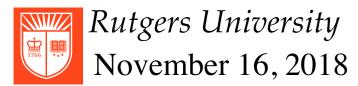
# CS 314 Principles of Programming Languages

Lecture 20: Parallelism and Dependence Analysis

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Prof. Zheng Zhang



#### **Class Information**

- Homework 7 is released.
- Project 2 deadline will be extended to 11/25 Sunday.

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## **Review: Dependence Test**

Given

```
\begin{array}{c} \text{do } i_1 = L_1, U_1 \\ \\ \dots \\ \text{do } i_n = L_n, U_n \\ \\ \text{S1 : } \mathbf{A[f_1(i_1, ..., i_n), ..., f_m(i_1, ..., i_n)]} = \dots \\ \\ \text{S2 : } \dots \mathbf{Assign[ng_1(i_1, Project_1) ExamgHeip, ..., i_n)]} \end{array}
```

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Let  $\alpha$  &  $\beta$  be a vector of n integers within the ranges of the lower and upper bounds of the n loops.

Does  $\exists \alpha, \beta$  in the loop iteration space, s.t.

$$f_k(\alpha) = g_k(\beta)$$
  $\forall k, 1 \le k \le m$ ?

## **Integer Linear Programming (ILP) for Dependence Test**

Does  $\exists \alpha, \beta$  in the loop iteration space, s.t.

