

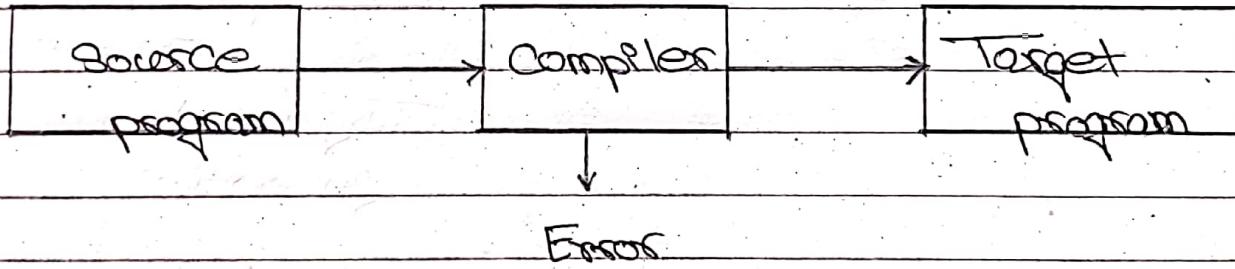
## Unit : 1

# Review of Compiler Structure and Modern Architecture

### \* Review of Compiler:

A compiler is a program that can read a program in one language (source language) and translate it into an equivalent program in another language (target language) as output. The most well known form of a compiler is one that translates a high level language like C into the native assembly language of a D. machine so, that it can be executed.

An important role of the compiler is to report any errors in the source program that it detects during the translation process.



### \* Structure of a Compiler:

The Analysis part breaks up the source program into constituent pieces and impose a grammatical structure on them. It then uses this structure to create an intermediate representation of the source program. If the analysis part detects that the source program is either syntactically or semantically wrong, then it must provide informative messages to user, so that user can take corrective action. The analysis part also

collects the information about the source program & store it in a data structure called a symbol table.

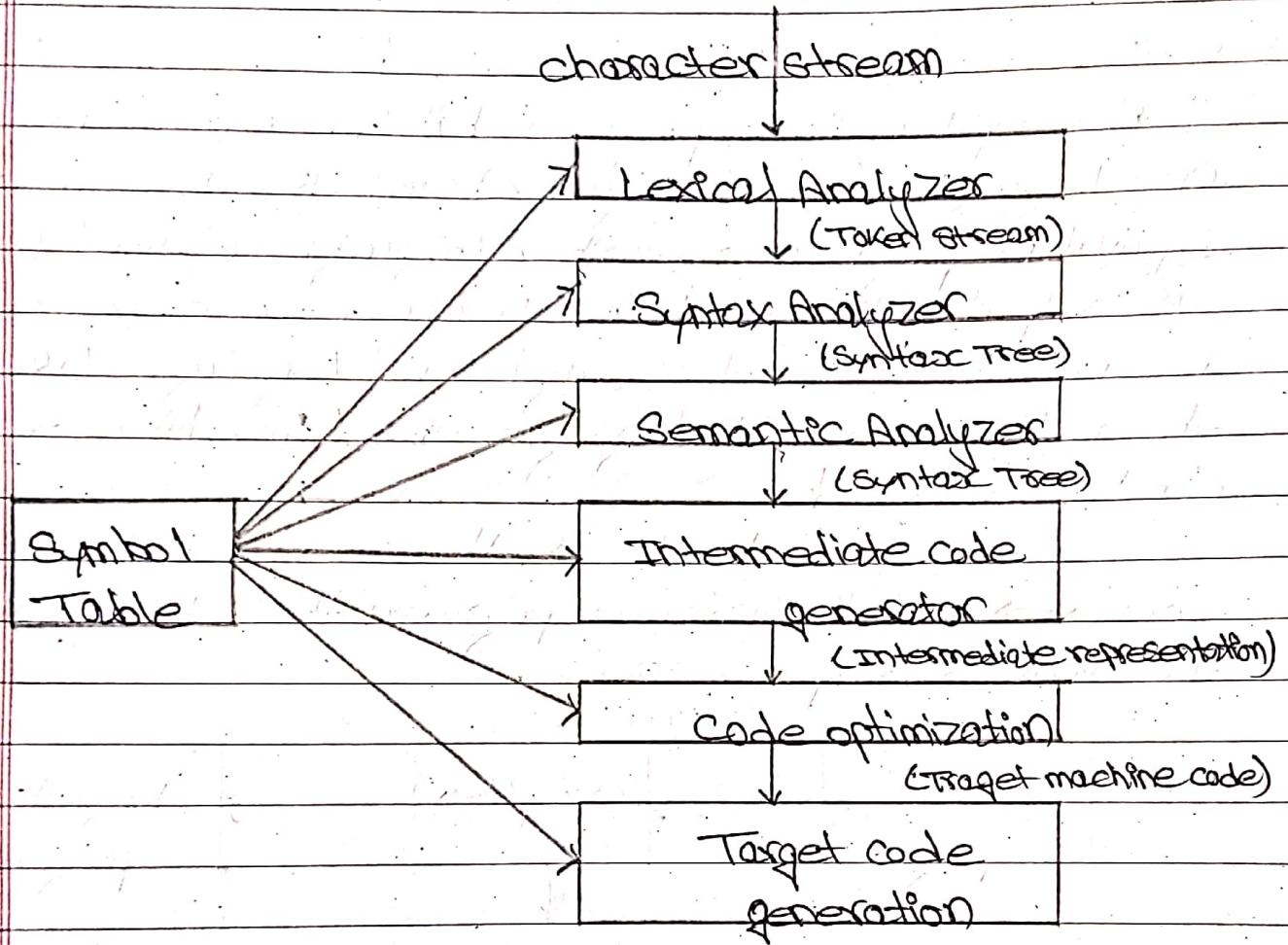


Fig of i- Phases of compiler.

