Distributed-memory architectures

- Physically distributed memory, disjoint addresses
- Advantages  $\rightarrow$  high price/performance, scalability • Physically distributed memory, disjoint addresses<br>• Advantages  $\rightarrow$  high price/performance, scalability<br>• Disadvantages  $\rightarrow$  local address spaces, communication
- 
- Disadvantages  $\rightarrow$  local address spaces, communicate via explicit send/recv messages
- Communicate via explicit send/recv messages<br>• Large messages amortize communication overhead

Data-Parallel Languages

- ata-Parallel Languages<br>• Uniform fine-grain operations on arrays
- Uniform fine-grain operations on a<br>• Shared data in large, global arrays
- Shared data in large, global arrays<br>• Implicit synchronization between operations
- Implicit synchronization between operations<br>• Implicit communication derived from mapping hints
- Implicit communication der:<br>• Examples: APL, Fortran 90

At one point, data-parallel languages were viewed as the most feasible programming model for large distributed-memory multiprocessors.

- TEMPLATE  $\longrightarrow$  abstract problem domain<br>ALIGN  $\longrightarrow$  map from array to decomposition
- DISTRIBUTE  $\longrightarrow$  map from decomposition to machine









Example REAL  $X(8,8)$ TEMPLATE A(8,8) ALIGN  $X(i, j)$  WITH  $A(j+3, i-2)$ DISTRIBUTE A(\*,BLOCK) DISTRIBUTE A(CYCLIC,\*)

 $\textsc{DISTRIBUTE~A(CYCLIC,*)}$   $\textsc{FORALL} \rightarrow \textsc{parallel~loop~with~copy-in/copy-out~semantics}$  $\text{FORALL} \rightarrow \text{parallel loo}$ <br> $\text{INDEF} \rightarrow \text{parallel loop}$  $\text{FORALL} \rightarrow \text{parallel loop with copy-in}/\text{copy-on}$ <br> $\text{INDEPEND} \rightarrow \text{parallel loop}$ <br>Intrinsics  $\rightarrow$  parallel functions from Fortran 90

Help analysis with assertions

- Align, distribute
- Align, distribute<br>• Forall, independent • Forall, in<br>• Intrinsics
- 

Distribute array dimensions for parallelism

- stribute array dimensions for parallelism<br>• data updated in parallel should be on different processors
- data updated in parallel should be on different proce<br>• data used together should be on the same processors

Don't try to hide from compiler what you're doing!



Requirements

- equirements<br>• Partition data & computation • Partition data & comput<br>• Generate communication
- 

Single-program, multiple-data (SPMD) node programs

"Owner Computes" Rule

- Owner of datum computes its value
- Dynamic data decomposition

Data decomposition

- ata decomposition<br>• User-specified (HPF) or automatic • User-specified (HPF) or automa<br>• Derive computation distribution
- 
- Derive computation distribution<br>• Simple decompositions appear sufficient  $\bullet$  Simple decompositions appear sufficient<br>ompilation process  $1)$  Analyze program  $\rightarrow$  apply dependence analysis

Compilation process

- 
- 
- 3) Partition computation  $\rightarrow$  owner computes rule
- 
- $(3)$  Partition computation  $\rightarrow$  owner computes rule<br>  $(4)$  Analyze communication  $\rightarrow$  find nonlocal reference<br>  $(5)$  Optimize communication  $\rightarrow$  select communication 4) Analyze communication  $\rightarrow$  find nonlocal references<br>5) Optimize communication  $\rightarrow$  select communication<br>6) Manage storage  $\rightarrow$  select overlaps and buffers
- 
- 

