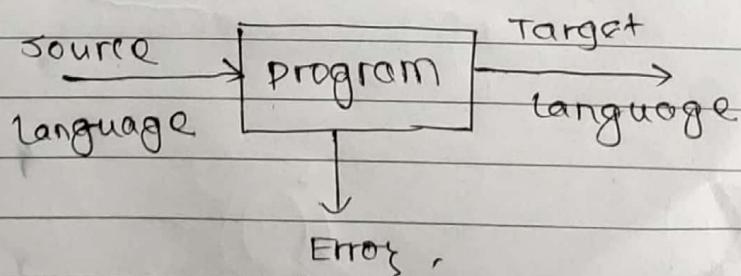
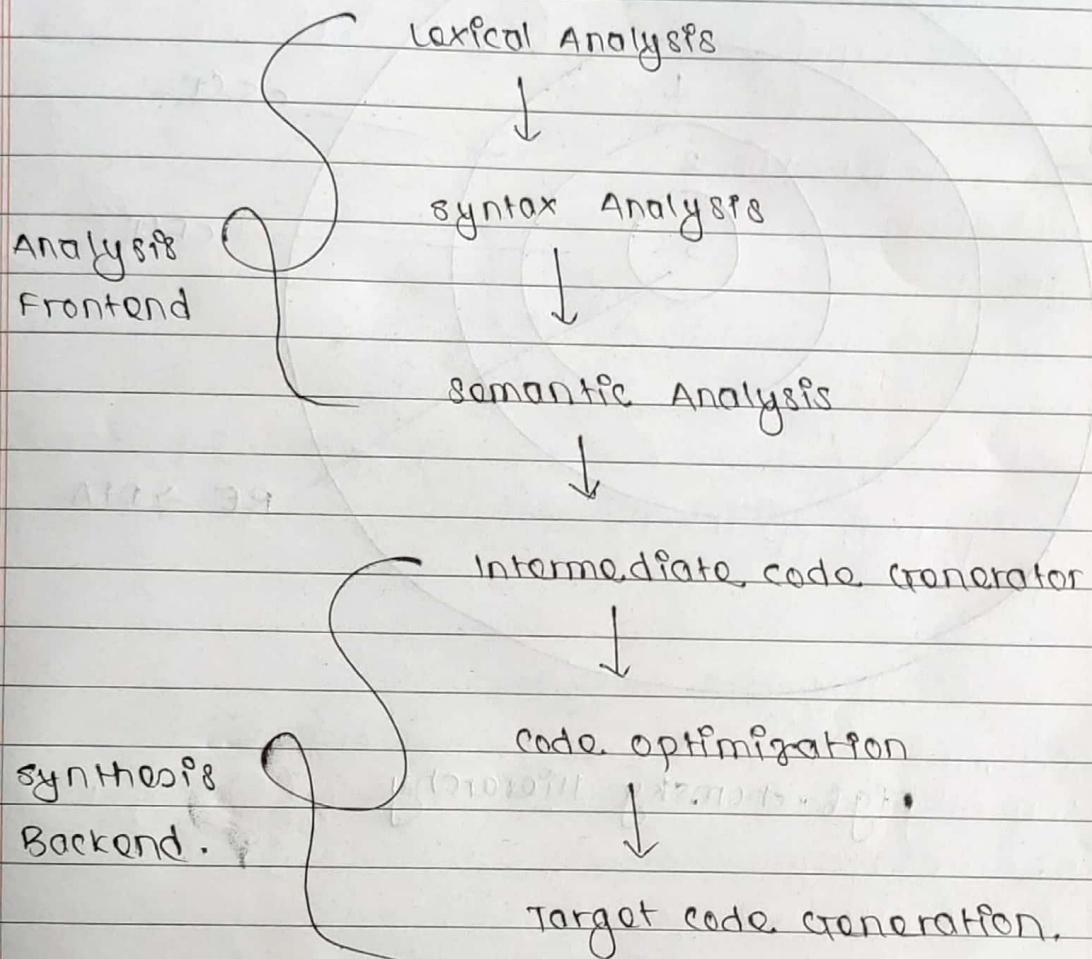


compiler:-



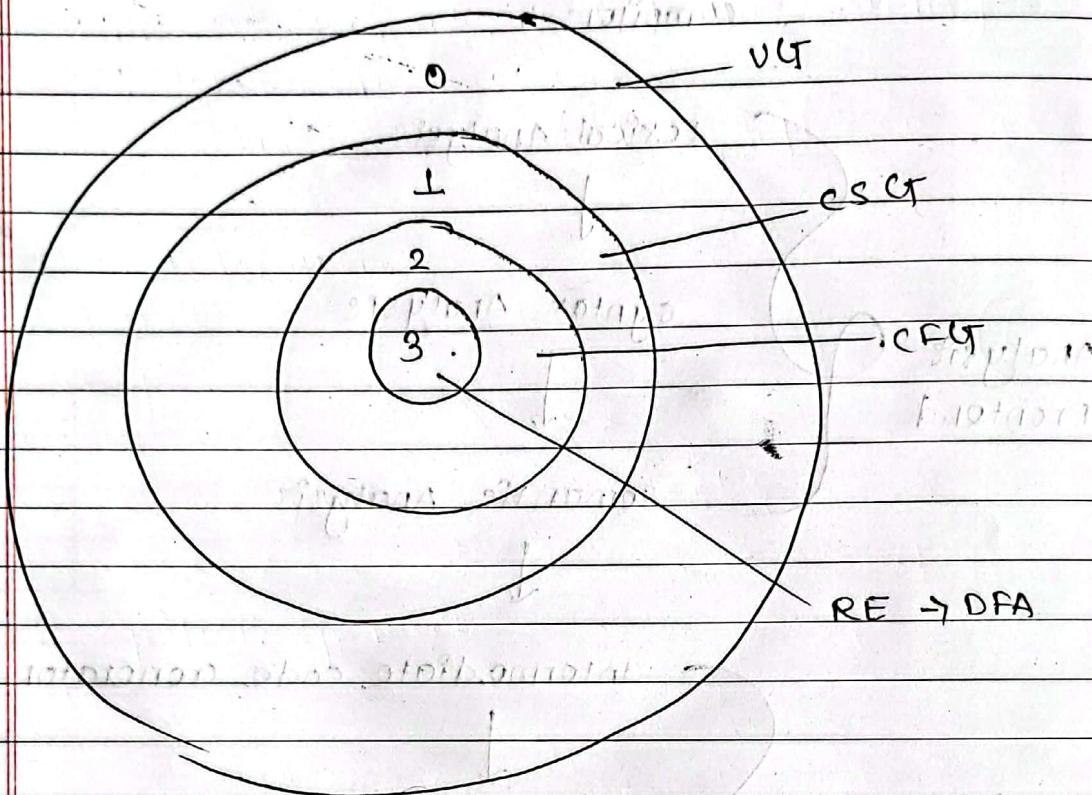
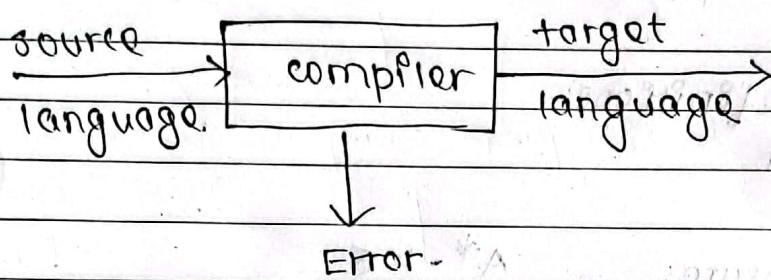


Fig :- Chomsky Hierarchy

0 : VGT  
1 : CS CT  
2 : CFG  
3 : RE  $\rightarrow$  DFA

## Unit-1 Review of compiler structure.

Compiler is a program that takes the source language as input and produces target language as output.



### phases of compiler.

lexical Analysis

Syntax Analysis

semantic Analysis

Intermediate code Generation

code optimization

target code optimization.

#### Lexical Analysis.

Scans the input and tokenizes into a block of stream, token, pattern and lexons.

Token is a individual construct a language.

patterns are the rule to test the validity of a token.  
 Valid tokens are lexemes.  
 Regular expression is used to define the patterns.

some definitions:-

alphabet

string

kleen closure

$$A^* \rightarrow \Sigma$$

positive closure

$$A^+ \rightarrow A^* - \{\epsilon\}$$

recognition of tokens

DFA

NFA

deterministic finite Automata (DFA)

formally it is defined as  $DFA = (\mathcal{Q}, \Sigma, q_0, f, \delta)$ .

where,

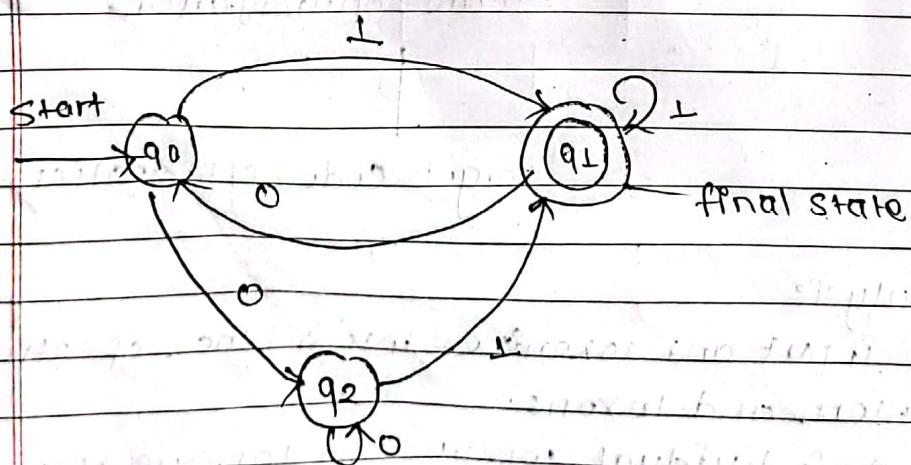
$\mathcal{Q} \rightarrow$  finite set of states

$q_0 \rightarrow$  starting state

$f \rightarrow$  finite set of final states

$\delta \rightarrow$  transition function,  $\delta: \mathcal{Q} \times \Sigma \rightarrow \mathcal{Q}$

$\Sigma \rightarrow$  finite set of input alphabet.