For eg:-

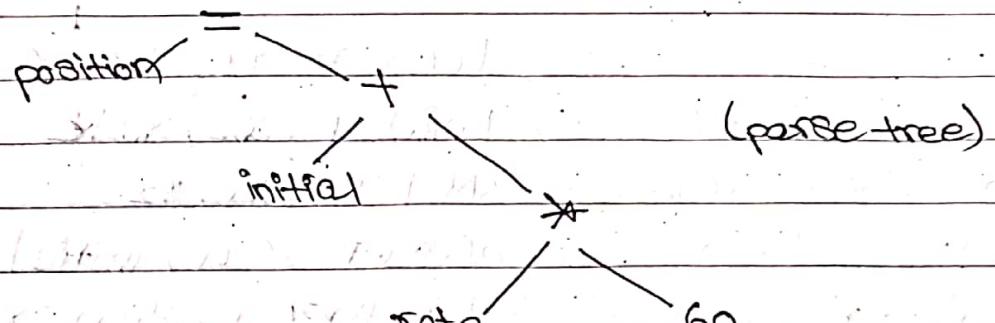
$$\text{Position} = \text{Initial} + \text{rate} \times 60\%.$$

↓  
Lexical Analysis

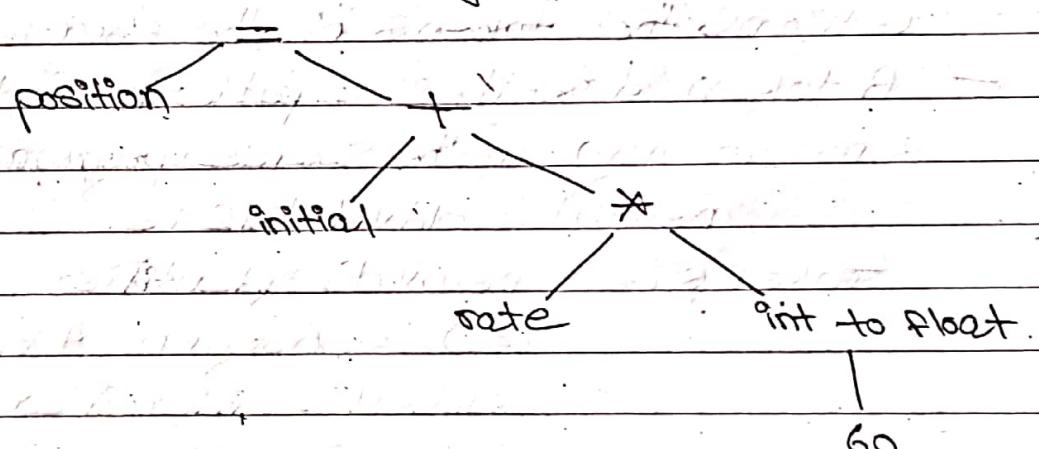
$$\text{Position} = \text{Initial} + \text{range} \times 60$$

(id1) (Assignment (id2) (plus) (id3) (mul) (integer operator) (num))

## Syntax Analysis



## Semantic Analysis



## Intermediate Code Generator

$t_1 = \text{int\_to\_float}(60)$

$t_2 = \text{rate} * t_1$

$t_3 = \text{initial}$

$t_4 = t_2 + t_3$

$\text{Position} = t_4$

## Code optimization

$t_1 = \text{int\_to\_float}(60)$

$t_2 = \text{rate} * t_1$

$\text{Position} = \text{initial} + t_2$



## Target Code Generation

LOAD F r<sub>1</sub>, #60.0

LOAD F r<sub>2</sub>, rate

MUL F r<sub>1</sub>, r<sub>2</sub>

ADD F r<sub>1</sub>, initial

LOAD F Position, r<sub>1</sub>

### 1) Lexical Analysis:

- Lexical Analyzer reads the source program and returns the tokens of the source program.
- A token describes a pattern of characters having some meaning in the source program. For e.g:-  
newval = oldval + 12 i.e.

Tokens:- newval = identifier

(=) = Assignment operator

oldval = identifier

+ = add operator

12 = a number.

- Token, patterns, lexemes
- Patterns is the rule to define the validity of a token
- Valid tokens are lexemes.

e.g:- int 1 a



token



lexemes

token



not lexemes.

- Puts information about identifier into the symbol-table.
- In lexical analysis regular expression is used to define the patterns of lexeme.
  - 1) alphabet,
  - 2) string,
  - 3) Kleene closure ( $A^* \rightarrow \epsilon$ )
  - 4) Positive closure ( $A^+ \rightarrow A^* - \{\epsilon\}$ )
- A deterministic Finite state Automaton can be used in the implementation of a lexical Analyzer.