Compilation approaches

- Calculates nonlocal data, generates send/recv
- Selects communication type, calls run-time library
- 1) Analyze program  $\rightarrow$  apply dependence analysis<br>2) Partition data  $\rightarrow$  template, align, distribute
	-
	-
- $\begin{align*} \text{A} & \text{A} & \text{B} & \rightarrow \text{C} \ \text{A} & \text{B} & \rightarrow \text{C} \ \text{B} & \text{A} & \rightarrow \text{C} \ \text{A} & \text{B} & \rightarrow \text{D} \ \text{A} & \text{B} & \text{B} & \text{C} \ \text{A} & \text{B} & \text{A} & \rightarrow \text{D} & \text{D} \ \text{B} & \text{B} & \text{A} & \rightarrow \text{D} & \text{D} \ \text{B} & \text{B} & \text{B} & \text{A} & \rightarrow \text{D} \ \text{B} & \text$ 
	-
	-
- 5) Optimize communication  $\rightarrow$  select communication<br>6) Manage storage  $\rightarrow$  select overlaps and buffers<br>7) Generate code  $\rightarrow$  instantiate partition & messages

```
f HPF Program g f Compiler Output g
{ HPF Program } \{ \text{Complier Output } \}<br>REAL A(100), B(100) REAL A(1:25), B(0:25)
N$PROC = 4 P = myproc() { 0 ... 3 }\begin{align} \text{DO} \text{ i } &= 2,100 \\ \text{A(i)} &= \text{B(i-1)} \\ \text{ENDDO} \end{align} \begin{align} \text{DO} \text{ i } &= \text{Ib$1,25} \\ \text{A(i)} &= \text{B(i-1)} \\ \text{ENDDO} \end{align}
```

```
TEMPLATE D(100) lb$1 = max(P*25+1,2)-(P*25)
 \begin{array}{lll} \text{NSPROC = 4} & \text{ $P = \text{myproc}() \; \{ \; 0 \; ... \; 3 \; \} \ \text{TEMPLATE D(100)} & & \text{lb$1 = \text{max}(\text{P*25+1,2})$-} (\text{P*25}) \ \text{ALIGN A, B WITH D} & & \text{IF (P < 3) $\text{send B(25) to P$-} \end{array}\begin{array}{lll} \text{TEMPLATE D(100)} & \text{lb$1 = \max (P^*25+1,2) $- (P^*25)$} \ \text{ALIGN A, B WITH D} & \text{IF (P < 3) send B(25) to P_{right}} \ \text{DISTRIBUTE D(BLOCK)} & \text{IF (P > 0) <u>recv</u> B(0) from P_{left}} \end{array}DISTRIBUTE D(BLOCK) IF (P > 0) <u>recv</u> B(0) from P_{left}<br>DO i = 2,100 DO i = lb$1,25
```
- ENDDO<br>• Local data  $\rightarrow$  A(1:25), B(1:25)
	- Local computation  $\rightarrow$  [DO i = 1:25]
	- Local data  $\rightarrow$  A(1:25), B(1:25)<br>
	 Local computation  $\rightarrow$  [DO i = 1:25]<br>
	 Nonlocal accesses  $\rightarrow$  B(0:24) B(1:25) = B(0) • Local computation  $\rightarrow$  [DO i = 1:25]<br>• Nonlocal accesses  $\rightarrow$  B(0:24) – B(1:25)<br>• Communication  $\rightarrow$  send B(25) to P<sub>right</sub> • Nonlocal accesses  $\rightarrow$  B(0:24) – B(1:25) =<br>
	• Communication  $\rightarrow$  send B(25) to  $P_{right}$ <br>
	• Overlap storage  $\rightarrow$  Extend B to hold B(0)
	-
	-



Key optimization & code generation technique

Place communication at level of deepest loop that carries <sup>a</sup> true dependence OR contains endpoints of <sup>a</sup> loop-independent true dependence

Classify references as independent, carried-all, or carried-part<br>DO  $k = 1,M$  send & <u>recv</u> B