$$Q = \{q_0, q_1, q_2\}$$

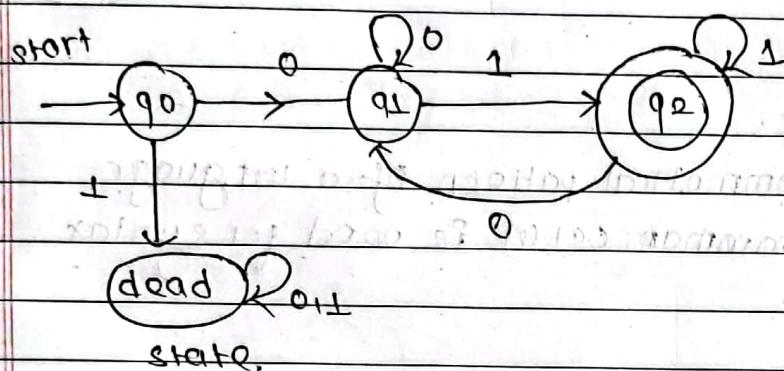
$$q_0 = \{q_0\}$$

$$F = \{q_1\}$$

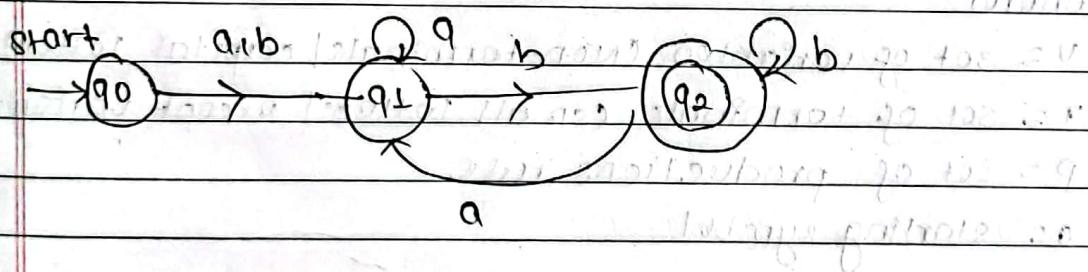
$$S = S(q_0) = q_0$$

$$S(q_0) = q_2$$

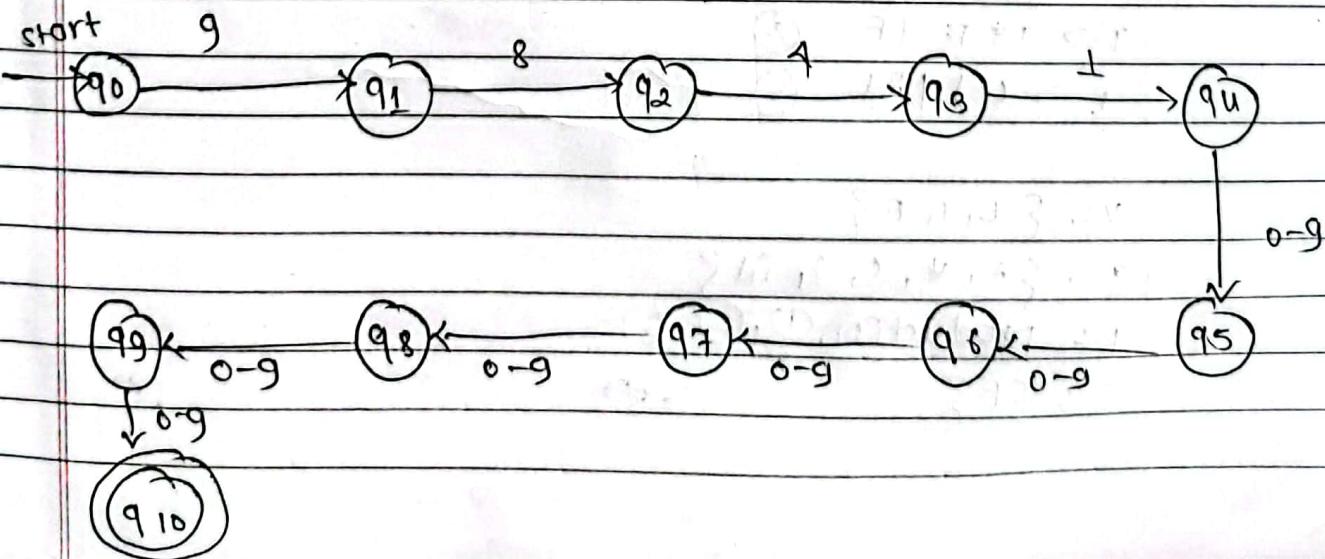
$$0(0+1)^* 1$$

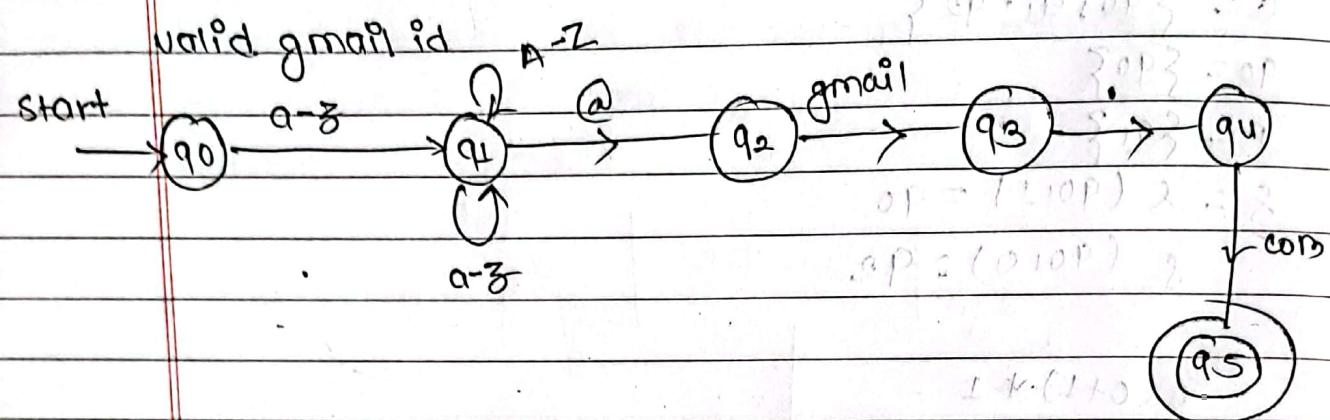


$$(a+b)(a+b)^*b$$



prepaid NTC mobile number





### Syntax Analysis

- \* Define the grammatical pattern of a language.
- \* Context free grammar (CFG) is used for syntax definition.

CFG (Context Free Grammar)

It can be defined by  $G = (V, T, P, S)$

where

$V$  = set of variables (non-terminals) capital letter

$T$  = set of terminals (small letters) except variables

$P$  = set of production rule

$S$  = starting symbol

Example:

$$E \rightarrow E + T \mid T \quad (1)$$

$$T \rightarrow T * F \mid F \quad (2)$$

$$F \rightarrow (E) \mid id \quad (3)$$

$$V = \{ E, T, F \}$$

$$T = \{ +, *, (, ), id \}$$

$$P = \text{production } (1), (2), (3)$$

$$S = \{ E \}$$

## parsing

Derive the string from grammar, to check whether that string is a language or not.

### Types of parsing

1) Top down parser

2) Bottom up parser

} Leftmost derivation  
 } Rightmost derivation.

Let,  $w = \text{id} + \text{id} * \text{id}$

$$E \rightarrow ETT \quad \therefore E \rightarrow ETT$$

$$E \rightarrow T+T \quad \therefore E \rightarrow T$$

$$E \rightarrow F+F \quad E \rightarrow F$$

$$E \rightarrow Pd+T*F \quad E \rightarrow T*F$$

$$E \rightarrow \text{id} + F*F \quad T \rightarrow F$$

$$E \rightarrow \text{id} + \text{id} * \text{id} \quad T \rightarrow \text{id}$$

$$w = Pd * (Pd + Pd)$$

$$E \rightarrow E+T$$

$$E \rightarrow E+F$$

$$E \rightarrow E+(E)$$

$$E \rightarrow E+(T)$$

$$E \rightarrow E+(T*F)$$

$$E \rightarrow E+(C(F*F))$$

$$E \rightarrow T+(Pd * \text{id})$$

$$E \rightarrow F+(Pd * \text{id})$$

$$E \rightarrow \text{id} + (Pd * Pd)$$

$$E \rightarrow E+T$$

$$E \rightarrow E+F$$

~~$$E \rightarrow E+(E) T*F+T$$~~

~~$$E \rightarrow F*(E)+T$$~~

E

$$W = PdA \cdot Cid + PdJ$$

$$E \rightarrow E + T$$

$$E \rightarrow$$

Syntax Directed Translation

Defining the semantic action along with production rules in the grammar.

Production

$$E \rightarrow E + T$$

semantic action

$$E \cdot \text{value} = E \cdot \text{val} || T \cdot \text{val} || +$$

$$E \rightarrow E - T$$

$$E \cdot \text{value} = E \cdot \text{val} || T \cdot \text{val} || -$$

$$E \rightarrow T$$

$$E \cdot \text{val} = T \cdot \text{val}$$

$$T \rightarrow 0$$

$$T \cdot \text{val} \leftarrow "0"$$

$$T \rightarrow 1$$

$$T \cdot \text{val} \leftarrow "1"$$

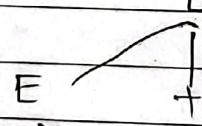
$$T \rightarrow g$$

$$T \cdot \text{val} \leftarrow "g"$$

Example:  $g - 5 + 2$

$E \quad \{ E \cdot \text{val} = 9 - 5 + 2 \}$  infix to postfix conversion

$$E \cdot \text{val} = 9 - 5$$



$$+ \{ T \cdot \text{val} = 2 \}$$

$$T \cdot \text{val} = E \cdot \text{value} = 9$$

$$T \{ T \cdot \text{val} = 5 \}$$

$$T \cdot \text{val} = 5$$

$$T \{ T \cdot \text{val} = 2 \}$$

$$T \cdot \text{val} = 2$$

$$T \{ T \cdot \text{val} = 2 \}$$

$$g$$

## Semantic Analysis

Concerns with the meaning of a language construct.

Example:- type checking

Implicit / explicit type conversion.

Example:-

1.  $A \rightarrow B + C$      $\{ A.type = B.type = C.type \}$

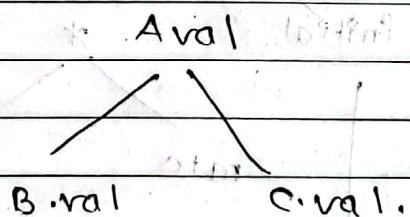
2. If (root & L = A+B) { if root == true & L.type =  
 A.L.type  
 Q18Q C-D)    Q18Q S.type = C.type }

Synthesized and Inherited Attribute.

An attribute which depends upon child is synthesized attribute.

An attribute which depends on siblings or parent is called inherited attribute.

$A \rightarrow B + C$      $A.val = B.val + C.val$



Example of synthesized attribute.

position = initial + rank \* 60



Example:-

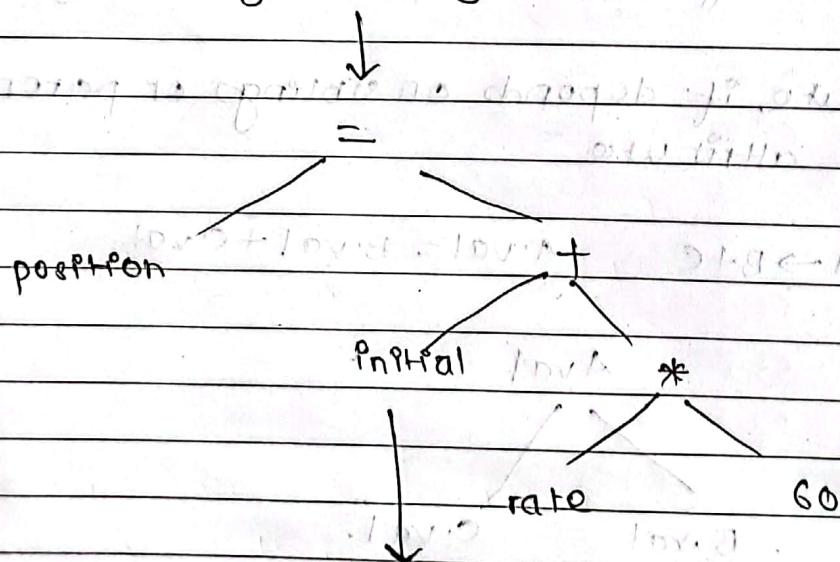
position = initial + rate \* 60

### Lexical Analysis

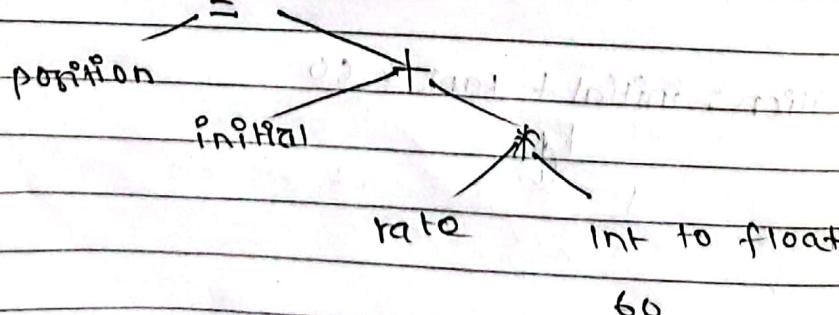
position	initial	+	rate	*	60
id <sub>1</sub>	id <sub>2</sub>	id <sub>3</sub>			integer number

assignment      addition      multiplication  
operator      operator      operator