### \* Recognition of tokens:

- DFA (have single choice of transition move i.e. )
- NFA (have multiple choice of transition move i.e. )

### \* DFA (Deterministic Finite Automata)

Formally, it can be defined as

$$M = (\Omega, \Sigma, q_0, \delta, F)$$
 where,

$\Omega$  = finite set of states,

$\Sigma$  = finite set of input alphabet,

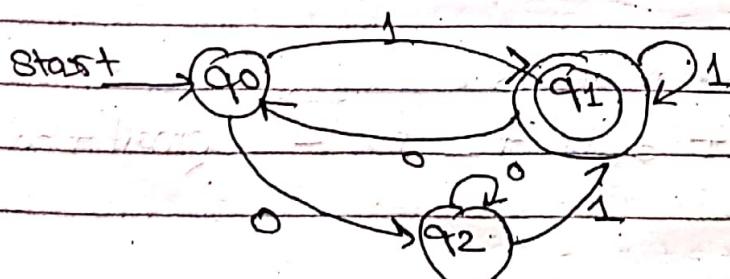
$q_0$  = starting symbol

$\delta$  = Transition function  $\delta: \Omega \times \Sigma \rightarrow \Omega$

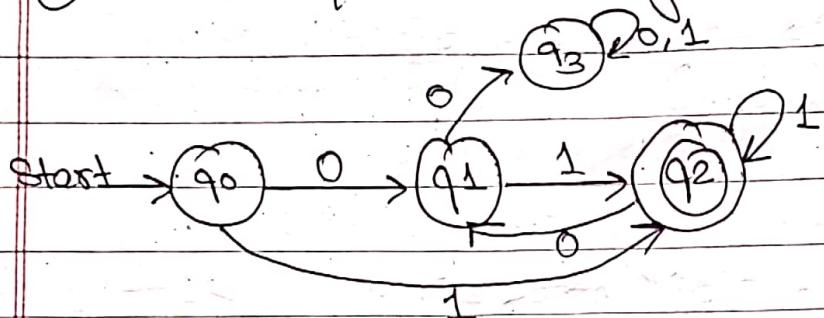
$$\delta_{NFA}: \Omega \times \Sigma \rightarrow \{ \emptyset, \Omega \}$$

$F$  = finite set of final states

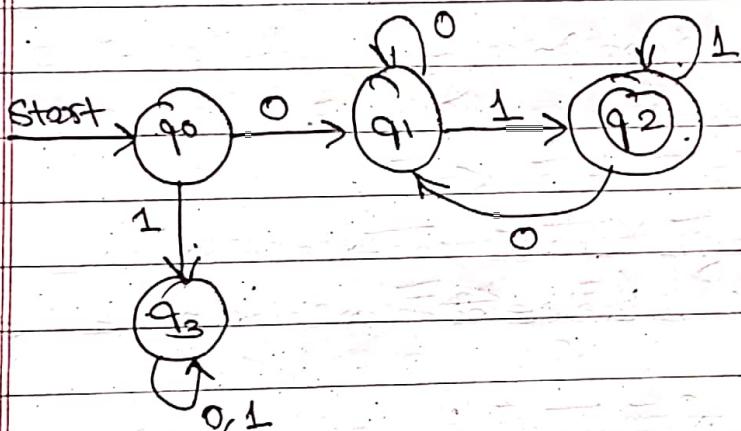
example:  $(0+1)^* 1$



Q) 0 is always followed by 1 :



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



### \* Regular Expression :

A regular expression is basically a shorthand way of showing how a regular language is built from the base set of regular languages.

i.e for each regular expression E, there is a regular language L(E).

for e.g:-

Alpha  $\rightarrow \alpha - \bar{z}, A - Z$

digit  $\rightarrow 0, 1, 2, 3, \dots, 9$

Q) R-E for Gmail or hotmail id:

= [Alpha] [Alpha + digit + \_ + .] \* [gmail + hotmail].com

## 2) Syntax Analysis:

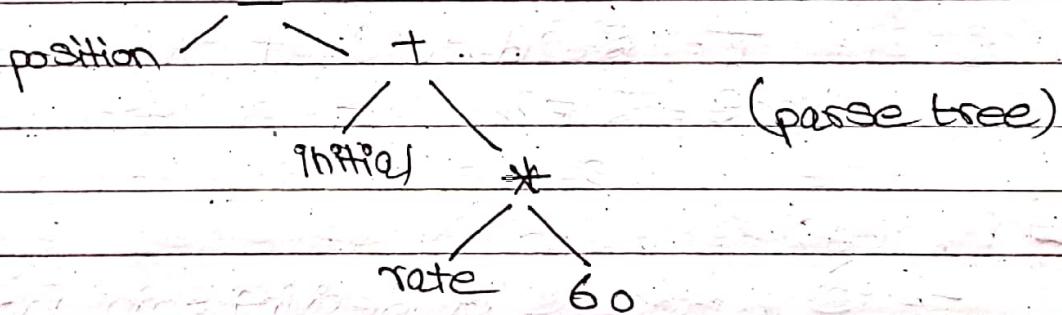
- The ~~2~~ Second phase of the Compiler is Syntax Analysis or parsing.
- The Syntax Analysis (parser) uses the tokens produced by the lexical analyzer to create a tree-like intermediate representation (parse tree) of the given program.
- It helps to check the grammatical pattern of a language.
- CFG (Context free Grammar) is used for Syntax definition.

for e.g:-

① Lexical Analysis:- Position = Initial + range \* 60

(id 1) (ass-op) (i-de) (plus) (id 3) (mul) (int-num)

### Syntax Analysis



- \* Note : ① In parse tree, interior node represents the operations (non-terminals)  
 ② The children of the node represent the arguments (terminals) of the operations.