$$f_k(\alpha) = g_k(\beta)$$
  $\forall k, 1 \le k \le m$ ?

```
for (i=1; i<=100; i++)
  for (j=1; j \le 100; j++)
     S1: X[i,j] = X[i,j] + Y[i-1,j];
     S2: Y[i,j] = Y[i,j] + X[i, j-1];
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```

#### Consider the two memory references:

$$S1(\alpha)$$
: **X**[**i**<sub>1</sub>, **j**<sub>1</sub>],  $S2(\beta)$ : **X**[**i**<sub>2</sub>, **j**<sub>2</sub>-1]

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Access the same memory location 
$$\begin{vmatrix} i_1 = i_2 & \text{Add W} \\ j_1 = j_2 - 1 \\ 1 <= i_1 <= 100 \\ 1 <= j_1 <= 100 \\ 1 <= i_2 <= 100 \\ 1 <= j_2 <= 100$$

| 
$$i_1 = i_2$$
 | Add WeChat powcoder |  $j_1 = j_2 - 1$  | Does to the second conditions of the second conditions |  $i_1 = i_2 = i_1 < 100$  |  $i_2 = i_2 < 100$  |  $i_3 = i_4 = i_5$  |  $i_4 = i_5 = i_6$  |  $i_5 = i_6 = i_6$  |  $i_6 = i_6$  |  $i_6 = i_6 = i_6$  |  $i_6 = i$ 

Does there exist a solution to this integer linear programming (ILP) problem?

## Integer Linear Programming (ILP) for Dependence Test

If we use the matrix vector notation  $\langle F_1, f_1, B_1, b_1 \rangle$  and  $\langle F_2, f_2, B_2, b_2 \rangle$  for two references at two iterations  $\alpha$ :  $(i_1, j_1)$  and  $\beta$ :  $(i_2, j_2)$ 

$$i_1 = i_2$$
 $j_1 = j_2 - 1$ 
 $1 <= i_1 <= 100$ 
 $1 <= j_1 <= 100$  Ass
 $1 <= i_2 <= 100$ 
 $1 <= j_2 <= 100$ 

Memory reference  $X[i_1, j_1]$ 

$$\mathbf{F_1} = \left[ \begin{array}{cc} 1 & 0 \\ 0 & 1 \end{array} \right] \qquad \mathbf{f_1} = \left[ \begin{array}{c} 0 \\ 0 \end{array} \right]$$

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https://powcoder.com 
$$\begin{bmatrix} \mathbf{i}_1 \\ \mathbf{j}_1 \end{bmatrix} + \begin{bmatrix} 0 \\ 0 \end{bmatrix} = \begin{bmatrix} \mathbf{i}_1 \\ \mathbf{j}_1 \end{bmatrix}$$

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Memory reference V