### Syntax Analysis



### Semantic Analysis



## Intermediate code generation (three address code)

$t_1 = \text{In to read } (60)$

$t_2 = \text{rate} * t_1$

$t_3 = \text{initial}$

$t_4 = t_3 + t_2$

position =  $t_4$

## Code optimization.

$t_1 = \text{In to Real } (60)$

$t_2 = \text{rate} * t_1$

position = initial +  $t_2$

## Target code generation.

LOAD F R1, #600

LOAD F R2, rate

MUL F R1, R2

LOAD F R3, initial

ADD F R1, R3

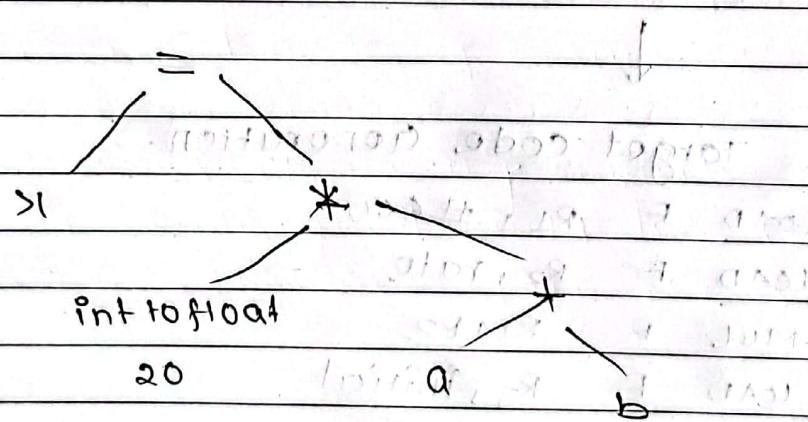
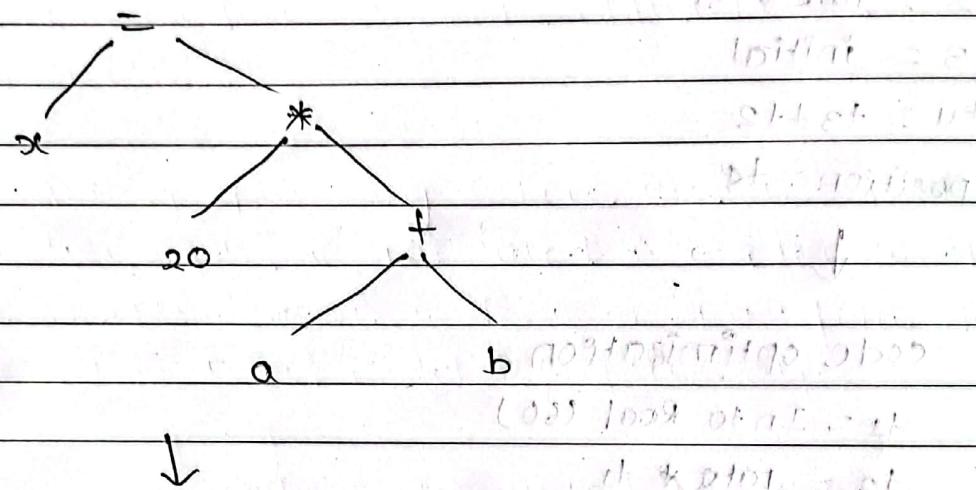
LOAD F position, R1

$$x = 20 * (a+b)$$

ASS. OP

$$x = 20 * (a + b)$$

id<sub>1</sub>      Integer      id<sub>2</sub>      id<sub>3</sub>



Intermediate code generation.

$$t_1 = \text{Int to real } 20$$

$$t_2 = (a+b) \quad a+b$$

$$t_3 = t_1 * t_2$$

$$n = t_3$$

$$t_1 = \text{Int to float}$$

$$t_1 = a+b$$

$$t_2 = a+b$$

$$t_2 = \text{Int to float}$$

$$t_3 = a$$

$$t_3 = a$$

$$t_4 = t_3 + t_1$$

$$a = t_4$$

Importance of pipelining  
using a non-optimizing will usually result in a non-efficient code when compared to more sophisticated compilers.

Example:-

int a, b, c, d;

c = a + b;

d = c + 1;

Fig:-1 C code.

LDW a, R1

LDW b, R2

ADD R1, R2, R3

STW R3, C

LDW C, R3

ADD R3, 1, R4

STW R4, D

Fig:-2 SPARC code (7 cycles)

ADD a, b, c

ADD c, r1, d

Fig:-3 Optimized SPARC code (2 cycles).

The non optimized SPARC code has 7 instructions, 5 of which are memory access instructions.

The optimized code is more efficient and has only 2 instructions.

structure of optimizing (There are two main models)

1. Structure code is translated into a low level code and all optimization is done on that form of code, called low level model of optimization.

2. The source code is translated to medium level intermediate code and the optimization is done, mixed model of optimization.

structure of optimizing compilers.

A compiler designed to produce fast object code. Includes optimizer components

only

any

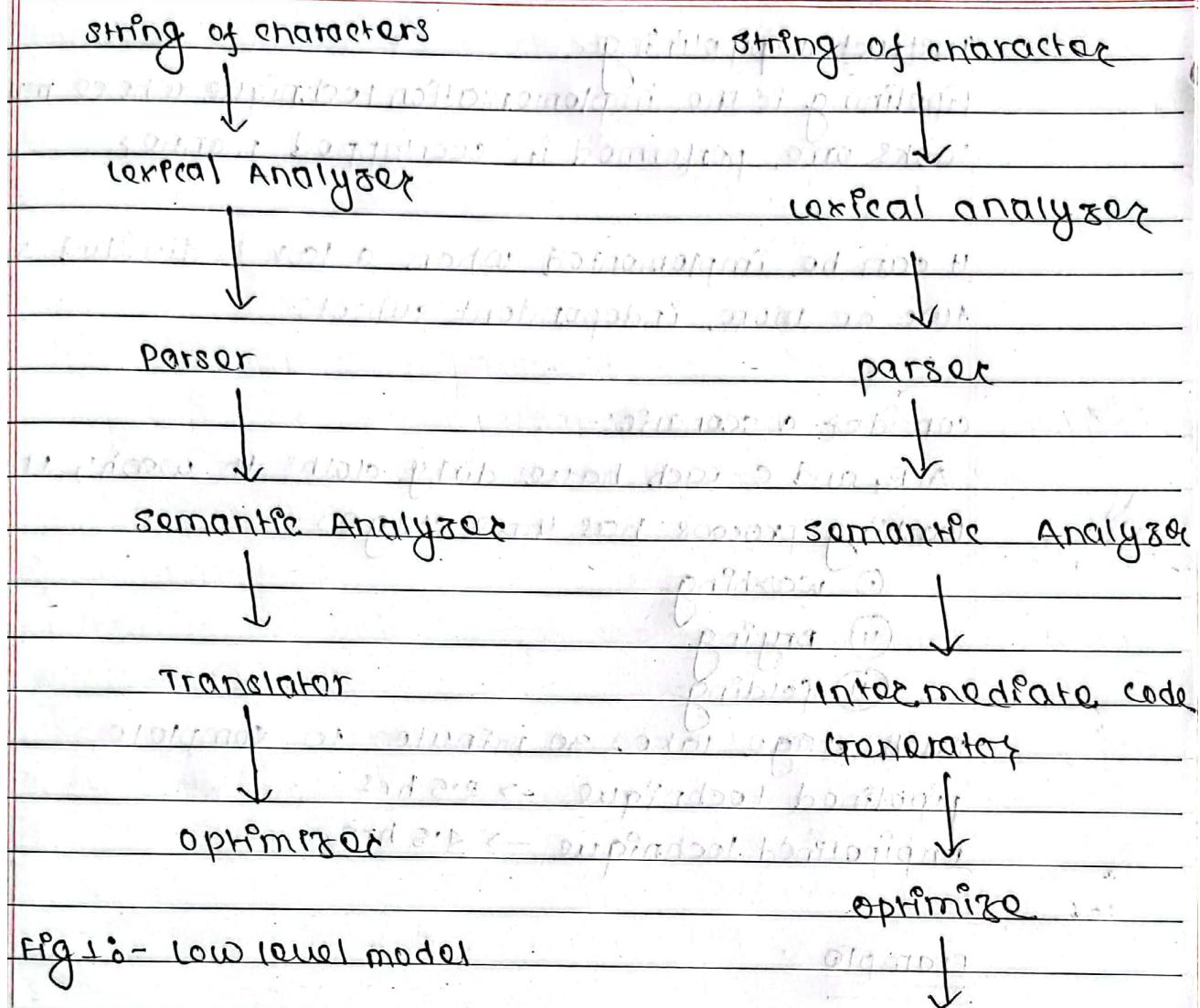


Fig 1:- Low level model

code generator

post optimizer

Fig 2:- Mixed model.

## Instruction pipelining

Pipelining is the implementation technique where multiple tasks are performed in overlapped manner.

It can be implemented when a task is divided into two or more independent subsets.

Consider a scenario:-

A, B, and C each have dirty cloths to wash; the washing process has three stages.

- ① washing
- ② drying
- ③ folding

Each stage takes 30 minutes to complete.

Pipelined technique  $\rightarrow$  2.5 hrs

Unpipelined technique  $\rightarrow$  4.5 hrs

### Example

	Instructions					cycles		
	①	②	③	④	⑤	⑥	⑦	
I <sub>1</sub>		IF	ID	EX	MEM	WB		
I <sub>2</sub>		IF	ID	EX	MEM	WB		
I <sub>3</sub>		IF	ID	EX	MEM	WB		

IF  $\rightarrow$  Instruction fetch

ID  $\rightarrow$  Instruction decode

EX  $\rightarrow$  Execution

MEM  $\rightarrow$  Memory access

WB  $\rightarrow$  Write Back

## Pipeline hazards

Condition or situation which does not allow the pipeline to operate normally.

Reduce the performance

Types of hazards.

- (a) Control Hazard
- (b) Structural Hazard
- (c) Data Hazard

### (a) Control hazard

- All instructions, who changes the program counter leads to control hazard.
- when to make a decision based on the results of one instruction while other are executing.

simulating pre-process of a compiler.

#define PI 3.14

void main()

{

int PI, a,b

float area= PI \* r \* r;

printf ("PI = %f", PI);

}

Fig:- Input file

void main()

{ int PI,a,b;

float area= 3.14 \* r \* r

printf ("PI = %f", 3.14)

}

Fig:- output file.

## Data Hazard

- occurs when the pipeline changes in order of read/write access to operands so that the order differs from the order seen by sequentially executing instructions on the unpipelined machine types :-

1. RAW (Read After Write)

2. WAR (Write After Read)

3. WAW (Write After Write)

(write back the  
data in pipeline)

RAW

I1 :  $R2 = R2 + R3$

I2 :  $R5 = R2 + R4$

phases ① ② ③ ④ ⑤

I1: IF ID EX MEM WB

I2: IF ID EX MEM WR

↑

I2 (fetch data in  
3rd phase)

~~WAW~~

(operations are overlapped in time)

WAW hazard is due to overlapping of write-back phases of two consecutive instructions.

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structural hazard

- different instructions accessing same resource

example:

```

IF ID EX MEM WB
    
```

multiple issue processor

A processor that can sustain more than one instruction per cycle

CPI (Instruction Per cycle)

If CPI = 1 means one instruction per cycle

If we want to reduce CPI < 1, then we have to look out issuing multiple instructions.

i.e. if two instructions are in one cycle,

$$CPI = \frac{1}{2} = 0.5 < 1$$

Types of multiple issue processor.

two variants

1. superscalar processor

2. VLIW (Very Large Instruction word)

superscalar processor

refers to the machine that is designed to improve the performance of the execution of scalar instructions

Example:-

I<sub>L</sub> IF ID EX MEM WB  
I<sub>O</sub> IF ID EX MEM WB  
IF ID EX MEM WB  
IF ID EX MEM WB

Assignment 1 :-

VLSI

Processor parallelism

Due date

20/7/9-08-15

## Unit-2 Dependence and its properties

- for a given sequential program, a collection of the statement to statement execution ordering that can be used as a guide to select and apply transformations, that preserve the meaning of the problem.
- Each pair of statements in the graph is called a dependence.

Dependency represents two kinds of constraints:-

- ① data dependence
- ② control dependence

### Data dependence

Ensure that data is produced and consumed in correct order.

Example:-

$$s_1 : \pi = 3.14$$

$$s_2 : R = 5.0$$

$$s_3 : \text{Area} = \pi * R * R$$

- $s_3$  cannot be moved before  $s_1$  or  $s_2$ .
- To prevent this we will construct data dependence from  $s_1$  and  $s_2$  to  $s_3$ .
- No execution constraint between  $s_1$  and  $s_3$  because  $\{s_1, s_2, s_3\}$  or  $\{s_2, s_1, s_3\}$  both gives same result

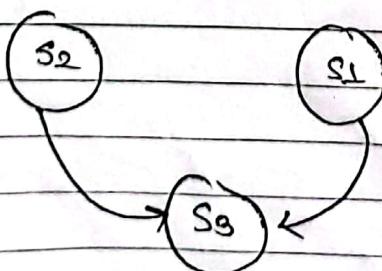


Fig:- Dependence in paths.

Lab no:-2

control hazard simulator.