## \* CFG (Context free Grammar):

Formally, it can be defined by  $(V, T, P, S)$   
where,

$V \rightarrow$  Set of variables (Non-Terminals)

$T \rightarrow$  Set of Terminals,

$P \rightarrow$  Set of production rule,

$S \rightarrow$  Starting variables,

e.g:- let the Grammar be:

$$E \rightarrow E + T \mid T$$

$$T \rightarrow T * F \mid F$$

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

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

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

$S = \{E\}$

## \* Parsing:

It is a process of deriving string from a given grammar (i.e checking the grammar of the string).

Types: ① Top down parser,  
② Bottom up parser.

## \* Left Recursive Grammars:

A grammar having the production of the form :

$$A \rightarrow A \alpha + B$$

Can be removed by :

$$A \rightarrow B A'$$

$$A' \rightarrow \alpha A' | \epsilon$$

① For example :

$$B \rightarrow B \underbrace{ab}_{\alpha} | \underbrace{o}_{P} | \underbrace{1}_{Q}$$

now, Removing left Recursion :

$$B \rightarrow o B' | 1 B'$$

$$B' \rightarrow ab B' | \epsilon$$

Example ② :

$$E \rightarrow E + T | E * T | (E) | id$$

$$E \rightarrow (E) E' | id E'$$

$$E' \rightarrow + T E' | * T E' | \epsilon$$

Example ③ :

$$E \rightarrow E + T | T$$

Removing left Recursion

$$E \rightarrow T E'$$

$$E' \rightarrow + T E' | \epsilon$$

### 3) Semantic Analysis:

- The Semantic Analyzer uses the Syntax tree and the information in the symbol table to check the source program for semantic consistency with the language definition.
  - It checks the semantic meaning of a programming language.
  - An important part of semantic analysis is Type checking i.e. checking whether each operator has matching operands.
  - Implicit / Explicit type conversion.

For example:

①  $A \rightarrow B + C$  SA-type == B-type == C-type

②  $s_1 \Rightarrow \text{if } (\text{boolean}) \quad s_1 \text{ if boolean} == \text{true}: \\ x = ct_b \quad \text{then, } s_1 \cdot \text{type} = x \cdot \text{type} \\ \text{else} \quad \text{else, } s_1 \cdot \text{type} = y \cdot \text{type}$

③ if (test)  $S_1 = A + B$       if test == true  
           else  $C - D$        $S_1\text{-type} = A\text{-type}$   
                                   else,  $S_1\text{-type} = C\text{-type}$

e.g:-

① int x;  
char q;  
float b;

x = atb;

② const int z;

z = atb;

- No syntax errors
- Semantic errors.

- No syntax error

- but Semantically wrong

### \* Synthesized and Inherited Attributes:

- If the type of attribute depends upon the child, then it is called synthesized attribute.

For e.g.: C = atb

- If the type of attribute depends on either parents or siblings, then it is called inherited attributes;

e.g:- int a, b, c.

### \* Importance of optimization:

- Using a non-optimizing will usually result a non-efficient code when compare to more sophisticated compilers.

① For 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-cycle)

ADD a, b, c

ADD c, 1, d

#Non-optimized

Fig 3: optimized SPARC code  
(2 cycle)

# optimized.

- In above Example, the non-optimized SPARC code uses 7 instructions 5 of which are memory access instructions.
- The optimized code is more efficient and uses only 2 instruction in total.
- In terms of run-time improvement, the non-optimized code takes 7 cycles & the optimized code only 2 cycles.

## \* Structure of optimizing Compiler:

A Compiler designed to produce fast object code includes optimizer components.

These are mainly two models:

- i) Source code is translated to a low level code and all the optimization is done on that form of code, we call this the low level model of optimization.
- ii) Source code is translated into intermediate code & optimization is performed, then low level code is produced, and further optimization is done, called mixed model of optimization.