Memory reference X[i2, j2-1]

$$\mathbf{F}_{1} \begin{bmatrix} \mathbf{i}_{1} \\ \mathbf{j}_{1} \end{bmatrix} + \mathbf{f}_{1} = \mathbf{F}_{2} \begin{bmatrix} \mathbf{i}_{2} \\ \mathbf{j}_{2} \end{bmatrix} + \mathbf{f}_{2} \qquad \mathbf{F}_{2} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \quad \mathbf{f}_{2} = \begin{bmatrix} 0 \\ -1 \end{bmatrix}$$

$$\begin{bmatrix} \mathbf{i}_{1} \\ \mathbf{j}_{1} \end{bmatrix} = \begin{bmatrix} \mathbf{i}_{2} \\ \mathbf{j}_{2} - 1 \end{bmatrix} \qquad \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} \mathbf{i}_{2} \\ \mathbf{j}_{2} \end{bmatrix} + \begin{bmatrix} 0 \\ -1 \end{bmatrix} = \begin{bmatrix} \mathbf{i}_{1} \\ \mathbf{j}_{2} - 1 \end{bmatrix}$$

## Integer Linear Programming (ILP) for Dependence Test

If we use the matrix vector notation  $\langle F_1, f_1, B_1, b_1 \rangle$  and  $\langle F_2, f_2, B_2, b_2 \rangle$  for two references at two iterations  $\alpha$ :  $(i_1, j_1)$  and  $\beta$ :  $(i_2, j_2)$ 

 $i_1 = i_2$   $j_1 = j_2 - 1$   $1 <= i_1 <= 100$   $1 <= j_1 <= 100$  Ass  $1 <= i_2 <= 100$   $1 <= j_2 <= 100$ 

Loop bounds for  $(i_1, j_1)$ 

$$B_{1} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \\ -1 & 0 \\ Help_{1} \end{bmatrix} \quad b_{1} = \begin{bmatrix} -1 \\ -1 \\ 100 \\ 100 \end{bmatrix}$$
Assignment Project Exam Help<sub>1</sub>

$$B_1 \begin{bmatrix} \mathbf{i}_1 \\ \mathbf{j}_1 \end{bmatrix} + b_1 >= 0$$

$$B_2 \begin{bmatrix} \mathbf{i}_2 \\ \mathbf{i}_2 \end{bmatrix} + b_2 >= 0$$

Loop bounds for  $(i_2, j_2)$ 

$$B_2 = \begin{bmatrix} 1 & 0 \\ 0 & 1 \\ -1 & 0 \\ 0 & -1 \end{bmatrix} \quad b_2 = \begin{bmatrix} -1 \\ -1 \\ 100 \\ 100 \end{bmatrix}$$

## **Putting Everything Together**

If we use the matrix vector notation  $\langle F_1, f_1, B_1, b_1 \rangle$  and  $\langle F_2, f_2, B_2, b_2 \rangle$  for two references at two iterations  $\alpha$ :  $(i_1, j_1)$  and  $\beta$ :  $(i_2, j_2)$ 