I1 → 100

I2 → 102

100

I3 → 104

PC

I4 → 106

I5 → 108

Instruction : ~~Instruction to be fetched from memory~~

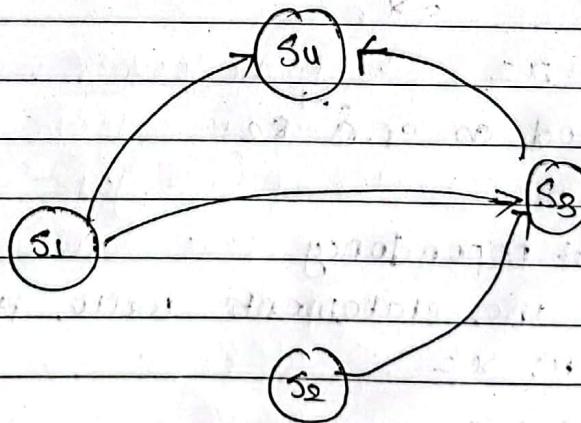
s1 : a = 3.14

s2 : b = 5.0

s3 : c = a \* b

s4 : d = a \* c

control proper!



## Control Dependence:

Dependence due to control flow

1. If ( $T = -0.0$ )  $s_1 \rightarrow s_2$

$s_2: A = A/T$

$s_2: \text{CONTINUE}$

Here  $s_2$  cannot be executed before  $s_1$ . Execution  $s_2$  before  $s_1$  could cause control hazards.

## Load store classification

### 1. True dependence

The first statement stores into a location that is later read by the second statement.

$s_1: x =$

$s_2: x$

denoted by  $s_1 \delta^s s_2$

### 2. Anti-dependence

The first statement reads from a location into which the second statement later stores.

$s_1: x =$

$s_2: x =$

denoted by  $s_1 \delta^{-1} s_2$

### 3. Output dependency

Both the statements write pt into same location

$s_1: x =$

$s_2: x =$

denoted by  $s_1 \delta^0 s_2$

Example:

S<sub>1</sub>:  $x = 2$

S<sub>2</sub>:  $y = 3$

S<sub>3</sub>:  $x = 2$

S<sub>4</sub>:  $w = x * y$

Find dependency type between S<sub>1</sub>, S<sub>2</sub>, and S<sub>3</sub>.

for ( $i=1$ ;  $i \leq n$ ;  $i++$ )

    for ( $j=1$ ;  $j \leq n$ ;  $j++$ )

S<sub>1</sub>:  $x[i,j] = A[i,j] + Y[i,j]$

S<sub>2</sub>:  $Y[i,j] = C[i,j] + X[i,j]$

S<sub>3</sub>:  $X[i,j] = Y[i,j] + D[i,j]$

S<sub>1</sub>, S<sub>2</sub>  $\Rightarrow$  True dependence.

S<sub>2</sub>, S<sub>3</sub>  $\Rightarrow$  Antidirectional dependency

S<sub>1</sub>, S<sub>3</sub>  $\Rightarrow$  Output dependency

### Dependence in loop

Let us look at two different loops.

DO I=1, N

    S<sub>1</sub>:  $A(I+1) = A(I) + B(I)$

End DO

$$A_1 \leftarrow A_1 + B_1$$

$$A_2 \leftarrow A_2 + B_2$$

$$A_3 \leftarrow A_3 + B_3$$

Fig: (1)

DO I=1, N

    S<sub>1</sub>:  $A(I+2) = A(I) + B(I)$

END DO

$$A_3 = A_1 + B_1$$

$$A_4 = A_2 + B_2$$

$$A_5 = A_3 + B_3$$

Fig: (2)

In both cases  $s_1$  depends on itself. However in fig(1) depends on previous statement and in fig(2) depend in two previous statement.

### Iteration number.

for an arbitrary loop in which the loop for index  $I$  runs from  $L$  to  $U$  in steps of  $S$ , the iteration number  $i$  of a specific iteration is equal to the value  $(I - L + S)/S$  where  $I$  is the value of the index on that iteration.

### Example

$DO \ I = 0, 10, 2$

$s_1 <some\ statement>$

$END\ DO$

For  $I = 4,$

$, u = 0 + 2$

$S$

$= 3$

### Iteration vector

Given a nest of  $n$  loops, the iteration vector  $i$  of a particular iteration of the innermost loop is a vector of integers that contains the iteration numbers for each of the loops in order of nesting level.

The iteration vector for  $i = \{i_1, i_2, \dots, i_n\}$  where  $i_k, 1 \leq k \leq n$  represents the iteration number for the loop at nesting level  $k$ .

### Example :-

```

DO I = 1,2
  DO J = 1,2
    < some statements >
  END DO
  I = j

```

The iteration vector  $s_1 [ (2,1) ]$  denotes the instance at  $s_1$  executed during the second iteration of  $I$  and first iteration of  $J$ .

Iteration space.

The set of all possible iterations vectors for a statement.

Example.

In above, the iteration space of  $s_1$  is

$\{ (1,1), (1,2), (2,1), (2,2) \}$

**Loop dependence.**

There exists a dependence from statement  $s_1$  to statement  $s_2$  in a common nest of loops if and only if, there exist two iteration vectors  $i^p$  and  $j^q$  for the nest, such that,

- $i^p < j^q$  or  $i^p = j^q$  and there is a path from  $s_1$  to  $s_2$  in the body of the loop.

- $s_1$  accesses memory location  $M$  on iteration  $i^p$  and  $s_2$  accesses  $M$  on iteration  $j^q$

- One of these access is a write.

- an iteration vector  $i$  precedes iteration vector  $j$  iff any statement executed on the iteration described by  $i$  is executed before any statement on the iteration described by  $j$ .

## Transformations

- we call a transformation *safe* if the transformed program has the same meaning as the original program.
- two computations are equivalent if, on the same inputs, they produce same outputs in the same order.

Reordering Transformations - changes the order of execution at the code, without adding or deleting any executions of any statements since a reordering transformation does not delete any statement executes any two executions that reference a common memory element before a reordering transformation will reference the same memory element after that transformation. Hence, if there is a dependence between the statements before the transformations, there will also be one afterward.

i.e. a reordering transformation does not eliminate dependent

## Transformations

- We call a transformation safe if the transformed program has the same meaning as the original program.
- Two computations are equivalent if, on the same inputs, they produce same outputs in the same order.

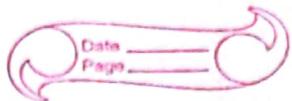
## Reordering Transformations

- Changes the order of execution of the code, without adding or deleting any executions of any statements.
- Since a reordering transformation does not delete any statement executions, any two executions that reference a common memory element before a reordering transformation will also reference the same memory element after that transformation.
- Hence, if there is a dependence between the statements before the transformations, there will also be one afterward.
- i.e a reordering transformation does not eliminate dependences.

## Fundamental Theorem of Dependence

### Statement

- A transformation is said to be valid for the program to which it applies if it preserves all dependencies in the program.



### Proof

- Assume a program with loop and conditional statement free.
- Let  $s_1, s_2, \dots, s_n$  be the executing order in the original program.
- Let  $\{i'_1, i'_2, \dots, i'_n\}$  be the permutation of the statement that represent the order of execution of statement of transformed program.
- Let it be proved by contradiction, i.e. the sequence of statements in the transformed program conforms at least one statement that produce an incorrect result.
- Let  $s_k$  be the first statement in the new order that produce an incorrect output.
- Since all the statements that have executed before  $s_k$  produce the same value they did in the original program, there are only three ways that  $s_k$  can see an incorrect input in a specific location  $m$

#### Case 1: (True Dependence)

- a statement  $s_m$  that originally stored its result in  $m$  before it was read by  $s_k$ , now stores into  $m$  after it is read by  $s_k$  ( $s_m \delta s_k$ )

#### Case 2: (Anti Dependence)

- a statement  $s_m$  that originally stored into  $m$  after it was read by  $s_k$  now writes  $m$  before  $s_k$  reads it ( $s_m \delta^{-1} s_k$ )

### Case 3 : (Output Dependence)

- two statements that both write into  $M$  before it was read by  $s_k$  ( $s_m s^o s_k$ )
- since this exhausts the way that  $s_k$  can get the wrong value, the result is proved by contradiction

### Distance Vector

- suppose that there is a dependence from statement  $s_1$  on iteration  $i$  of a loop nest to statement  $s_2$  on iteration  $j$ , then the distance vector  $d(i, j)$  is defined as a vector of length  $n$  such that

$$d(i, j)_k = s_k - i_k$$

### Direction Vector

- suppose that there is a dependence from statement  $s_1$  on iteration  $i$  of a loop to statement  $s_2$  on iteration  $j$ , then the direction vector  $D(i, j)$  is defined as

$$D(i, j)_k = \begin{cases} "<" & \text{if } d(i, j)_k > 0 \\ "=" & \text{if } d(i, j)_k = 0 \\ ">" & \text{if } d(i, j)_k < 0 \end{cases}$$

e.g.

for ( $i=1, i \leq 100; i++$ )

{

  for ( $j=1 ; j \leq 100, j++$ )

{

    for ( $k=1, k \leq 200, k++$ )

{

$$A[i+1, j, k] = A[i, j, k+1] + B$$

}

3

- Let the iteration vector be  $\{3, 8, 5\}$

$$s_i \Rightarrow A[4, 8, 5] = A[3, 8, 6] + B$$

sink                  source

Distance vector

$$= (4, 8, 5) - (3, 8, 6)$$

$$= (1, 0, -1)$$

$$\downarrow \quad \downarrow \quad \downarrow \\ < = > \quad \text{Direction vector}$$

e.g.

for ( $i=1, i \leq N, i++$ )

  |  
  | for ( $j=1, j \leq M, j++$ )

    |  
    | for ( $k=1, k \leq l, k++$ )

$$A[i+1, j, k-1] = A[i, j, k] + 10$$

g  
g

Find the distance and direction vector for iteration vector  $\{1, 1, 1\}$

$\Rightarrow$  Let the direction vector be  $\{1, 1, 1\}$

$$s_i \Rightarrow A[2, 1, 0] = A[1, 1, 1] + 10$$

Distance vector :  $[2, 1, 0] - [1, 1, 1]$   
 $\{1, 0, -1\}$

Direction vector : ( $<$ ,  $=$ ,  $>$ )

### Loop Carried Dependence

- dependence exists across iterations.
- i.e if the loop is removed, the dependence no longer exists.

```

DO I = 1, N
S1 : A(I+1) = F(I)
S2 : F(I+1) = A(I)
END DO
    
```

### Loop Independent Dependence

- dependence exist with in iteration.
- i.e if the loop is removed , the dependence still exists .

```

DO I = 1, 10
S1 : A(I) = ...
S2 : ... = A(I)
END DO
    
```

### Example:

Find what type of loop dependence in following program.

1. DO I = 1, 9  
 $S_1 : A(I) = \dots$   
 $S_2 : \dots = A(10 - I)$   $\Rightarrow$  Loop  
END DO

2. For ( $i=1, i < n, i++$ )

{

$$S_1: A[i] = A[i-1] + 1;$$

$$S_2: B[i] = A[i];$$

}

$\Rightarrow S_1 \rightarrow S_1 \Rightarrow$  Loop carried Dependence

$S_1 \rightarrow S_2 \Rightarrow$  Loop Independent Dependence

### Iteration space Traversal Graph (ISTG)

- shows graphically, the order of traversal in the iteration space.
- a node represents a point in the iteration space.
- a directed edge indicates the next point that will be encountered after the current point is traversed.

e.g.

for ( $i=1; i < 4; i++$ )

{

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

{

$$S_1: A[i][j] = A[i][j-1] + 1;$$

}

j

	1	2	3
1	$O^{(1,1)}$	$O^{(1,2)}$	$O^{(1,3)}$
2	$O^{(2,1)}$	$O^{(2,2)}$	$O^{(2,3)}$
3	$O^{(3,1)}$	$O^{(3,2)}$	$O^{(3,3)}$

## Parallelization

- It is valid to convert a sequential loop to a parallel loop if the loop carries no dependence

e.g.  $A[0] = 1$

for ( $i=1$ ;  $i < N$ ;  $i++$ )

$$A_1 = A_0 + A_0$$

$$A_2 = A_2 + A_1$$

$$A[i] = A[i] + A[i-1]; \quad A_3 = A_3 + A_2$$

}

e.g. for  $A[0] = 1$  no off-loop parallelism possible -

for ( $i=1$ ;  $i < N$ ;  $i+2$ )

$$A[i] = A_1 + A_0$$

$$A_3 = A_3 + A_2$$

$$A[i] = A[i] + A[i-1] \quad A_5 = A_5 + A_4$$

## Dependence Testing

- is the method used to determine whether dependencies exists between two subscripted references to the same array in a loop nest

DO  $i_1 = L_1, U_1$

DO  $i_2 = L_2, U_2$

:

DO  $i_n = L_n, U_n$

$S_1: A(f_1(i_1, \dots, i_n), \dots, f_m(i_1, \dots, i_n)) = \dots$

$S_2: \dots \dots A(g_1(i_1, \dots, i_n), \dots, g_m(i_1, \dots, i_n))$

END DO

END DO

END DO

- dependence exist from  $s_1$  to  $s_2$  if
  $f_i(\alpha) = g_i(\beta)$  for all  $i$ ,  $1 \leq i \leq m$  and  
 $\alpha, \beta$  are iteration vectors.