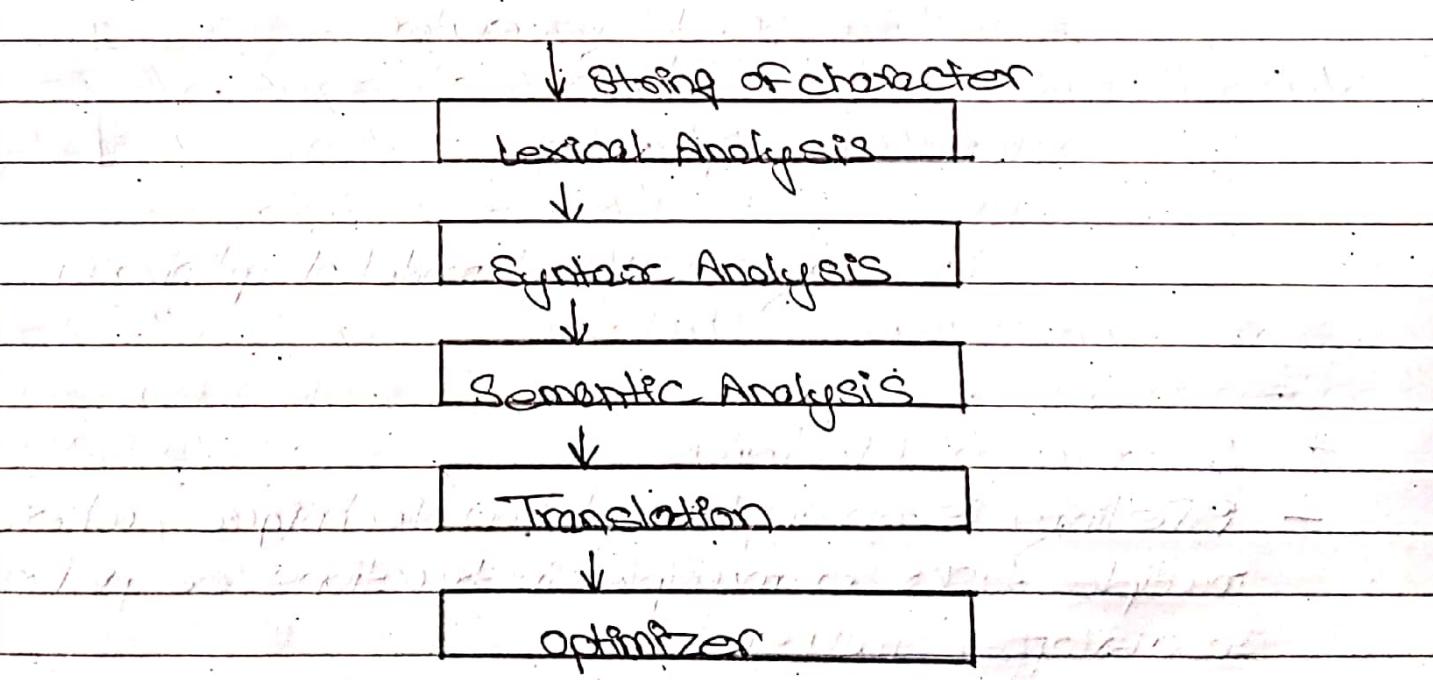


Fig 1 :- Low-Level model

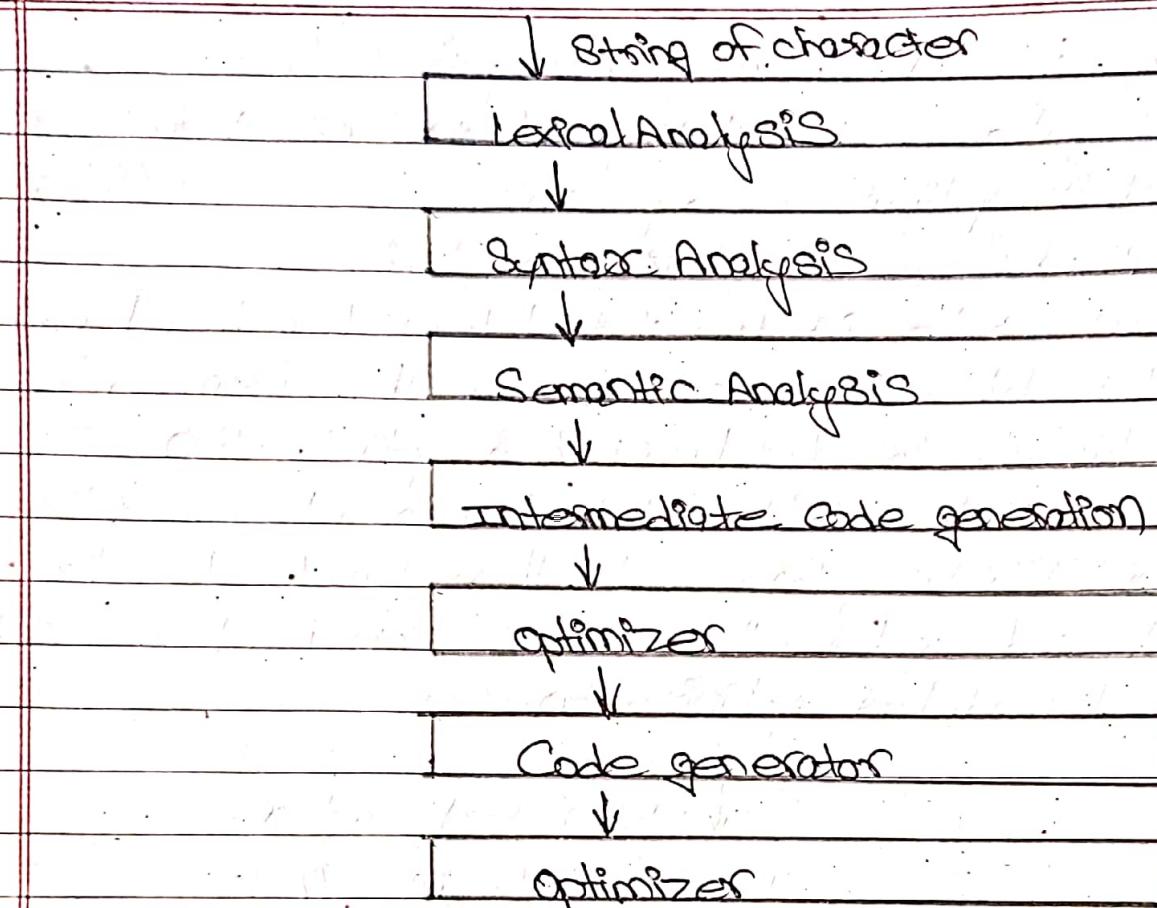


Fig 2 :- Mixed model of optimization.