$$\begin{aligned} & i_1 = i_2 \\ & j_1 = j_2 - 1 \\ & 1 <= i_1 <= 100 \\ & 1 <= j_1 <= 100 \\ & 1 <= i_2 <= 100 \\ & 1 <= j_2 <= 100 \end{aligned} \end{aligned}$$
 Assignment Project  $\begin{bmatrix} i_1 \\ j_1 \end{bmatrix} + f_1 = F_2 \begin{bmatrix} i_2 \\ j_2 \end{bmatrix} + f_2$  https://powcoder.com
$$\begin{aligned} & B_2 \\ & Add \ WeChat \ polygoder \end{aligned}$$
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$$\mathbf{F_1} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \qquad \mathbf{f_1} = \begin{bmatrix} 0 \\ 0 \end{bmatrix} \qquad \mathbf{F_2} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \qquad \mathbf{f_2} = \begin{bmatrix} 0 \\ -1 \end{bmatrix}$$

B<sub>1</sub>, b<sub>1</sub>, B<sub>2</sub>, b<sub>2</sub> see previous slides

## **Review: Parallelizing Affine Loops**

#### Three spaces

- Iteration space
  - The set of dynamic execution instances
    For instance, the set of value vectors taken by loop indices
  - A *k*-dimensional space for a *k*-level loop nest
- Data space

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- The set of array elements accessed
- An *n*-dimensional space for an *n*-dimensional array
- Processor space

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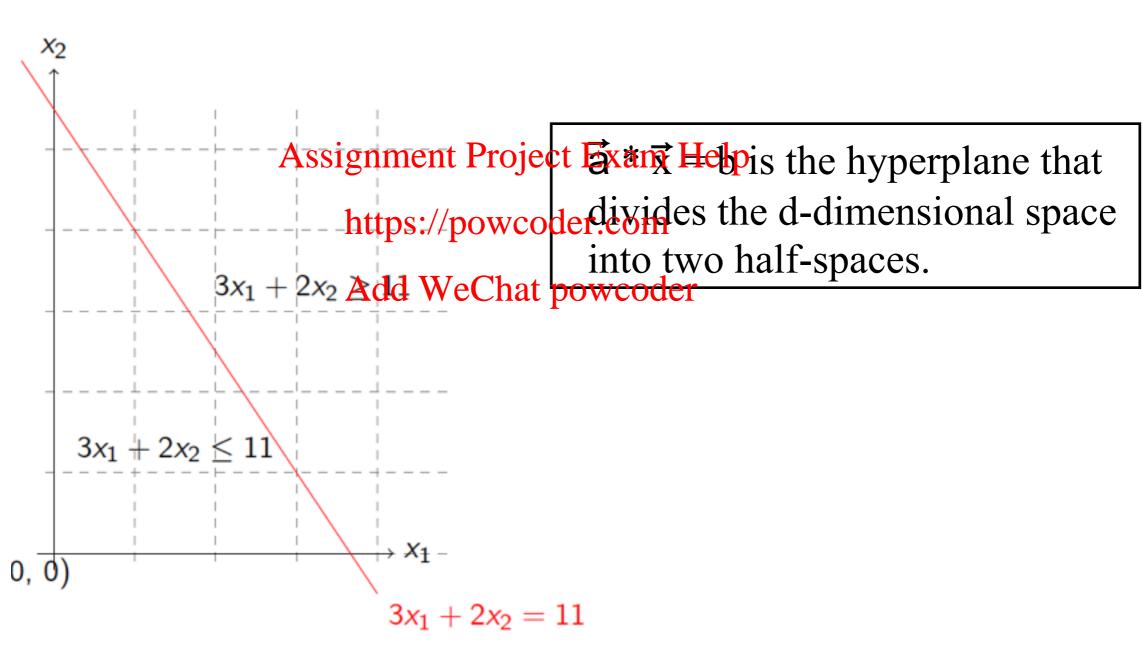
- The set of processors in the system
- In analysis, we may pretend there are unbounded # of virtual processors

#### **Affine Half Space**

#### **Definition**

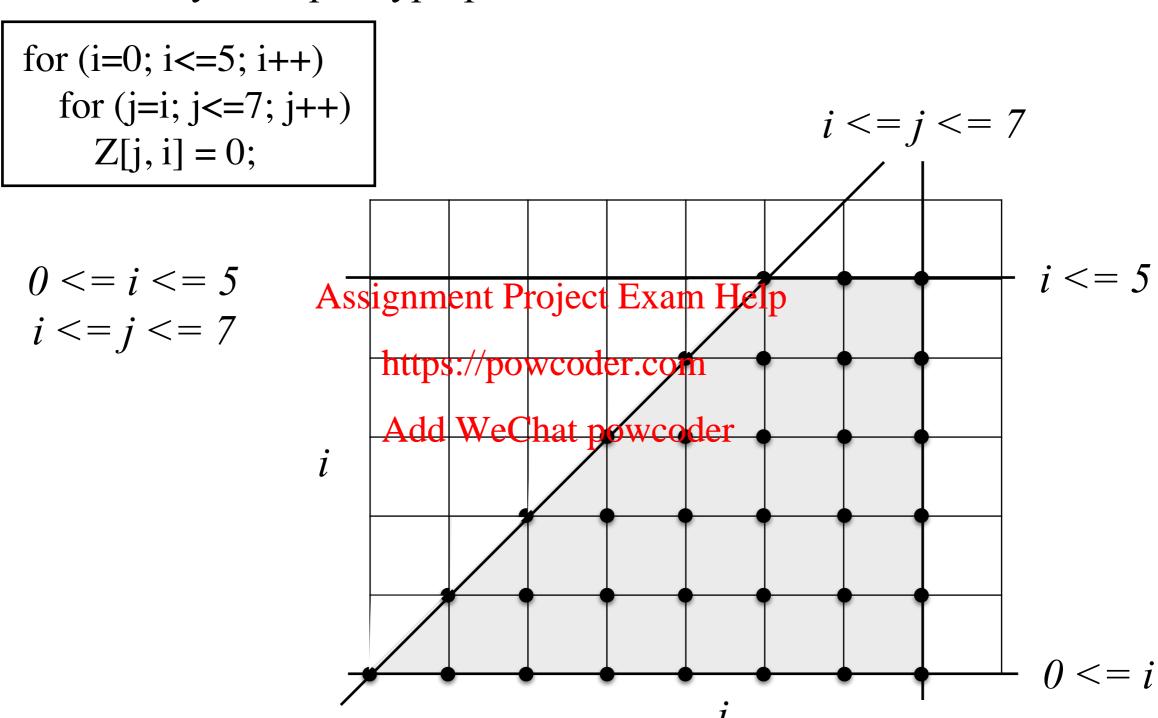
An affine half-space of Z<sup>d</sup> is defined as the set of points

$$\{\vec{x} \in Z^d \mid \vec{a} * \vec{x} \leq b\}$$



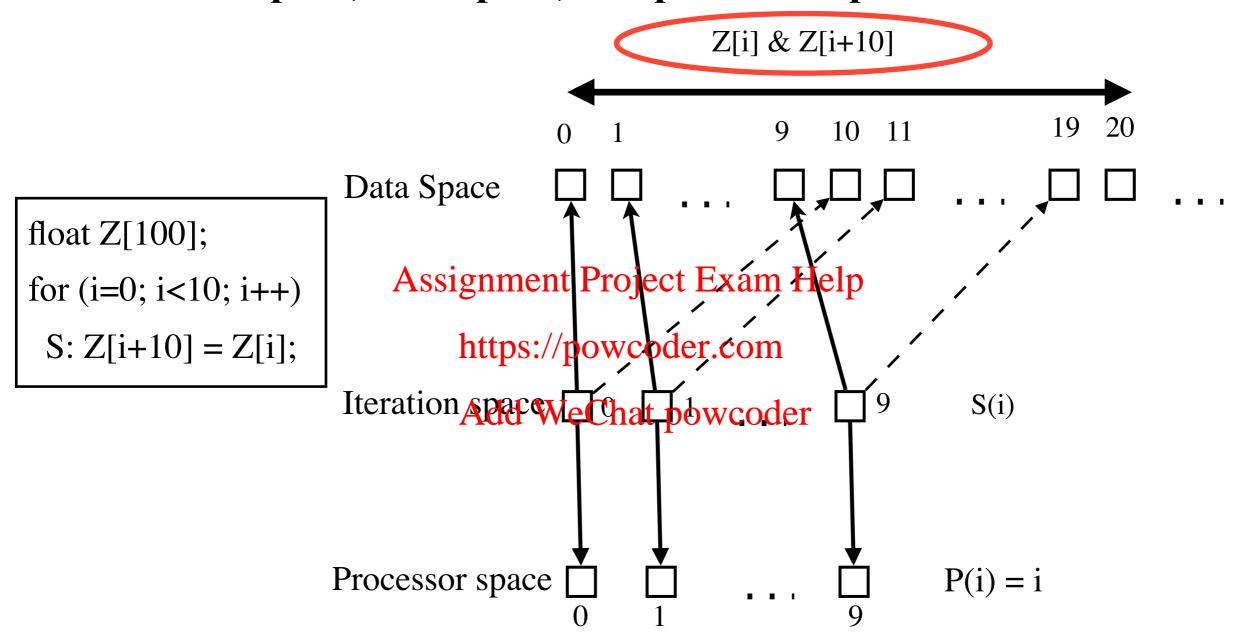
## **Iteration Space**

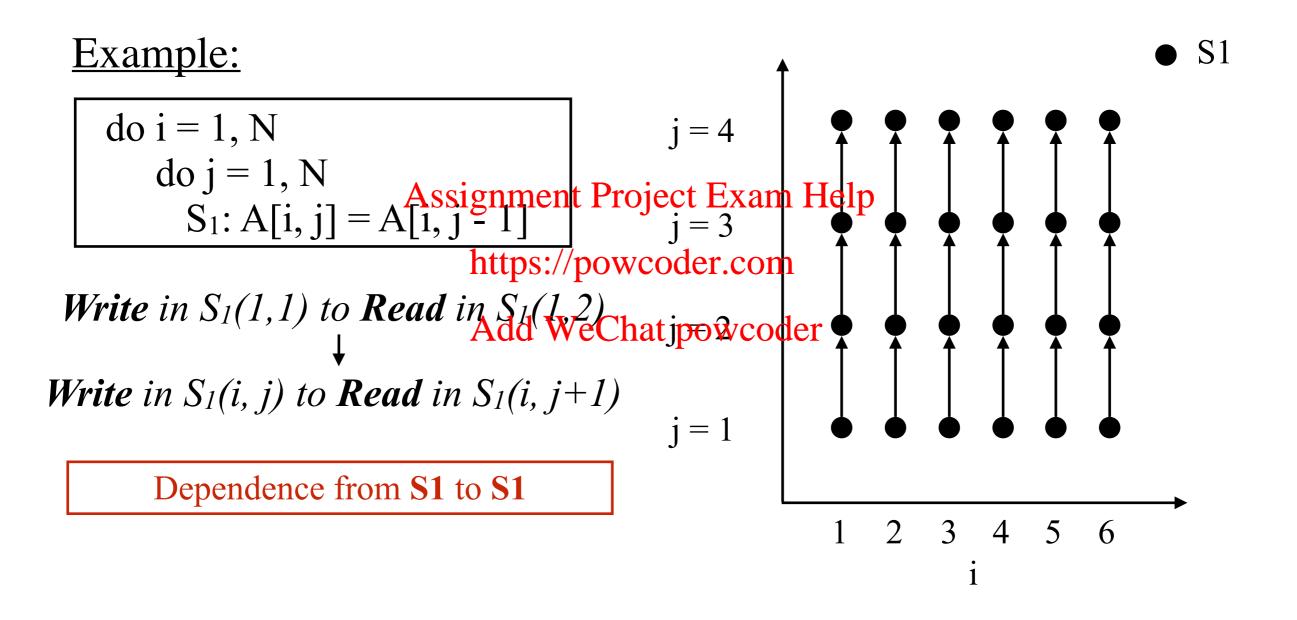
• Bounded by multiple hyperplanes

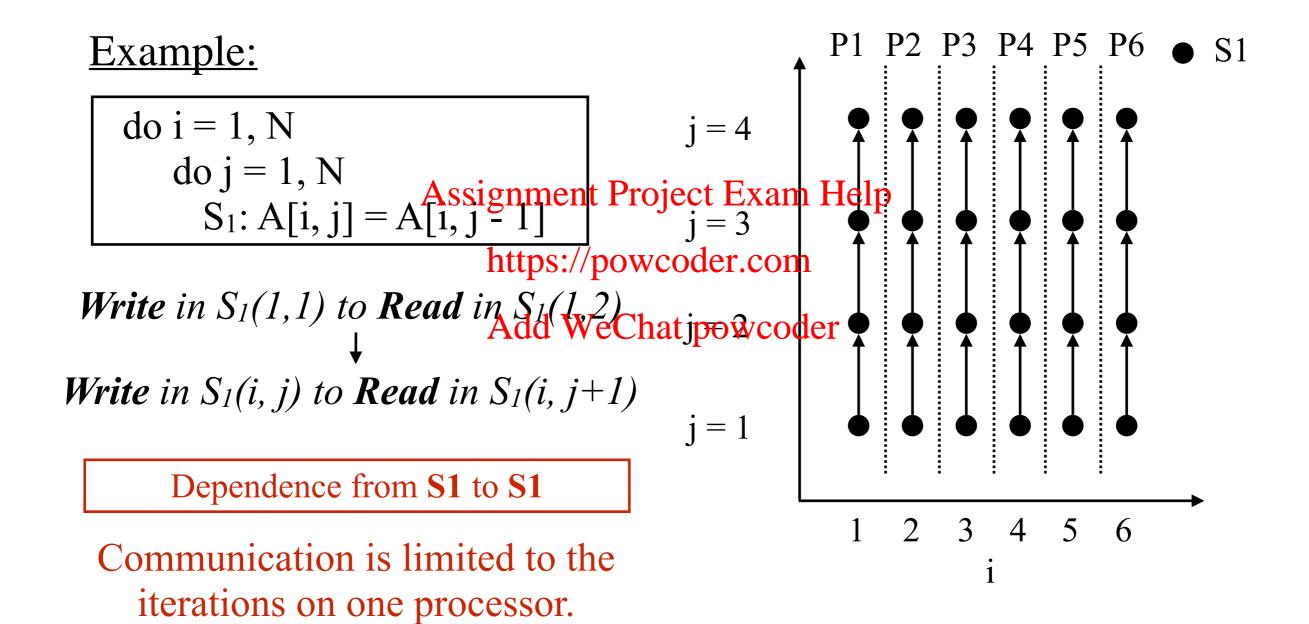


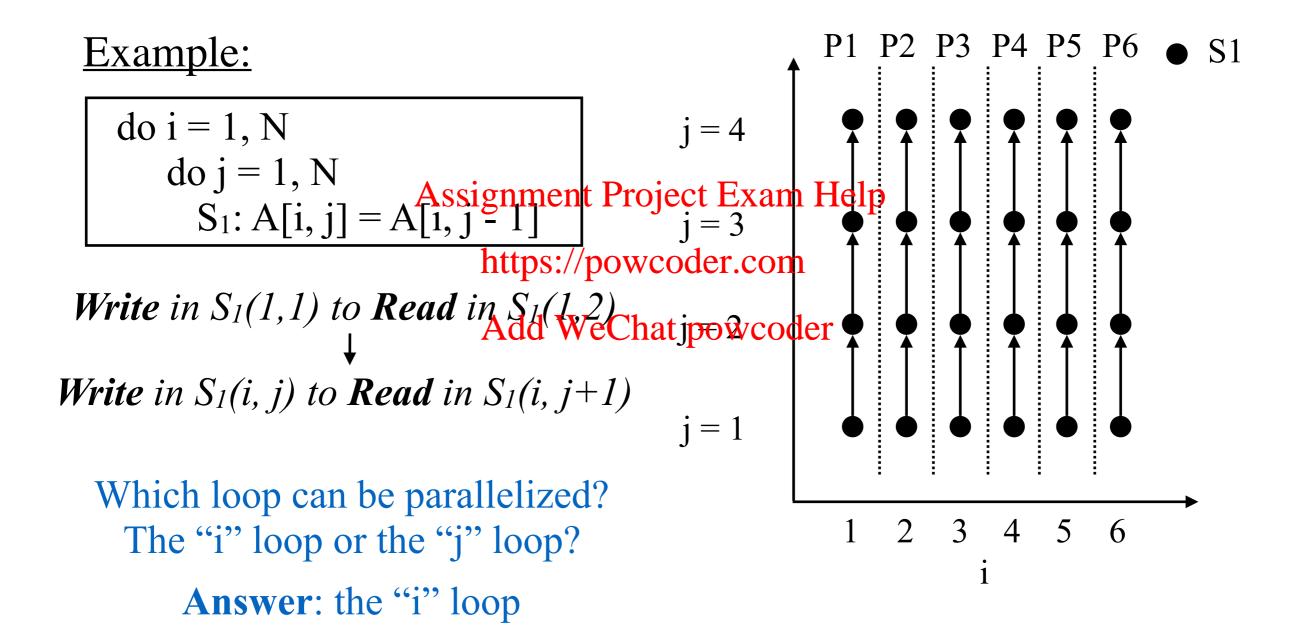