~~GD~~

### GCD Test (Greatest Common Divisor Test)

- We can use linear diophantine equation and GCD test to find the dependence in Loop.
- Diophantine equation is a polynomial equation, usually involving two or more unknowns, such that the only solutions of interest are the integer ones.

example:  $Ax + By = C$  when  $A, B, C$  are integers

- If  $\text{GCD}(A, B)$  divides  $C$ , then dependency exists and in that case the loop is not parallelizable.

### Solving diophantine equation

example:  $70x + 112y = 160$

Step 1: Find  $\text{GCD}(70, 112) = ? = 14$

$$\begin{array}{r}
 70 ) 112 ( 1 \\
 - 70 \\
 \hline
 42 ) 70 ( 1 \\
 - 42 \\
 \hline
 28 ) 42 ( 1 \\
 - 28 \\
 \hline
 14 ) 28 ( 2 \\
 - 28 \\
 \hline
 0
 \end{array}$$

Step 2: Find value of  $m$  and  $y$

Reverse method

$$14 = 42 - 28$$

$$14 = 42 - (70 - 42)$$

$$14 = 42 - 70 + 42$$

$$14 = 2(42) - 70$$

$$14 = 2(112 - 70) - 70$$

$$14 = 2(112) - 3(70)$$

$$14 \times 12 = 2 \times 12(112) - 3 \times 12(70)$$

$$168 = 24(112) - 36(70)$$

(After some trial and error fashion) first add

and find  $x = -36$  (long division will give us this)

so  $y = 24$  (add 96 to both sides first)

so  $x$  always dependency on  $y$  (rest of steps will be similar)

Example: Is parallelism mean no dependency?

Find dependency in following loop which also

DO  $i = 1, N$

$A(4i) = 4 \cdot 2i + 2$  (4 columns)

$= 4(2i + 2)$  where  $(4, i)$  and  $2i$

so?

$$4x = 2y + 2$$

$$4x - 2y = 2$$

$$\text{GCD}(4, -2) = 2$$

- since 2 divides, there is dependency in the loop  
and loop cannot be executed parallelly.

Example:

Find the diophantine equation to find if the following loop is parallelizable or not

for ( $i=1; i \leq 10; i++$ )

{

$$A[3 \times i + 20] = \dots$$

$$\dots = A[2 + i]$$

}

$$3x + 20 = 2y$$

$$3x - 2y = -20$$

$$\text{GCD}(3, -2) = 1$$

Example:

Find the diophantine equation to find if the following loop is parallelizable or not

for ( $i=1; i \leq 10; i++$ )

{

$$A[3 \times i + 20] = \dots$$

$$\dots = A[2 \times i]$$

}

$$3x + 20 = 2y$$

$$3x - 2y = -20$$

$$\text{GCD}(3, -2) = 1$$

Exercise.

Find the dependence test in following

DO  $I = 1, N$

DO  $J = 1, N$

$$S_1: A[2i + 2j] = \dots$$

$$S_2: \dots = A(4i - 6j + 3)$$

ENO DO

END DO

1) From  $S_1 \rightarrow S_2 \Rightarrow$  No dependency

$$2a + 2b = 4a - 6b + ?$$

$$(2a + 2b - 4a + 6b) = 3 \cdot$$

$$(2, 2, 4, 6) = 2$$

Find dependence (intra) from  $s_1 \rightarrow s_1$  and  $s_2 \rightarrow s_2$

DO  $I = 1, 3$

DO  $J = 1, 3$

DO  $k = 1, 3$

$$s_1 : A(I+J, 2J+2, k+1) = B(I, 2J, k)$$

$$s_2 : C(I, J, k) = A(I, 2, 9-k)$$

END DO

END DO

END DO

$s_1 \rightarrow s_1 \Rightarrow$

## Subscript categories for dependence testing

1. ZIV test (Zero Index Variable)

If it contains no loop index variable

2. SIV test (Single Index Variable)

If it contains only one index variable

3. MIV test (Multiple Index Variable)

If it contains multiple index variables

### ZIV test

- ZIV subscripts contain no references to any loop variables.

i.e. they do not vary within any

e.g. DO I = 1, 100

$s_1: A(e_1) = \dots$

$s_2: \dots = A(e_2) + B(i)$

END DO

- here  $e_1$  and  $e_2$  are constants

- if  $(e_1 - e_2) \neq 0$  then dependence does not exist.

### SIV Testing

#### SIV

strong      weak

zero      crossing

## SIV Test

- Assume a case

$$S_1: A(\dots, \alpha_1 i_k + c_1, \dots) = \underline{\quad}$$

$$S_2: \underline{\quad} = A(\dots, \alpha_2 i_k + c_2, \dots)$$

case 1: ( $\alpha_1 = \alpha_2$ )  $\Rightarrow$  strong SIV Test

case 2: ( $\alpha_1 = -\alpha_2$ )  $\Rightarrow$  weak crossing SIV Test

case 3: ( $\alpha_1 = 0$  or  $\alpha_2 = 0$ )  $\Rightarrow$  weak zero SIV Test

### Strong SIV Test

$$a = \frac{c_2 - c_1}{\alpha}$$

- dependence exist if  $a \in \mathbb{Z}$  and  $|a| \leq N-L$

eg.

DO  $I = 1, N$

$$S_1: A(I+2*N) = A(I+N)$$

END DO

### Weak Zero SIV Test

$$a = \frac{c_2 - c_1}{\alpha}$$

- if  $a$  is an integer then dependence exist

eg.

DO  $I = 1, N$

$$S_1: Y(I, N) = Y(1, N) + Y(N, N)$$

END DO

$$\downarrow \\ Y(1, N) = Y(1, N) + Y(N, N)$$

DO  $I = 2, N-1$

$$Y(I, N) = Y(1, N) + Y(N, N)$$

END DO

$$Y(N, N) = Y(1, N) + Y(N, N)$$

## Weak crossing SIV Test

$$q = \frac{C_2 - C_1}{2\alpha}$$

- if  $2q$  is integer the dependence exist

e.g.

DO  $I = 1, N$

$$S_1 : A(I) = A(N - I + 1) + C$$

END DO

↓

DO  $I = 1, (N+1)/2$

$$A(I) = A(N - I + 1) + C$$

END DO

DO  $I = (N+1)/2, N$

$$A(I) = A(N - I + 1) + C$$

END DO

Loop Overheads

- 1. Initialize counter
  - 2. Increment / Decrement
  - 3. Test and Branch
  - 4. FSM
  - 5. Condition Check
  - 6. Extra cycles for R/W memory
- } Software overheads
- } Hardware

Loop Induction Variable

- An induction variable is a variable whose value in each loop iteration is a linear function of the iteration index.
- the loop index is trivially an induction variable

eg:  $J = 0$ For  $I = 1 \text{ to } N$ Here,  $I, J, K, M$  are induction variables. $J = J + 1$  is an induction variable. $K = 2 * J$  is not a good candidate for induction. $M = 3 * K$  is not a good candidate for induction. $B = C + D$  is not a good candidate for induction.

END FOR

Induction Variable Optimization

eg.

 $\text{for}(i = 0; i < N; i++)$  $\quad\quad\quad\{$   
 $\quad\quad\quad\quad j = 4 * i + 3;$  $\quad\quad\quad\quad y = f(j);$  $\}$  $\text{for}(j = 3; j < 4 * N + 3; j = j + 4)$  $\quad\quad\quad\{$   
 $\quad\quad\quad\quad y = f(j)$  $\}$

## Preliminary Transformation

- Most dependence tests require subscript expression to be linear of loop induction variables.
- but programs are not typically written with dependence testing in mind.

eg.  $INC = 2$

$$KI = 0$$

$DO \ I = 1, 100$

$DO \ J = 1, 100$

$$KI = KI + INC$$

$$U(KI) = U(KI) + W(J)$$

$END DO$

$$S(I) = U(KI)$$

$END DO$

- Only two subscripts  $W(J)$  and  $S(I)$  are linear functions of the loop index variables.
- $U(KI)$  cannot be tested because  $KI$  varies within the loop.
- $INC$  is invariant within the inner loop.
- assignment of  $KI$  within  $J$  loop, increments its value by a constant amount on each loop iteration.

$KI \Rightarrow$  Auxiliary Induction Variable

- induction variable substitution transform every reference to an auxiliary induction variables into a direct function of  $i$ , loop index.

## Apply Induction Variable Substitution

1. Replace reference to auxiliary induction variable with function of loop index.

$INC = 2$

$KI = 0$

$DO I = 2, 100$

(1)  $DO J = 1, 100$

$KI = KI + INC$

$U(KI + J * INC) = U(KI + J * INC) + W(J)$

$END DO$

$KI = KI + 100 * INC$

$S(I) = U(KI)$

$END DO$

2. Remove all references to  $KI$ .

$INC = 2$

$KI = 0$

$DO I = 1, 100$

$DO J = 1, 100$

$U(KI + (J - 1) * 100 + INC + J * INC) =$

$U(KI + (I - 1) * 100 * INC + J * INC) + W(J)$

$END DO$

$S(I) = U(KI + I * (100 * INC))$

$END DO$

$KI = KI + 100 * 100 * INC$

### 3. Substitute the constants

$INC = 2$

$KI = 0$

$DO I = 1, 100$

$DO J = 1, 100$

$$U(I * 200 + J * 2 - 200) =$$

$$U(I * 200 + J * 2 - 200) + W(J)$$

$END DO$

$$S(I) = U(I * 200)$$

$END DO$

$$KI = 20000$$

### 4. Remove all unused code

$DO I = 1, 100$

$DO J = 1, 100$

$$U(I * 200 + J * 2 - 200) =$$

$$U(I * 200 + J * 2 - 200) + W(J)$$

$END DO$

$$S(I) = U(I * 200)$$

$END DO$

## Loop normalization

- To make dependence testing process as simple as possible many compilers normalize all loops to run from a lower bound of 1 to some upper bound with stride 1 (step 1)

Algorithm to do this (2 steps)

Procedure Normalized Loop ( $L_0$ )

- Let  $i$  be a unique compiler generated loop induction variable.

$S_1$  : replace the loop header for  $L_0$

DO  $I = L, U, S$

with the adjusted loop headers as

DO  $I = 1, (U + L + S) / S$

$S_2$  : replace each reference to  $I$  with the loop by

$\rightarrow i * S - S + L$

end.

e.g. Unnormalized

DO  $I = 1, M$

DO  $J = 1, N$

$A(J, I) = A(J, I-1) + 5$

END DO

END DO

Normalized

DO  $I = 1, M$

DO  $J = 1, N - I + 1$

$A(J, I-1, I) = A(J+I-1, I-1) + 5$

END DO

END DO

## Data Flow Analysis

- It is an analysis that determines the information regarding the definition and use of data in a program.

e.g.  $S_1: n = a + b \Rightarrow n$  is defined by  $S_1$

and  $S_1$  uses  $a$  and  $b$ .

### Data Flow properties.

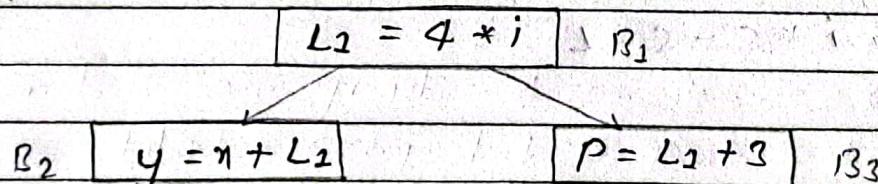
1. Available expression

2. Reaching definition

#### 1. Available expression

- An expression "a+b" is said to be available at a program point "n", if none of its operands gets modified their use.

e.g.



i.e  $4 * i$  ( $L_1$ ) is available for block  $B_2$  and  $B_3$ .