### \* Instruction Pipelining :

- Pipelining is an implementation technique, where multiple tasks or multiple instructions are performed in overlapped manner,
- It can be implemented when a task is divided into two or more independent sub-tasks.
- Pipelining is the key implementation technique used to make the CPU fast.
- For example : Consider a scenario, where A, B & C each have dirty clothes to be washed. The washing process has three stages : washing, drying &

folding and Each Stages takes 30 minutes to complete.

- unpipelined technique  $\rightarrow$  4-5 hrs
- Pipelined technique  $\rightarrow$  2-3 hrs.

### \* Pipeline Hazards:

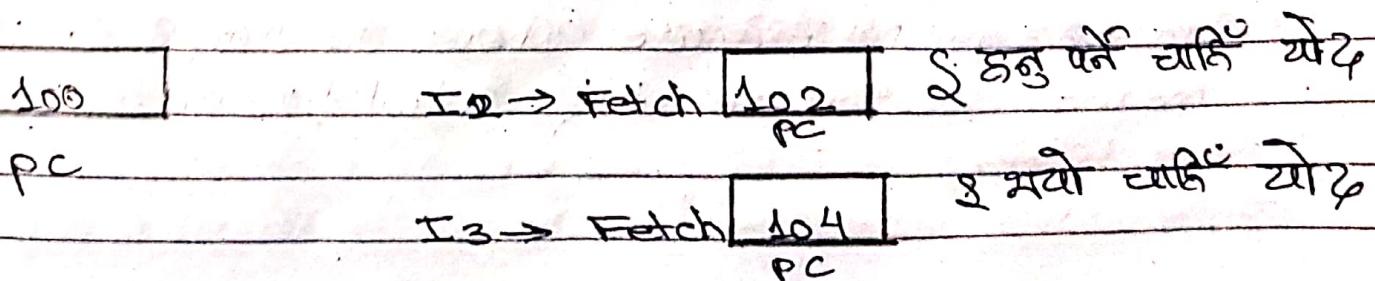
- The condition or situation which does not allow the pipeline to operate normally.
- Reduces the performances,
- Types of Hazard:
  - i) Control Hazard
  - ii) Data Hazard
  - iii) Structural Hazard

#### i) Control Hazard:

- All instructions that change the program Counter leads to the control hazards.
- When to make a decision based on the results of one instruction while other are executing.
- Control (Branch, Jump, Call/Return) changes the value of PC.

E.g:-

	I <sub>1</sub>	$\rightarrow 100$	Note: Let, initial PC = 100
	I <sub>2</sub>	$\rightarrow 102$	next instruction to be executed
	I <sub>3</sub>	$\rightarrow 104$	is I <sub>2</sub> which is in 102 M-L but
	I <sub>4</sub>	$\rightarrow 106$	Any instruction that made PC to
	:		read 104 (instruction like Branch, Jump, Call/Return) Control Hazard occurs
	I <sub>5</sub>		



- The amount of the data path that a signal travels through in one cycle is called a stage of the pipeline.
- Consider, the following 5 stage pipeline.

Clock cycles →

Instruction	1	2	3	4	5	6	7	8	9
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		

where, IF : Instruction Fetch

ID : Instruction decode

EX : Execute

MEM : Memory Access

WB : Write Back

\* For example:- Control Hazard

I<sub>1</sub>: BNEZ R<sub>1</sub>, 200 (BNEZ = Branch if not  
equal to zero)

goto 200

Jump 200 Memory location

I<sub>1</sub>: IF ID EX MEM WBI<sub>2</sub>: IF ID EX MEM WB XI<sub>3</sub>: . . . IF ID EX MEM WB XI<sub>2</sub> & I<sub>3</sub> will not execute where, I<sub>1</sub> jumps to 200  
Memory location resetting control hazard.

## ii) Data Hazard :

- When an instruction depends on the result of a previous instruction; but this result is not yet available.
- Multiple Instruction using same resources.
- Data hazard types : ① RAW (Read After Write)
- ② WAR (Write After Read)
- ③ WAW (Write After Write)

- For example : ① RAW

$$I_1: R_2^W = R_2 + R_3$$

$$I_2: R_5 = R_2 + R_4$$

I1 : IF ID EX NEM / WB

I2 : IF ID EX NEM WB

$R_2$  (Old value)

$R_2$  (New value)

We would compute the wrong answer because I2 reads the old value of  $R_2$ .

## ② WAR :

$$a = b + c \quad (b \rightarrow \text{old value})$$

$$b = c + d \rightarrow (b \rightarrow \text{new value})$$

## ③ WAW :

$$a = b + c$$

$$a = c + d$$

## \* Solution to Data Hazards :

- Forwarding or Bypassing,
- Instruction Scheduling.

### i) Forwarding or Bypassing:

- use special hardware to detect a conflict and then avoid it by routing the data through the special paths between the pipeline segments.
- example: instead of transferring ALU result into a destination register, the hardware checks the destination, if it is needed as a source in the next instruction, it passes the result directly into ALU input - bypassing register.
- It requires additional hardware paths as well as circuits that detects conflicts.

### ii) Instruction Scheduling:

- Compiler attempts to schedule code to fill delay slots.

### iii) Structural Hazard:

- If hardware cannot support the combination of instructions that we want to execute in the same clock cycle, structural hazard occurs.
- A structural hazard occurs when a part of the resources is needed by two or more instructions at a time.
- Solution to structural hazard can be resource duplication.