#### **Three Spaces**

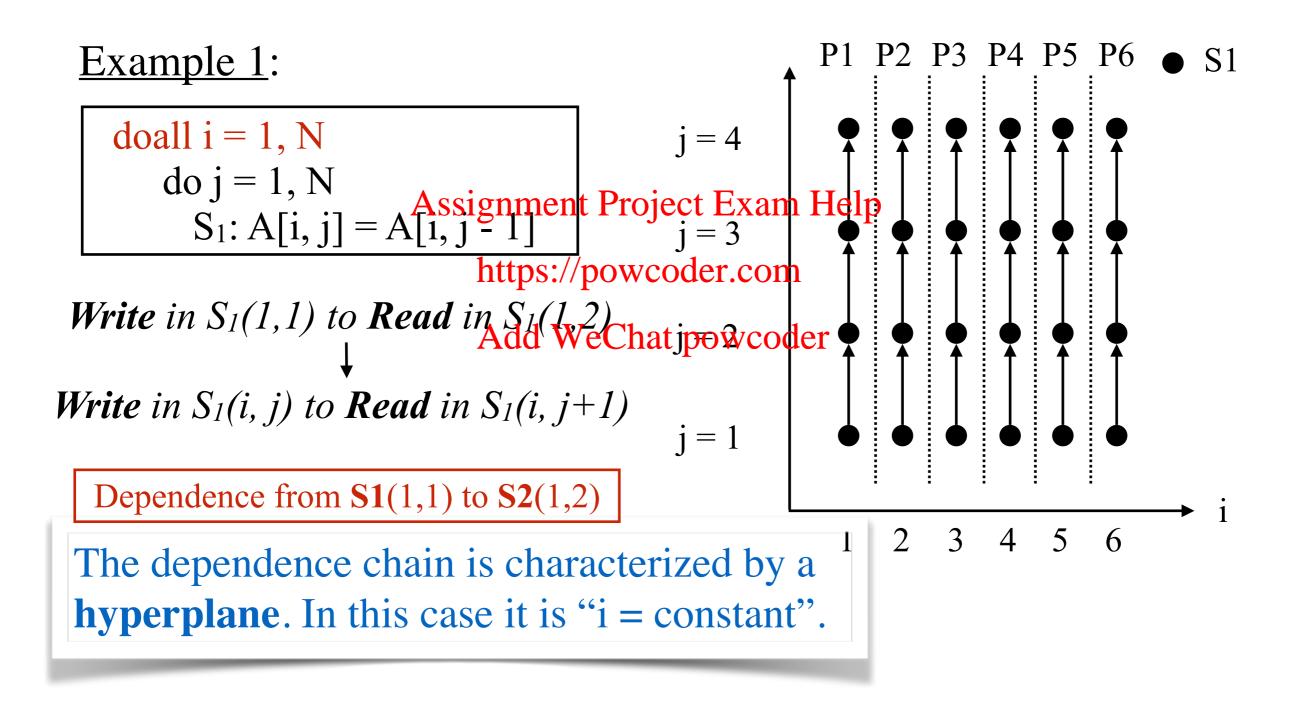
• Iteration space, data space, and processor space



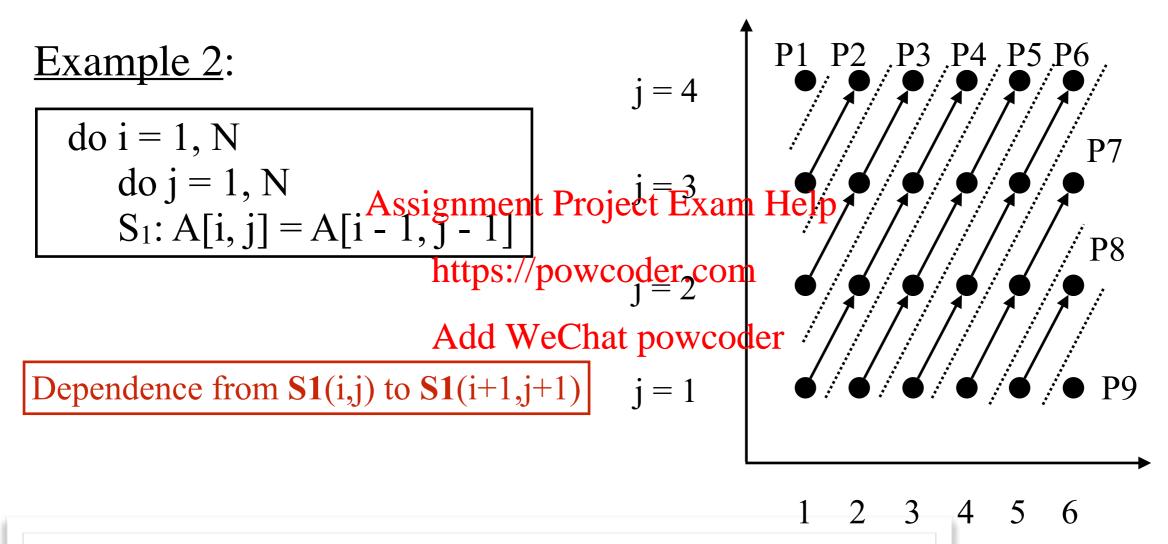








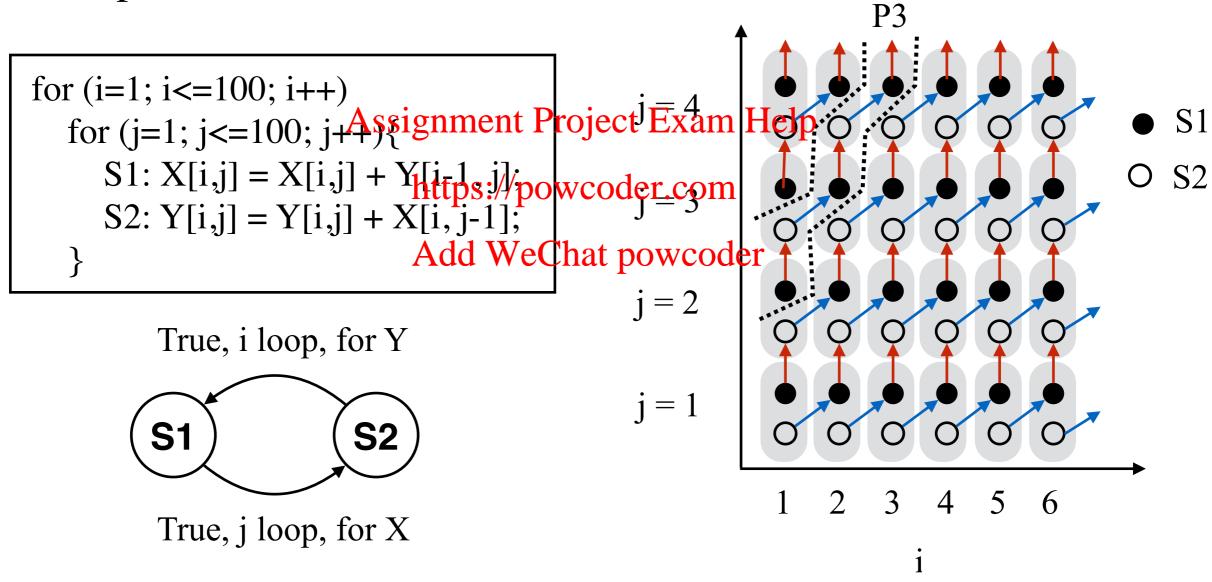
Parallelize an application without allowing any communication or synchronization among (logical) processors.



The dependence chain is characterized by a **hyperplane**. In this case it is "j - i + constant = 0".

Parallelize an application without allowing any communication or synchronization among (logical) processors.

## Example 3:



Dependence from S1(1,1) to S2(1,2)

Dependence from S2(1,1) to S1(2,1)

## Dependence and Parallelization

- Dependence chain in affine loops modeled as a hyperplane.
- Iterations along the same hyperplane must execute sequentially.
- Iterations on different hyperplanes can execute in parallel.

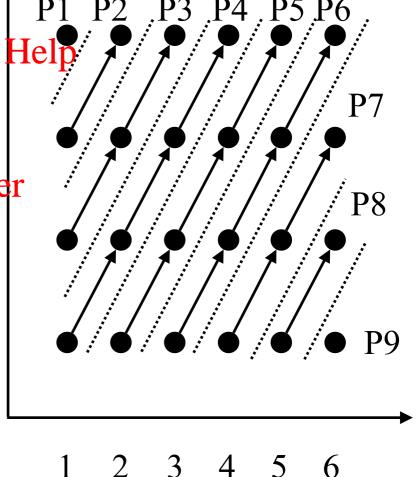


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j = 2

Dependence from S1(i,j) to S1(i+1,j+1) j=1

The hyperplane is  $\mathbf{j} - \mathbf{i} + \mathbf{constant} = \mathbf{0}$ .



## **Processing Space: Affine Partition Schedule**

• Map an iteration to a processor using < C, d >

 $\mathbf{C}$  is a *n* by *m* matrix

- m = d (the loop level)
- n is the dimension of the processor grid

d is a n-element constant vector

 $\vec{p} = C \vec{x} + \vec{d}$ , where  $\vec{e}$   $\vec{g}$  is ean literation where  $\vec{e}$   $\vec{g}$  is ean literation where  $\vec{e}$   $\vec{g}$  is each  $\vec{e}$   $\vec{e}$ 

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## **Processing Space: Affine Partition Schedule**

• Map an iteration to a processor using < C, d >  $\vec{p} =$  C  $\vec{x} + \vec{d}$ , where  $\vec{x}$  is an iteration vector

Example

for (i=1; i<=N; i++) 
$$C = [1]$$
,  $d = [0]$   
S: Y[i] = Z[i]; Assignment Project Exam Help 0