#### 2. Reaching definition

A definition d is reaching to a point n if d is not killed or redefined before that point.

e.g.

$$D_1 : n = y$$

$$D_2 : n = n + 2$$

$$D_3 : n = y = n + 2$$

$D_1$  is reaching definition, for  $D_2$   
but not for  $D_3$ , since it  
is killed by  $D_2$ .

eg.

$$S_1: a = 3$$

$$S_2: b = a + z$$

$$S_3: a = x + y$$

$$S_4: c = a + z$$

### Next-Use Information

- We need to know for each basic block, whether the value contained in the variable will be used again later.
- if a variable has no next-use, we can reuse the register allocated to the variable.

eg.

Statement	Live(L) / Dead(D)				Next Use			
	x	y	z	t <sub>7</sub>	x	y	z	t <sub>7</sub>
1. x = y + z	L	D	D	-	2	-	-	-
2. z = x * 5	D	-	L	-	3	-	-	-
3. t <sub>7</sub> = z + 1	-	-	L	L	-	-	4	4
4. y = z - t <sub>7</sub>	-	L	L	D	5	5	-	-
5. x = z + y	D	D	D	-	-	-	-	-

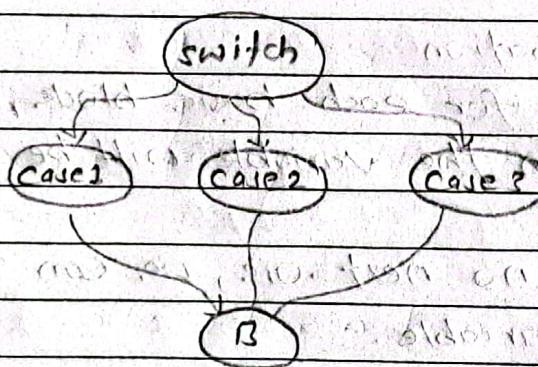
## Definition-use graph

- is a graph that contains an edge from each definition point in the program to every possible use of the variable at run time.

## Blocks

- basic block is a maximal group of statements such that one statement in the group is executed if and only if every statement is executed.

eg.



## Definition-use graph sets

- basic block computation produces the following set.
  1. **Uses (b)**
    - the set of all variables used within block b that have no prior definitions within the block.
  2. **Defsout (b)**
    - the set of all definitions within block b that are not killed within the block.

### 3. Killed (b)

- the set of all definitions that define variables killed by other definitions within b.

eg.

$$\begin{array}{ll}
 a = b + c & \text{uses}(B_1) = \{b, c\} \\
 B_1, \quad d = a * 2 & \text{defout}(B_1) = \{d, f\} \\
 f = a + d & \text{killed}(B_1) = \{a\} \\
 a = 2
 \end{array}$$

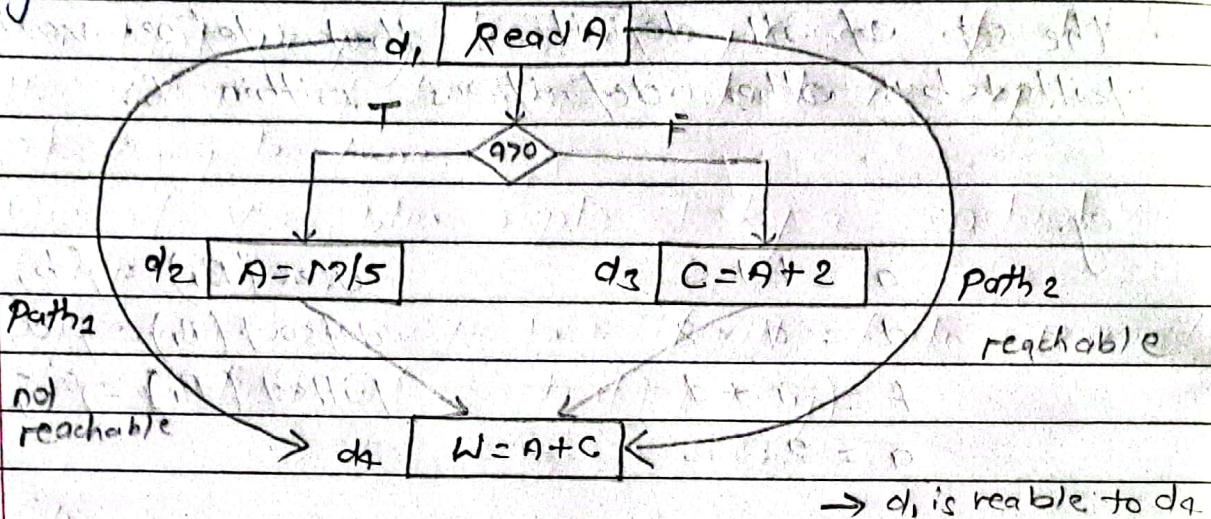
### 4. Reaches (b)

- the set of all definitions from all blocks that can possibly reach b.
- Let us consider a graph with one basic block b, and some number of predecessors, each of which can reach b through some form of control flow in this graph, reaches(b), along any one predecessor join the set of all definitions that reach p, and that also are not killed inside p, plus that reach the exit of p.

formally,

$$\begin{aligned}
 \text{reaches}(b) = \bigcup_{p \leftarrow p(b)} (\text{defout}(p) \cup (\text{reaches}(p) \setminus \text{killed}(p)))
 \end{aligned}$$

eg.



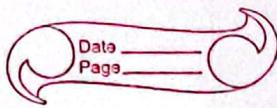
eg.

$$\begin{aligned}
 &\text{reachable } d_1: y = 2 \\
 &\text{reachable } d_2: y = y + 2 \\
 &\text{not reachable } d_3: m = y + 2 \quad \text{reachable}
 \end{aligned}$$

### Dead Code Elimination

- removes unnecessary instructions from the program.
- dead code is a section in the source code of the program which is executed but whose result is never used in any other computation.

$$\begin{aligned}
 &\text{eg. } c = a * b \\
 &t = a \\
 &d = a * b + 4
 \end{aligned}
 \Rightarrow
 \begin{aligned}
 &c = a * b \\
 &d = a * b + 4
 \end{aligned}$$



eg.

int test()

{  
    int a, b;

    a = 1;  
    x b = 2;

    b = 3;

    return b;

    x a = b; → unreachable code

}

~~11~~

int test.

{

    int a, b;

    b = 3;

    return b;

}

~~11~~

    Dead code Elimination Algorithm

Procedure EliminateDeadCode (P)

    worklist = {all absolutely useful statements} → output, input

    while (worklist ≠ Ø) DO

        repeatedly     - n = an arbitrary element of worklist

        adds the ←

        statement that are

        necessary to

        compute the

        number of

        worklist

        - mark n as useful

        - worklist = worklist - {n}

        - for all (y, n) ∈ defuse-graph DO

            if y is not marked useful then

                worklist = worklist ∪ {y}

    end

    - delete every statement that is not marked useful

End procedure

## Constant Propagation

- Constant propagation is a process of substituting the values of known constants in expressions at compile time.
- Use of variables replaced by a constant value (propagation).
- Expression is evaluated if all of its operands are constant (constant folding)

Eg.

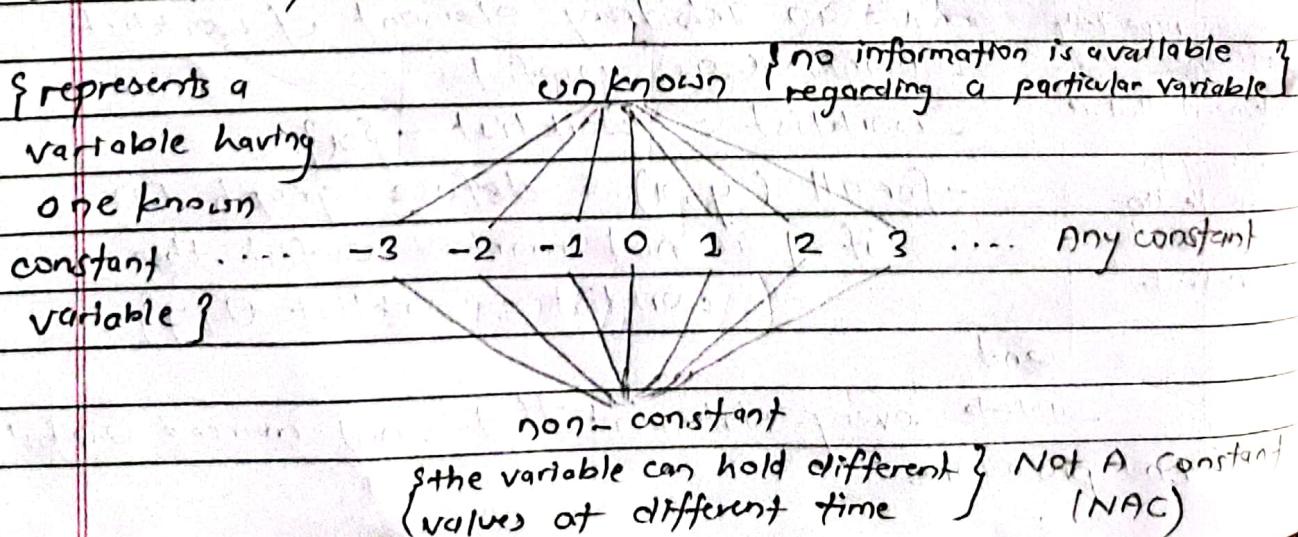
$$\begin{array}{ccc}
 x = 14 & x = 14 & x = 14 \\
 y = 7 - \frac{x}{2} & \Rightarrow & y = 7 - \frac{14}{2} \Rightarrow y = 0 \\
 \text{return } y * \left(\frac{28}{x} + 2\right) & \text{return } y * \left(\frac{28}{14} + 2\right) & \text{return } 0;
 \end{array}$$

folding

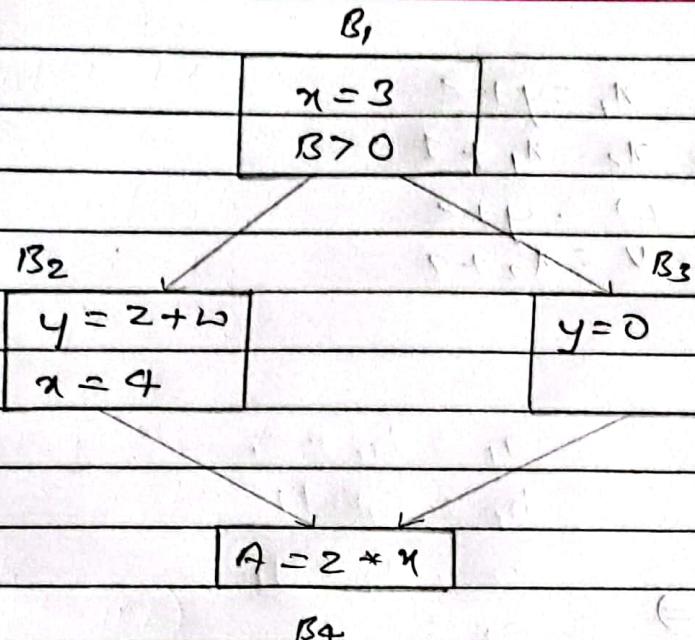
constant  
propagation

## Some symbols used in constant propagation.

1.  $\perp$  (Bottom)  $\Rightarrow$  This statement never executes
2.  $C$  (constant)  $\Rightarrow$  is constant.
3.  $T$  (top)  $\Rightarrow$  not a constant.



e.g.



### Meet Operation

1. Any constant  $\leq$  unknown
2. NAC  $\leq$  Any constant
3. Unknown  $\wedge$   $x = y$
4. NAC  $\wedge$   $x = \text{NAC}$
5. NAC  $\wedge$  unknown = NAC
6.  $x \wedge x = x$  but  $x \wedge y = \text{NAC}$   
IF  $x \neq y$

### SSA (Single Static Assignment) form

- SSA is a program in SSA form
- If a program is in SSA form, if each use of variable is reached by exactly one definition.
- Optimization becomes easier if each variable has only one definition.
- i.e every variable has single definition.