- for example:

I1 :	IF	ID	EX	MEM	WB
I2 :	IF	ID	EX	MEM	WB
I3 :	IF	ID	EX	MEM	WB
I4 :	IF	ID	EX	MEM	WB

### \* Multiple Issue Processor:

- A processor that can sustain more than one instruction per cycle.
- Different hardware and software techniques have been used to realize ILP (Instruction Level Parallelism)
- CPI = 1 (cycle per instruction = 1) i.e. 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 per cycle, CPI =  $\frac{1}{2} = 0.5 < 1$
- Issuing N instructions per clock cycle reduces the Ideal-CPI term to  $1/N$ .
- If M is the maximum numbers of instructions that can be issued in one cycle, then the processor is m-wide.

### \* Types of multiple issue processors:

Two Variation : ① Superscalar processor  
 ② The VLIW processor

## ① Superscalar processor:

- It refers to the machine that is designed to improve the performance of the execution of scalar instruction.
  - Issues variable number of instructions per clock.
  - i.e. a Superscalar processor is a CPU that performs a form of parallelism.
- e.g:-

I1 : IF ID EX MEM WB

I2 : IF ID EX MEM WB

I3 : IF ID EX MEM WB

## ② VLIW processors:

- It issues a single very long instruction per clock that contains a large number of real instructions.
- The Compiler or programs control the parallel execution of the instructions.
- This increases compiler complexity but decreases hardware complexity.

## \* Processor Parallelism :

- Creating powerful computers simply by connecting many existing smaller ones is called processor parallelism.
- Multiple processors working cooperatively on problems.

## Goals :

- Performance, (increases comparison to uniprocessor)
- Cost Efficiency, (build big system with small parts)

- Scalability, (Just add more processors to get more performance)
- Fault tolerance. (One processor fails you still can continue processing).

**Types:**

### i) Synchronous process of parallelism:

- This strategy replicates whole processors, with each processor executing the same program on different parts of the data space.

### ii) Asynchronous Process of Parallelism:

- This strategy replicates whole processors, but allows each processor to execute different programs or different parts of the same program.
- On these machines, if synchronization between processors is required, it must be explicitly specified.

## #2 Semantic Analysis:

### \* Syntax directed Translation:

- Defining the Semantics action along with production rules.
- example:

Production rule:

$$E \rightarrow E + T$$

$$E \rightarrow E - T$$

$$E \rightarrow T$$

$$T \rightarrow 0$$

$$T \rightarrow 1$$

:

$$T \rightarrow 9$$

Semantic Action

$$E\text{-Val} = E\text{-Val} || T\text{-Val} || "+"$$

$$E\text{-Val} = E\text{-Val} || T\text{-Val} || "-"$$

$$E\text{-Val} = T\text{-Val}$$

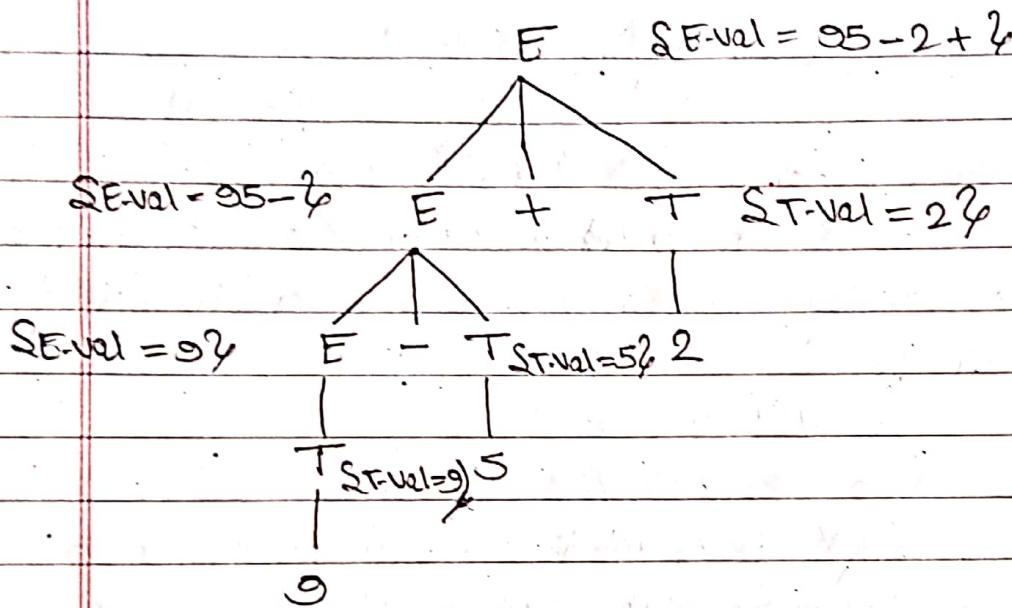
$$T\text{-Val} = "0"$$

$$T\text{-Val} = "1"$$

:

$$T\text{-Val} = "9"$$

for example:  $9 - 5 + 2$



## Unit : 2

# Dependence Analysis and Testing

### \* Dependence and it's properties:

- For a given Sequential program, a collection of statement-to-statement execution ordering that can be used as a guide to select and apply transformations; that preserve the meaning of the program.
- Each pair of statements in the graphs is called a dependence.
- Dependency represents two kinds of constraints
  - ① Data dependence,
  - ② Control dependence.