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Map iteration i to Processor i

- Two memory references as  $\langle F_1, f_1, B_1, b_1 \rangle$  and  $\langle F_2, f_2, B_2, b_2 \rangle$  such that  $\langle F_2, f_2, B_2, b_2 \rangle$  at iteration  $\alpha$ :  $(i_1, j_1)$  depends on  $\langle F_1, f_1, B_1, b_1 \rangle$  at iteration  $\beta$ :  $(i_2, j_2)$ 
  - $\mathbf{F_1}$  is a matrix and  $f_1$  is a vector. The affine memory access index is  $\mathbf{F_1*} \alpha + f_1$ .
  - $\mathbf{B}_1$  is a matrix and  $\mathbf{b}_1$  is a vector. Assignment Project Exam Help The affine loop bounds can be expressed as  $\mathbf{B}_1 * \alpha + \mathbf{b}_1 >= 0$
- Let <C<sub>1</sub>,  $d_1>$  and <C<sub>2</sub>,  $d_2>$  represent the respective processor schedule, to have synchronization precederallelism,

$$C_1 * \alpha + d_1 = C_2 * \beta + d_2$$

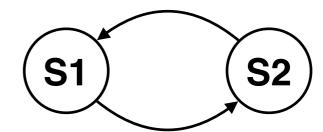
These two memory references must execute on the same processor (sequentially).

• Two memory references as  $\langle F_1, f_1, B_1, b_1 \rangle$  and  $\langle F_2, f_2, B_2, b_2 \rangle$  such that  $\langle F_2, f_2, B_2, b_2 \rangle$  at iteration  $(i_1, j_1)$  depends on  $\langle F_1, f_1, B_1, b_1 \rangle$  at iteration  $(i_2, j_2)$ 

• We want to find processor schedule <C<sub>1</sub>,  $d_I>$  and <C<sub>2</sub>,  $d_2>$  = 0

$$[C_{11} C_{12}] \begin{bmatrix} i_1 \\ j_1 \end{bmatrix} + [d_1] = [C_{21} C_{22}] \begin{bmatrix} i_2 \\ j_2 \end{bmatrix} + [d_2]$$

True, i loop, for Y



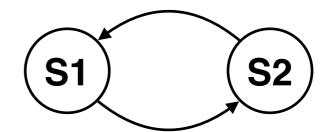
True, j loop, for X



$$[C_{11} - C_{21}, C_{12} - C_{22}] \begin{bmatrix} i_1 \\ j_1 \end{bmatrix} + [d_1 - d_2 - C_{22}] = 0$$

#### S1 to S2 dependence

True, i loop, for Y



True, j loop, for X



$$[C_{11} - C_{21}, C_{12} - C_{22}] \begin{bmatrix} i_3 \\ j_3 \end{bmatrix} + [d_1 - d_2 + C_{21}] = 0$$

#### S2 to S1 dependence