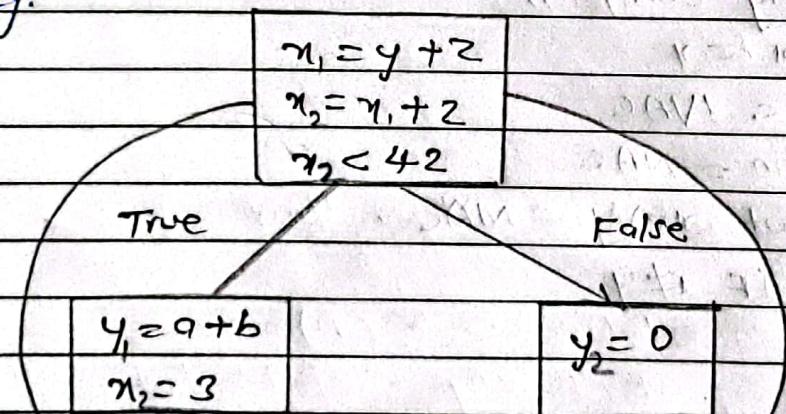
eg.

$$\begin{array}{ll} x = y + z & x_1 = y + z \\ x = x + 1 & \Rightarrow x_2 = x_1 + 1 \\ w = y + z & w = y + z \\ v = x + 3 & v = x_2 + 3 \end{array}$$

eg.

$$\begin{array}{ll} a = b + c & \\ b = c + d & \\ a = y + z & \\ b = q + b & \Rightarrow \\ n = 2 * q & \\ y = x + b & \end{array}$$

eg.



Path<sub>1</sub>

$$z = x + y$$

$$z = x_2 + (y_1 \text{ or } y_2)$$

Path<sub>2</sub>

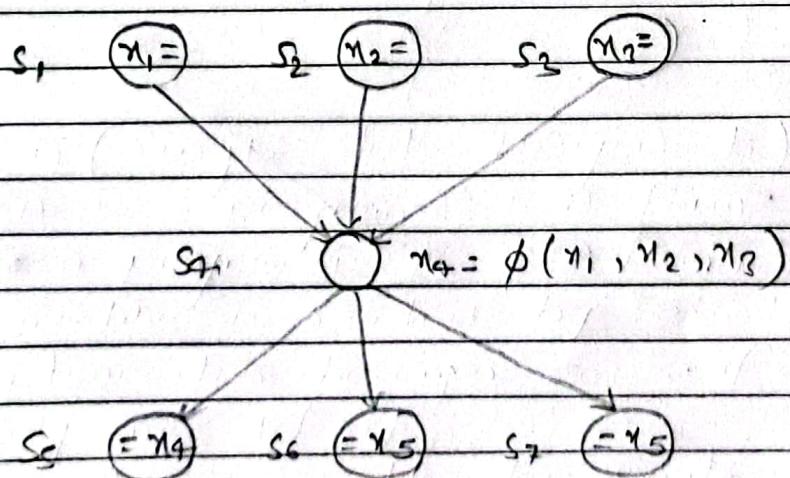
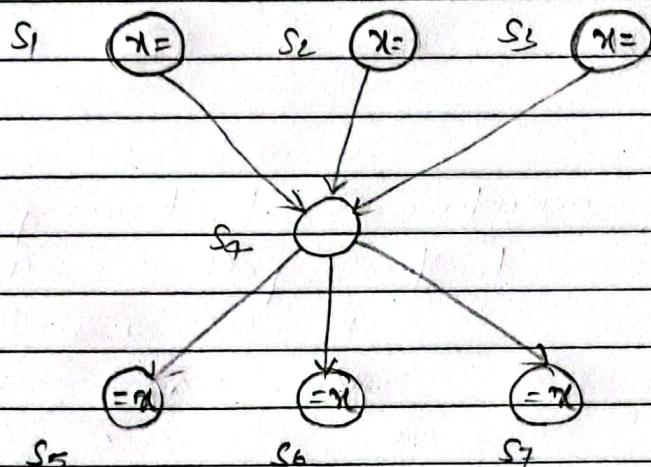
$$y_1$$

and out in addition

y<sub>2</sub> instead of y<sub>1</sub>

## The $\phi$ function

- $\phi$  merges multiple definitions along multiple control paths into a single definition.
- at a basic block with  $\phi$  predecessors, there are  $p$  arguments to the  $\phi$  function,  
 $x_{new} = \phi(x_1, x_2, \dots, x_p)$
- choose the version depending in the incoming edges.



## Common subexpression elimination

- An occurrence of an expression,  $E$  is called a common sub-expression, if  $E$  was previously computed and the values of the variables in  $E$  have not changed since the previous computation.
- is a compiler optimization technique that searches for identical expressions.
- i.e if they all evaluate to the same value then replace with a single variable holding the computation.

eg.

$$\begin{aligned} a &= b * c + g & \Rightarrow \text{temp} &= b * c \\ d &= b * c * k & a &= \text{temp} + g \\ & & d &= \text{temp} * k \end{aligned}$$

eg.

$$\begin{array}{ll} t_6 = 4 * i & t_6 = 4 * i \\ a = a[t_6] & a = a[t_6] \\ t_7 = 4 * j & t_7 = 4 * j \\ t_8 = 4 * j & t_8 = t_7 \\ t_9 = a[t_8] \Rightarrow ? & t_9 = a[t_7] \\ a[t_7] = t_9 & a[t_7] = t_9 \\ t_{10} = 4 * j & t_{10} = t_7 \\ a[t_{10}] = x & a[t_7] = y \\ \text{goto } B_2 & \text{goto } B_2 \end{array}$$

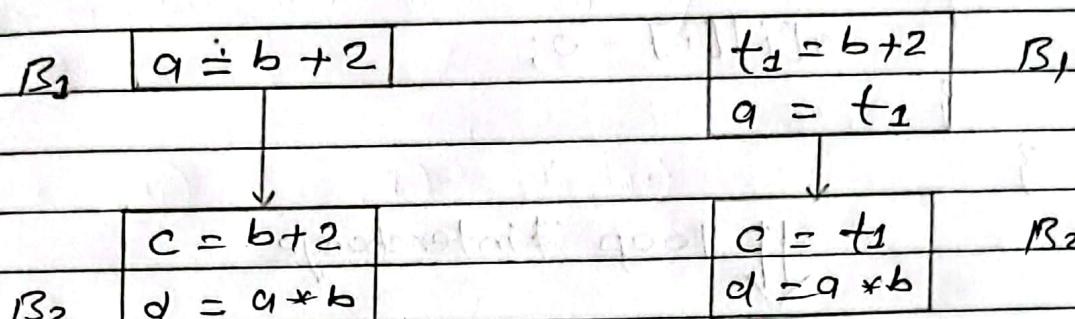
## Forward substitution

- is the inverse of common sub expression elimination.
- instead replacing an expression evaluation by a copy operation, it replaces a copy by a

re-evaluation of the expression.

- it may seem that common subexpression elimination reduces the number of ALU operations.
- but still it causes a register to be occupied for a long time in order to hold an expression's value and hence reduces the number of registers available for other uses.

eg.



fig(1)

fig(2)

- in fig(1), the edge from  $B_1$  to  $B_2$  uses two registers for  $a$  and  $b$ .
- in fig(2), the edge from  $B_1$  to  $B_2$  uses three registers for  $a, b, t_1$ .

## Unit-4

### Loop Optimization



#### Loop Interchange

- switching the nesting order of two loops.
- i.e. exchange inner loops with outer loops.

eg.

```
for (i=0; i<100; i++)  
{  
    for (j=0; j <100; j++)  
    {  
        a[j][i] = 0;  
    }  
}
```

↓↓ loop interchange

```
for (j=0; j <100; j++)  
{  
    for (i=0; i <100; i++)  
    {  
        a[j][i] = 0;  
    }  
}
```

- not all loop interchange are safe.

eg. Before Loop Interchange

DO J = 1, M

DO I = 1, N

$$A(I, J+1) = A(I+1, J) + B$$

END DO

END DO

Result Analysis

$$J=1, I=1 A_{12} =$$

$$2 A_{22}$$

$$3 A_{32}$$

$$4 A_{42}$$

$$J=2, I=1 A_{12} =$$

$$2 A_{23}$$

$$3 A_{33}$$

$$4 A_{43}$$

$$A_{21} + B$$

$$A_{31} + B$$

$$A_{41} + B$$

$$A_{51} + B$$

$$A_{22} + B$$

$$A_{32} + B$$

$$A_{42} + B$$

$$A_{52} + B$$

eg. After Loop Interchange

Result Analysis

DO  $I = 1, N$

$I = 1, J = 1$

DO  $J = 1, M$

-2

$A(I, J+1) \leftarrow A(I+1, J) + B$

-3

END DO

-4

END DO

$I = 2, J = 1$

-2

Result Analysis

$I = 1, J = 1 \quad A_{12} = A_{21} + B$

-4

2  $A_{22} = A_{22} + B$

-3

3  $A_{14} = A_{23} + B$

-4

4  $A_{15} = A_{24} + B$

$I = 2, J = 1 \quad A_{22} = A_{21} + B$

2  $A_{23} = A_{22} + B$

3  $A_{24} = A_{23} + B$

4  $A_{25} = A_{24} + B$

### Loop unrolling

- is a loop transformation technique that helps to optimize the execution time of a program.

eg.

sum = 0

for( $i=0; i<100; i++$ )  
    {  
         $A_{21} + B$   
         $A_{31} + B$   
         $A_{41} + B$   
         $A_{51} + B$   
         $A_{22} + B$   
         $A_{32} + B$   
         $A_{42} + B$   
         $A_{52} + B$   
        sum = sum + 10;  
    }

sum = 0  
for( $i=0; i<100; i+5$ )  
    {  
        sum = sum + 10;  
        sum = sum + 10;  
    }

eg.

```
for (i=0; i<100; i++)
```

{

$$a[i] = a[i] + 5;$$

}

↓ loop unrolling

```
for (i=0; i<100; i+2)
```

{

$$a[i] = a[i] + 5;$$

$$a[i+1] = a[i+1] + 5;$$

}

### Loop invariant

- a boolean statement that is true at the start of the loop and at the end of each iteration.

eg.

```
for (i=0; i<n; i++)
```

{

$$x = i + \frac{a}{b};$$

$$y = y + 2;$$

}

$$n = a/b$$

```
for (i=0; i<n; i++)
```

{

$$x = i + n$$

$$y = y + 2;$$

}

### Loop Fusion

- adjacent loops are merged to one loop.

eg.

for( i=0; i<100; i++ )

{

$x[i] = 1;$

}

for( i=0; i<100; i++ )

{

$y[i] = 2;$

}

for( i=0; i<100; i++ )

{

$x[i] = 1;$

$\Rightarrow$

$y[i] = 2;$

}

### Fusion safety

- If a loop independent dependent between statement  $s_1$  and  $s_2$  in loops  $L_1$  and  $L_2$  respectively is fusion preventing if fusing  $L_1$  and  $L_2$  causes the dependence to be carried by the combined loop.
- We should not fuse loops if the fusion will violate ordering of the dependent graph.

eg.

DO I = 1, N

$s_1 : A(I) = B(I) + C$

END DO

DO I = 1, N

$s_2 : D(I) = A(I+1) + E$

END DO

DO I = 1, N

$s_1 : A(I) = B(I) + C$

$s_2 : D(I) = A(I+1) + E$

END DO

fusion

### Loop vectorization

- Loop vectorization, transforms procedural loops by assigning a processing unit to each pair of operands.
- Vectorization can significantly accelerate the large data sets.

eg.

`for(i=0; i<100; i++)`

{

$c[i] = a[i] * b[i];$  vectorized  $c[i:i+3] = a[i:i+3] * b[i:i+3]$

}

`for(i=0; i<100; i=i+4)`

{

- here  $c[i:i+3]$  represents the four array elements from  $c[i]$  to  $c[i+3]$ , i.e  $c_i, c_{i+1}, c_{i+2}, c_{i+3}$

- vector processor can perform four operations for a single vector instruction.

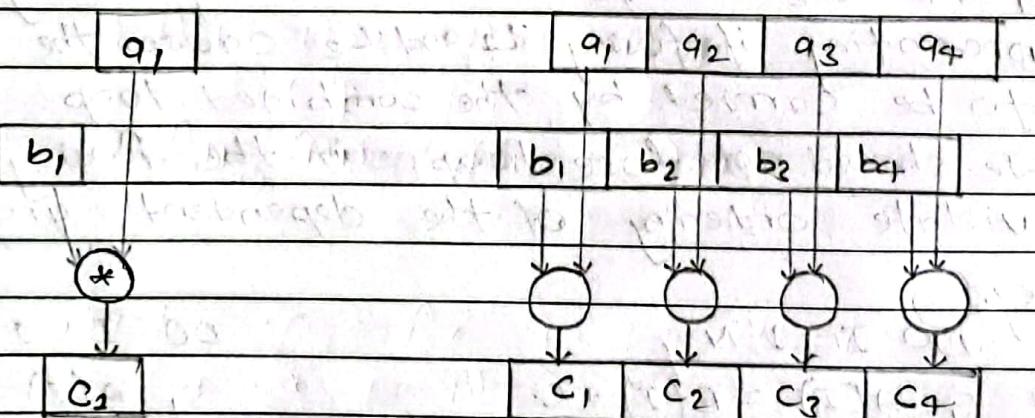


Fig: Scalar Approach

Fig: vector Approach

- loop vectorization attempts to rewrite the loop in order to execute its body using vector instructions.
- Such instructions are commonly referred as SIMD (Single Instruction Multiple Data), where identical operations are performed simultaneously by the hardware.

eg.

$$\begin{array}{l}
 \text{for } (i=1; i \leq N; i++) \\
 \quad A[i] = 2 * B[i] + 1; \\
 \end{array} \xrightarrow{\quad} \begin{array}{l}
 \text{for } (i=1; i \leq N; i++) \\
 \quad A[i:i+3] = 2 * B[i:i+3] + (1,1,1) \\
 \end{array}$$

Fig: Loop vectorization scheme with vector of length 3.