sify references as independent, cari<br>  $D k = 1,M$  send & <u>recv</u><br>  $DO i = 1,N$   $DO k = 1,M$  $\begin{array}{ll}\n\text{DO } k = 1,\text{M} & \text{send } \& \text{recv } \text{B} \\
\text{DO } i = 1,\text{N} & \text{DO } k = 1,\text{M} \\
\delta_{\infty} & \text{A}(i) = \text{B}(i+2) & \text{send } \& \text{recv } \text{C}\n\end{array}$  $\begin{array}{ccc} \hbox{DO i = '1,N} & \overline{\rm DO\ k} = \ \delta_\infty & {\rm A(i) = B(i+2)} & \frac{\rm send\ \&} {\rm C(i) = C(i+2)} & \frac{\rm recv}{\rm DC} \, {\rm D} \end{array}$  $\begin{array}{ll} \delta_\infty & \quad {\rm A(i)=B(i+2)}\ \delta_k & \quad {\rm C(i)=C(i+2)}\ \delta_i & \quad {\rm D(i)=D(i-2)}\ \end{array} \qquad \begin{array}{ll} \frac{\rm send}{\rm send}~\&\rm{recv}}{\rm DO~i=1,N/P} \end{array}$  $C(i) = C(i+2)$ <br>  $D(i) = D(i-2)$ <br>  $ENDDO$ <br>  $C(i+2) = D(i-2)$ <br>  $DO$   $i = 1, N/P$ <br>  $A(i) = B(i+2)$  $\delta_i$  D(i) = D(i-2) DO i = 1,N/P<br>ENDDO  $A(i)$  = B(i+2)<br>ENDDO C(i) = C(i+2)  $\mathrm{C}(\mathrm{i}) = \mathrm{C}(\mathrm{i}+2) \ \mathrm{D}(\mathrm{i}) = \mathrm{D}(\mathrm{i}-2)$  $\begin{array}{c} \rm C(i) = \rm D(i) = \rm ENDDO \end{array}$  $\begin{array}{c} \mathrm{D} \dot{\mathrm{(i)}} \ \mathrm{ENDD} \ \mathrm{send} \; \mathrm{D} \end{array}$ ENDDO

Utilize Collective Communication Primitives

- Simplifies communication Primitives<br>• Simplifies communication, utilizes efficient primitives • Simplifies communication, u<br>• Syntactic pattern matching
- 

```
Example
      TEMPLATE D(N,N)
      EMPLATE D(N,N)<br>TEMPLATE D(N,N<br>ALIGN A, B with D
      ALIGN A, B with D<br>DISTRIBUTE D(BLOCK,BLOCK)
      ALIGN A,<br>DISTRIB<mark>U</mark><br>do j = 2,N
            \begin{array}{c} \mathrm{STRIBUT} \ \mathrm{j = 2, N} \ \mathrm{do \ i = 2, N} \end{array}A(i,j) = B(i,j-1) + B(i-1,j) [shift]
                  A(i,j) = B(c,j) [broadcast]
                 A(i,j) = B(c,j) [broadcast]<br>
A(c,j) = B(i,j) [gather]<br>
A(i,j) = B(j,i) [gather]<br>
[all-to-all,t]
                                                                                                         \lbrack \text{all-to-all,} \text{transpose} \rbrack\begin{array}{lll} \mathrm{A}(\mathrm{i},\mathrm{j})=\mathrm{B}(\mathrm{j},\mathrm{i}) & & \mathrm{[all\text{-}to\text{-}all,} \ \mathrm{A}(f(\mathrm{i}),\mathrm{j})=\mathrm{A}(f(\mathrm{i}),\mathrm{j})+\mathrm{B}(g(\mathrm{i}),\mathrm{j}) & & \mathrm{[in spectro/executor]} \end{array}\mathbf{A} \hat{\mathbf{f}} \ \text{enddo}enddo
```
Irregular codes

- Memory access pattern determined by index array
- Value of index array unknown at compile time

Inspector-executor approac<sup>h</sup>

- Compiler inserts call to *inspector* (possible reuse) • Compiler inserts call to *inspector* (possible reuse)<br>...which examines index array, calculates communication
- 
- dex array, calculates...<br>• Compiler transforms loop into *executor*

...which performs communication & computation based on inspector



## Comparing Communication Optimizations



Experimental evaluation

- Applied communication optimizations by hand
- Applied communication optimizations by hand<br>• iPSC/860 timings for different data sizes,  $\#$  of processors
- iPSC/860 timings for different data sizes,  $\#$  of<br>• Message vectorization (mv) main optimization

Successes

- Standardized data-parallel languages
- Language quickly adopted  $(< 2 \text{ year})$
- Language quickly adopted  $(< 2 \text{ year})$ <br>• Multiple commercial compilers implemented
- Multiple commercial compilers<br>• Extensions proposed for HPF-2

Failures

- Failures<br>• Initial compilers poor • Initial compilers poor<br>• Performance unstable
- 
- Performance unstable<br>• Support for complex applications limited
- Bleeding-edge users preferred message-passing standard (MPI)
- Casual users avoided distributed-memory multiprocessors