```
for (i=1; i<=100; i++)

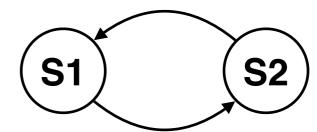
for (j=1; j<=100; j++){

    S1: X[i,j] = X[i,j] + Y[i-1, j];

    S2: Y[i,j] = Y[i,j] + X[i, j-1];

}
```

True, i loop, for Y



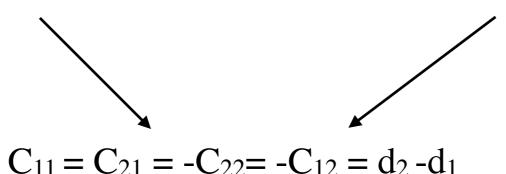
True, j loop, for X

## S1 to S2 dependence Project Exans 24 to S1 dependence

$$C_{11} - C_{21} = 0$$
 https://powcoder.com  $C_{11} - C_{21} = 0$ 

$$C_{12} - C_{22} = 0$$
 Add WeChat powcoder  $C_{12} - C_{22} = 0$ 

$$d_1 - d_2 - C_{22} = 0$$
  $d_1 - d_2 + C_{21} = 0$ 



#### Example:

O S2 
$$j=4$$

$$j = 3$$

p:

3

p:

$$C_{11} = C_{21} = -C_{22} = -C_{12} = \frac{\text{https://powcoder.com}}{\text{d}_2 - \text{d}_1}$$

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#### **One Potential Solution:**

Affine schedule for S1, p(S1):  $[C_{11} C_{12}] = [1 -1], d_1 = -1$ 

i.e. (i, j) iteration of S1 to processor p = i - j - 1;

Affine schedule for S2, p(S2):  $[C_{21} C_{22}] = [1 - 1], d_2 = 0$ 

i.e. (i, j) iteration of S2 to processor p = i - j.

#### **Code Generation**

```
for (i=1; i<=6; i++)
  for (j=1; j <=4; j++){
     X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */
     Y[i,j] = Y[i,j] + X[i,j-1]; /* S2 */
  }
```

```
S1(i, j): processor p = i-j-1;
S2(i, j): processor p = i-j.
```

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```
forall (p=-4; p<=5; p++)
                            Add WeChat powcoderStep 1: find processor ID ranges
  for (i=1; i<=6; i++)
     for (j=1; j <=4; j++){
       if (p==i-j-1)
          X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */
       if (p==i-j)
          Y[i,j] = Y[i,j] + X[i,j-1]; /* S2 */
     }
```

- S1:  $-4 \le p \le 4$ 
  - S2:  $-3 \le p \le 5$
  - Union:  $-4 \le p \le 5$
- Step 2: generate code

#### **Naive Code Generation**

```
forall (p=-4; p<=5; p++)

for (i=1; i<=6; i++)

for (j=1; j<=4; j++){

    if (p== i-j-1)

        X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */

        if (p== i-j)

        Y[i,j] = Y[i,j] + Project Exam Help

    }

    https://powcoder.com
```

What are the issues with this code?

- Idle iterations
- Lots of tests in loop body

#### **Remove Idle Iterations**

## Some iterations have idle operations

For example, when p=-4, only 1 of the 24 iterations has useful operations, i=1, j=4.

```
for all (p=-4; p<=5; p++)

for (i=1; i<=6; i=0) for (j=1; j<=4; j=4; j=s+/) fow coder.com

if (p== i-j-1) dd WeChat powcoder

X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */

if (p== i-j)

Y[i,j] = Y[i,j] + X[i,j-1]; /* S2 */

}
```

$$-4 \le p \le 5$$
  
 $1 \le i \le 6$   
 $1 \le j \le 4$   
 $i-p-1=j$ 

# Fourier-Motzkin Elimination Assignment Project Exam Help

S1

j: i-p-1<= j <= i-p-1	Add WeChat powcoder.	
j: i-p-1<= j <= i-p-1	Add WeChat powcoder	
1<= j <= 4	i: p+2<= i <= p+5	Eliminate j
1<= i <= 6		
p: -4<= p<= 4	Eliminate i	
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= j <= i-p		
1<= i <= 6		
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= i <= 6		
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= i <= 0		
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= j <= i-p		
1<= i <= 0		
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= j <= i-p		
1<= i <= 0		
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= j <= i-p		
1<= i <= 0		
p: -3<= p <= 5		
j: i-p-1<= j <= i-p		
1<= j <= i-p		
1<= i <= 0		
p: -3<= p <= 5		
i = p <= i-p		
i = p <= i-p		
i = p <= i-p <= i-p		
i = p <= i-p <= i-p		
i = p <= i-p <= i-p <= i-p		
i = p <= i-p <= i-p <= i-p <= i-p		
i = p <= i-p <=		

$$j = i - p - 1$$
 $1 \le i - p - 1 \le 4$ 
 $p + 1 + 1 \le i \le 4 + p + 1$ 
 $p + 2 \le i \le p + 5$ 

