shows the Chapel Language Twitter account (@ChapelLanguage). The profile picture is the same green and blue 'C' logo. The bio reads: "Chapel is a productive parallel programming language designed for large-scale computing whose development is being led by @cray_inc". The account has 4 tweets, 1 following, and 19 followers. A tweet from March 8, 2016, states: "Two weeks ago, we switched Chapel's memory allocator to jemalloc. Performance wins ensued: chapel.sourceforge.net/perf/chapcs/?s...". Below the tweet is a line graph titled "Binary Trees Shootout Benchmark (n=20)" showing performance metrics over time.



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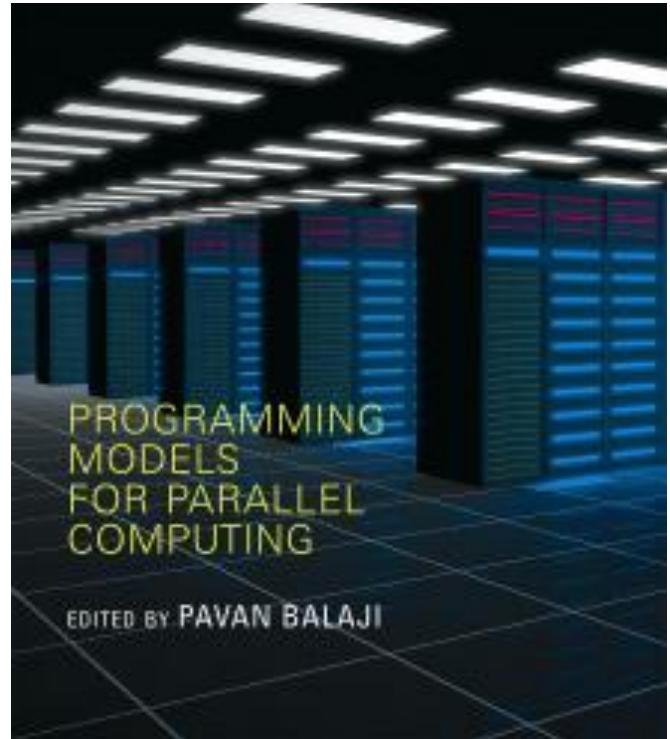
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Suggested Reading

Chapel chapter from *Programming Models for Parallel Computing*

- a detailed overview of Chapel's history, motivating themes, features
- edited by Pavan Balaji, published by MIT Press, November 2015
- chapter is now also available online



Other Chapel papers/publications available at <http://chapel.cray.com/papers.html>

Chapel Blog Articles

[Chapel: Productive Parallel Programming](#), Cray Blog, May 2013.

- *a short-and-sweet introduction to Chapel*

[Chapel Springs into a Summer of Code](#), Cray Blog, April 2016.

- *a run-down of some current events*

[Six Ways to Say “Hello” in Chapel](#) (parts [1](#), [2](#), [3](#)), Cray Blog, Sep-Oct 2015.

- *a series of articles illustrating the basics of parallelism and locality in Chapel*

[Why Chapel?](#) (parts [1](#), [2](#), [3](#)), Cray Blog, Jun-Oct 2014.

- *a series of articles answering common questions about why we are pursuing Chapel in spite of the inherent challenges*

[\[Ten\] Myths About Scalable Programming Languages](#), IEEE TCSC Blog (index available on [chapel.cray.com](#) “blog articles” page), Apr-Nov 2012.

- *a series of technical opinion pieces designed to argue against standard reasons given for not developing high-level parallel languages*

Chapel Mailing Lists

low-traffic (read-only):

chapel-announce@lists.sourceforge.net: announcements about Chapel

community lists:

chapel-users@lists.sourceforge.net: user-oriented discussion list

chapel-developers@lists.sourceforge.net: developer discussions

chapel-education@lists.sourceforge.net: educator discussions

chapel-bugs@lists.sourceforge.net: public bug forum

(subscribe at SourceForge: <http://sourceforge.net/p/chapel/mailman/>)

To contact the Cray team:

chapel_info@cray.com: contact the team at Cray

chapel_bugs@cray.com: for reporting non-public bugs



Acknowledgements

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Thanks also to all the past and present members of the Chapel team for their contributions, particularly Burton Smith and David Callahan for opening the gate and leading the charge.



Questions?



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