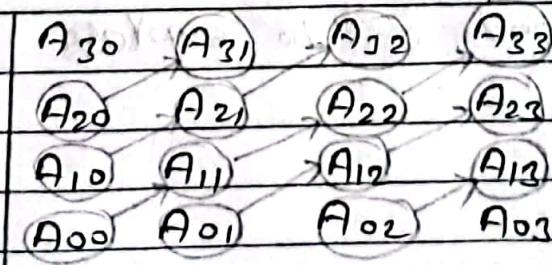
### Loop skewing

- is a transformation that reshapes an iteration space to make it possible to express the existing parallelism with conventional parallel loops.
- changes the shape of the iteration space without changing the dependencies.
- looks like geometrical transformation, which can help to expose a canonical parallelism.

eg.

$$\begin{array}{l}
 \text{for } (i=0; i < N; i++) \\
 \quad \{ \\
 \quad \quad \text{for } (j=0; j < m; j++) \\
 \quad \quad \{ \\
 \quad \quad \quad A[i][j] = A[i-1][j-1]; \\
 \quad \quad \} \\
 \quad \} \\
 \end{array}$$

$\Downarrow$



Iteration space

eg.

DO  $I = 1, N$

DO  $J = 1, N$

$$A[I, J] = A[I-1, J] + A[I, J]$$

END DO

END DO



$$A_{41} \rightarrow A_{42} \rightarrow A_{43} \rightarrow A_{44}$$

$$A_{31} \rightarrow A_{32} \rightarrow A_{33} \rightarrow A_{34}$$

$$A_{21} \rightarrow A_{22} \rightarrow A_{23} \rightarrow A_{24}$$

$$A_{11}, A_{12}, A_{13}, A_{14}$$

- the iteration space for  $\rightarrow [0, N] \times [0, M]$
- $(i, j) = (i' - 1, j' - 1)$
- $P(i, j) = P(i' - 1, j' - 1)$
- i.e  $P = (i - j)$  satisfy the space partition constraint because  $i' - 1 - (j' - 1) = i' - j'$
- the maximum and minimum value that  $P$  can take is  $[-M, N]$
- $i_{\min} - j_{\max} = 0 - M = -M$
- $i_{\max} - j_{\min} = N - 0 = N$
- now the naive code can be expressed as

```

for ( p = -M, p <= N ; p++ )
{
    for ( i = 0 ; i <= N ; i++ )
    {
        for ( j = 0 ; j <= N ; j++ )
        {
            if ( p == i - j )
            {
                A[i][j] = A[i-1][j-1];
            }
        }
    }
}

```

↓ only execute the statement if we are in correct processor.

- now tighten the bound for innermost loop (j)
- since  $p = i - j$ ,  $j = i - p$
- now we get

```

for ( p = -M ; p <= N ; p++ )
{
    for ( i = 0 ; i <= N ; i++ )
    {
        if ( i - p >= 0 && i - p <= M )
        {
            A[i][i-p] = A[i-1][i-p-1];
        }
    }
}

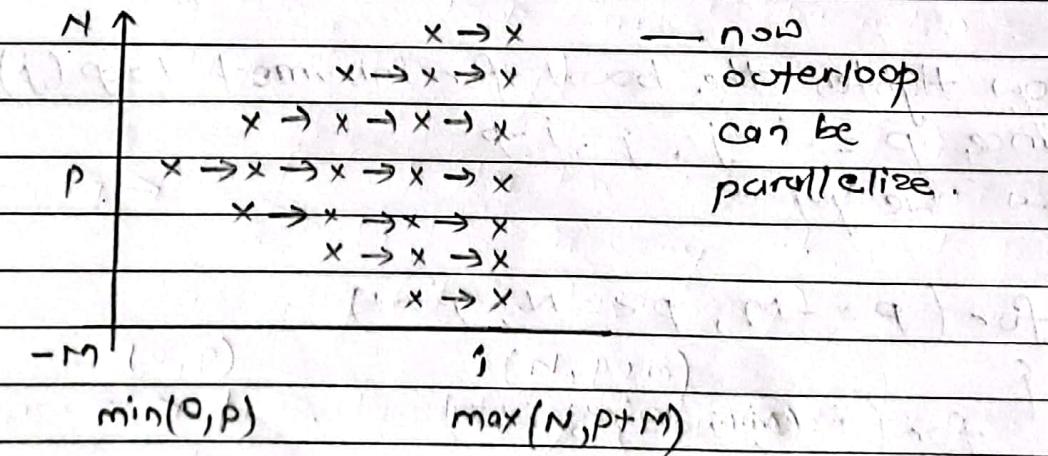
```

- now empty iterations is removed in  $j$  loop.
- there ~~still~~ is still some empty iteration in  $i$  loop.
- since  $i-p \geq 0 \Rightarrow i \geq p$
- $i-p \leq M \Rightarrow i \leq M+p$
- now,

```

for (p = -M; p <= N; p++)
{
    for (i = max(0, p), previous lower bound; i <= min(N, M+p); i++)
        {
            A[i][i-p] = A[i-1][i-p-1]
        }
}
    }
```

- now the iteration space code becomes



- as  $p$  is smaller, less point, as if increases the point is more & more
- somewhere in middle, it becomes very large, then it starts decreasing again.

①  $P = N$        $\max(0, N) = N$

$i \swarrow$

$\min(N, N+n) = N$

②  $P = -M$        $\max(0, -m) = 0$

$i \swarrow$

$\min(N, -m+n)$   
 $(N, 0) = 0$

DO  $I = 1, N$

$S_1 : T = A(I)$

$S_2 : A(I) = B(I)$

$S_3 : B(I) = T$

END DO

### Scalar Expansion

- the programs frequently used scalar temporaries in computation involving arrays.

eg.

DO  $I = 1, N$

$S_1 : T = A(I)$

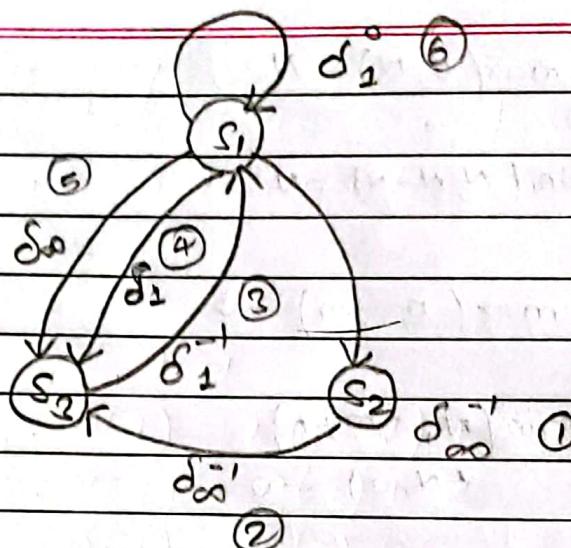
$S_2 : A(I) = B(I)$

$S_3 : B(I) = T$

END DO

} swaps the contents of  
two arrays.

- Let us create the dependence graph for above program.



$\infty \rightarrow$  loop independent

$1 \rightarrow$  loop carried dependency

$-1 \rightarrow$  Anti

$1 \rightarrow$  True

$0 \rightarrow$  Output

Case 1  $\rightarrow$  Loop independent dependency (Anti Dependency)  
due to  $A(I)$

Case 2  $\rightarrow$  Loop independent dependency (Anti dependency)  
due to  $B(I)$

Case 3  $\rightarrow$   $T$  is used in  $s_3$  and again defined in next iteration, so loop carried dependency (true dependency)

Case 4  $\rightarrow$   $s_1$  of first iteration defines  $T$  and  $s_2$  of second iteration is using it, so loop carried dependency (true dependency)

Case 5  $\rightarrow$  true dependency and loop independent due to  $T$ .

Case 6  $\rightarrow$  In 1<sup>st</sup> iteration  $T$  is defined and in second iteration it is again defined so loop carried dependency (output dependency)

- all loop carried dependencies are due to scalar variable  $T$ .
- so use one vector variable instead of a scalar variable.
- i.e if each iteration has a separate location to use as a temporary, these dependencies disappear.

$\text{DO } I = 1, N$

$$S_1 : T^*(I) = A(I)$$

$$S_2 : A(I) = B(I)$$

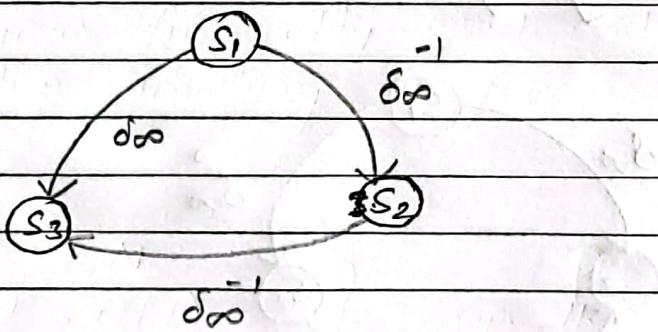
$$S_3 : B(I) = T^*(I)$$

$\text{END DO}$

replacing  $T$  by  $T^*$ , where  
 $T^*$  is compiler generated temporary variable

$T = T^*(N) \rightarrow$  Here  $T$  is original variable of a program and may have some use after this program.

- now the dependency graph becomes



- i.e here is no cycle and no loop dependent dependency.
- so iteration can be parallelized.
- after scalar expansion, the code can be vectorized as,

$$S_1 : T^*(1:N) = A(1:N)$$

$$S_2 : A(1:N) = B(1:N)$$

$$S_3 : B(1:N) = T^*(1:N)$$

$$T = T^*(N)$$

## Array Renaming

- array locations are sometimes reused, creating unnecessary anti-dependencies and output dependencies.

e.g.

$\text{DO } I = 1, N$

$$S_1 : A(I) = A(I-1) + X$$

$$S_2 : Y(I) = A(I) + Z$$

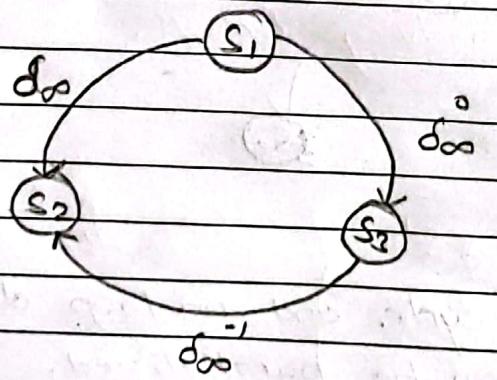
$$S_3 : A(I) = B(I) + C$$

$\text{END DO}$

- here  $A(I)$  is used for two different things within the loop.

- ① the definition in  $S_3$  and  $S_1$
- ② use in  $S_2$ .

- the dependency graph looks like.



- Since  $A(I)$  is redefined in  $S_3$ , it has no relation with  $A(I)$  of  $S_2$ , so break it.

- so let  $A(I)$  is renamed by  $A'(I)$

- now the program becomes,

DO  $I = 1, N$

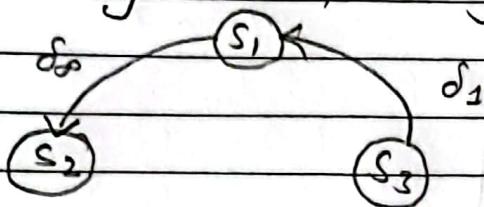
$$S_1 : A(I) = A(I-1) + X$$

$$S_2 : Y(I) = A(I) + Z$$

$$S_3 : A(I) = B(I) + C$$

END DO

- after renaming the dependency graph looks like



- now the program can be vectorized as

$$A(1:N) = B(1:N) + C$$

$$A\$(1:N) = A(0:N-1) + X$$

$$Y(I:1) = A\$(1:N) + Z$$