**S**1

j: 
$$i-p-1 \le j \le i-p-1$$
  
 $1 \le j \le 4$ 

i: 
$$p+2 \le i \le p+5$$
  
 $1 \le i \le 6$ 

**S**2

$$1 <= j <= 4$$

i: 
$$p+1 \le i \le 4+p$$

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## Union result hat powcoder

```
forall (p=-4; p<=5; p++)

for (i=1; i<=6; i++)

for (j=1; j<=4; j++){

    if (p== i-j-1)

        X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */

    if (p== i-j)

        Y[i,j] = Y[i,j] then by the property of the
```

```
Union result:
```

```
j: i-p-1<=j <= i-p
1<=j <=4
```



```
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for (p=-4; p<=5; p++)

for (i=max(1,p+1); i<=min(6,5+p); i++)

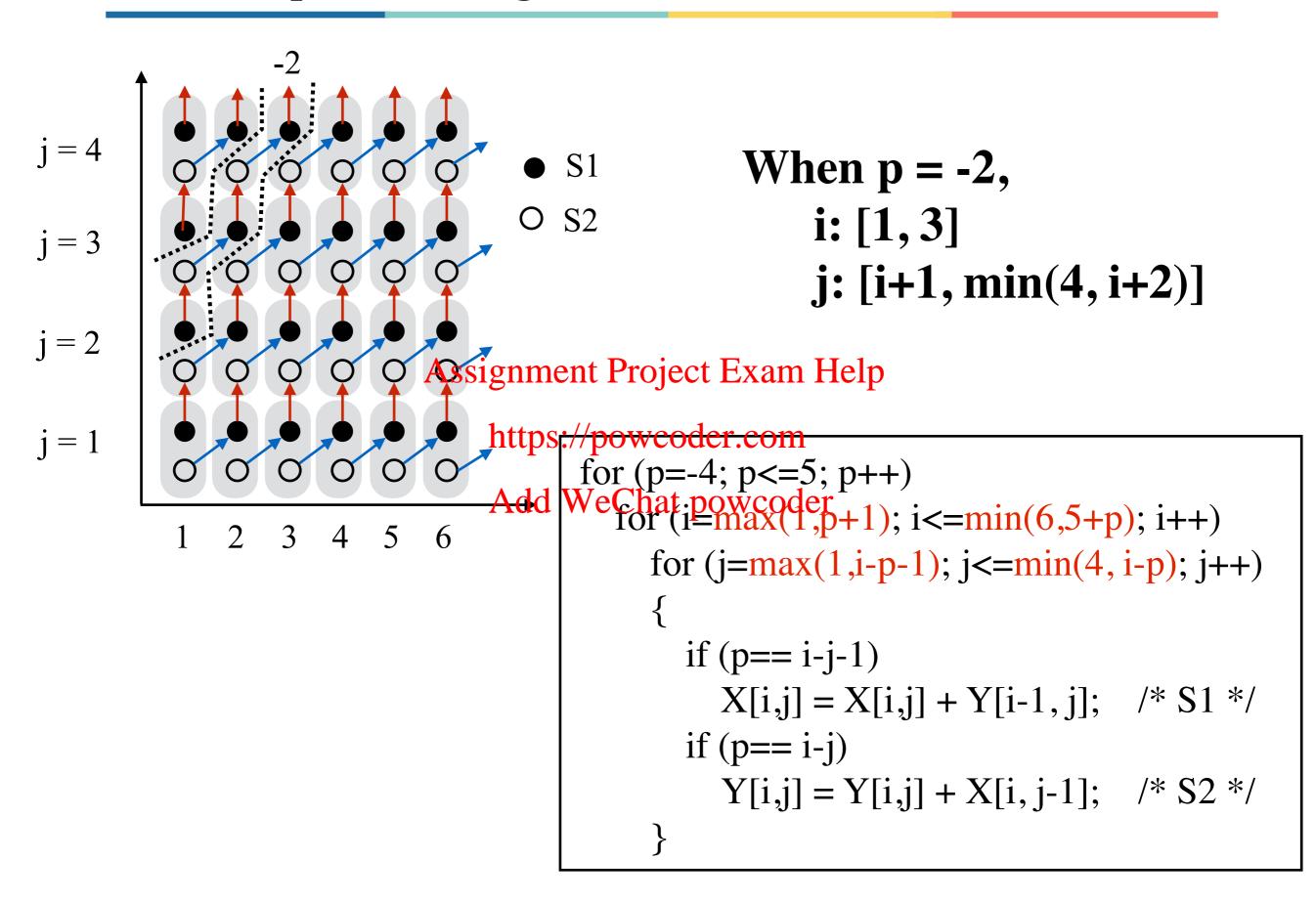
for (j=max(1,i-p-1); j<=min(4,i-p); j++){

    (if (p== i-j-1)

        X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */

    (if (p== i-j)

        Y[i,j] = Y[i,j] + X[i,j-1]; /* S2 */
}
```



#### **Remove Tests**

```
for (p=-4; p<=5; p++)

for (i=max(1,p+1); i<=min(6,5+p); i++)

for (j=max(1,i-p-1); j<=min(4,i-p); j++){

    if (p== i-j-1)

        X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */

    if (p== i-j)

        Y[i,j] = Y[A,j]ignX[i,j]Prhject*ES2n*/Help

}

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```

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```
for (p=-4; p<=5; p+\neq)

for (i=max(1,p+1); i<=min(6,5+p); i++)

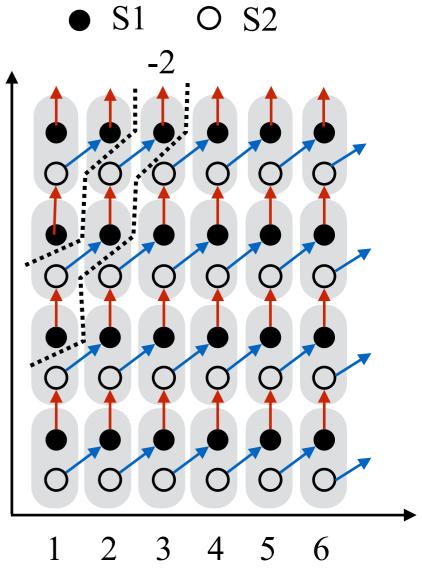
j=i-p-1;

X[i,j] = X[i,j] + Y[i-1,j]; /* S1 */

j=i-p;

Y[i,j] = Y[i,j] + X[i,j-1]; /* S2 */

j=1
```



#### **Next Class**

#### Reading

• ALSU, Chapter 11.1 - 11.7

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