### ① Data Dependence:

- Ensure that data is produced and consumed in correct order.

e.g:-  $S_1 : PI = 3.14$

$S_2 : R = 5.0$

$S_3 : Area = PI * R * R$

- $S_3$  cannot be moved before either  $S_1$  or  $S_2$  without compromising correct results.
- To prevent this we will construct data dependencies from  $S_1$  &  $S_2$  to  $S_3$ .
- No execution constraint between  $S_1$  &  $S_2$  because  $S_{S_1}, S_2, S_3$ , OR  $S_{S_2}, S_1, S_3$ , gives same result.

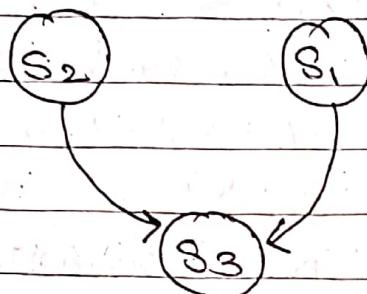


Fig:- Dependency in graph

example ② :

$$S_1 : a = 3.14$$

$$S_2 : b = 5.0$$

$$S_3 : c = a * b * b$$

$$S_4 : y = a * c$$

$$S_5 : \pi = a$$

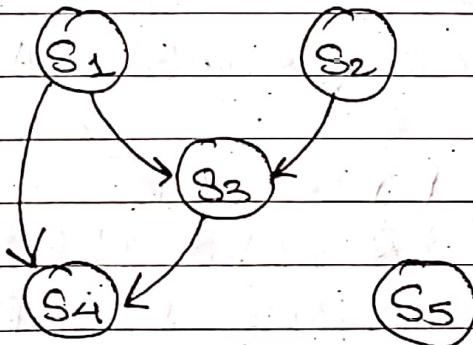


Fig of :- Dependency in graph

## ② Control Dependence :

- Dependence due to control flow,

- e.g:-  $S_1 : \text{IF } (T == 0.0) \text{ goto } S_3$

$$S_2 : A = A / T$$

$S_3 : \text{CONTINUE}$

- here,  $S_2$  cannot be executed before  $S_1$ .

- executing  $S_2$  before  $S_1$  could cause divide by zero.

### \* Load-Store classification:

#### i) True dependency:

- The first statement stores into a location that is later read by the second statement.
- e.g:-

$S_1 : x = \dots$

$S_2 : \dots = x$

- denoted by  $S_1 \circ S_2$ .
- The dependence ensures that the second statement receives the value computed by the first. It is also known as a flow dependence.

#### ii) Anti-dependence:

- The first statement reads from a location into which the second statement later stores.
- for e.g:  $S_1 : \dots = x$
- $S_2 : \dots = x$
- $S_2$  depends on  $S_1$  is denoted by  $S_1 \circ^{-1} S_2$ .

#### iii) Output Dependence: (WAW hazard)

- Both statements write into the same location.
- e.g:-  $S_1 : x = \dots$       e.g:  $S_1 : x = 1$
- $S_2 : x = \dots$        $S_2 : \dots$
- $S_3 : x = 2$
- $S_4 : w = x + y$
- $S_2$  depends on  $S_1$  is denoted by  $S_1 \circ^o S_2$ .

\* ex:- Find the dependency between  $S_1, S_2$  and  $S_3$

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

    for ( $j = 1; j \leq n; j++$ )

$$S_1: \quad C[i,j] = A[i,j] + Y[i,j]$$

$$S_2: \quad Y[i,j] = C[i,j] + X[i,j]$$

$$S_3: \quad X[i,j] = Y[i,j] + Z[i,j]$$

$S_1, S_2$  = True and Anti dependence.

$S_2, S_3$  = True and Anti dependence

$S_1, S_3$  = Output Dependence.

### \* Dependence in Loops:

- Let us look at two different loops.

Do  $I = 1, N$

$$S_1: \quad A(I+1) = A(I) + B(I)$$

END DO

Fig(1)

Do  $I = 1, N$

$$S_1: \quad A(I+2) = A(I) + B(I)$$

END DO

Fig (2)

- In both cases, statement  $S_1$  depends on itself

- However, there is a significant difference:

In fig(1), depend on previous statement & in fig(2), depend on two previous statements.

### \* Iteration Number:

For an arbitrary loop in which the loop index  $I$  runs from  $L$  to  $U$  in steps of  $S$ , the iteration number  $i$  on a specific iteration is equal to the value  $\frac{(I-L+1)}{S}$ , where  $I$  is the value of the index on that iteration.

e.g:-  $\text{DO } I=0, 10, 2 \rightarrow (L, U, S)$

$S_1 < \text{Some Statement} >$

$\text{END DO}$

i.e. for  $I = 5$ ,  $i = \frac{(I-L+1)}{S}$

$$\text{Iteration number} = \frac{(5-0+1)}{2}$$

$$= 3$$

### \* 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 of nesting level  $k$ . Note: The iteration vector

e.g:-  $\text{DO } I=1, 2$

$S_1 [(2,1)]$ , denotes the instance of  $S_1$  executed

$\text{DO } J=1, 2$

$S_1 < \text{Some statements} >$  during the 2nd iteration

$\text{END DO}$

of 2nd loop of 1st iteration of  $J$  loop.

$\text{END DO}$

## \* Iteration Space:

- The set of all possible iteration vectors for a statement.

- e.g.  $\text{DO } I = 1, 2$

$S_1 < \text{Some statements} >$

$\text{END DO}$

$\text{END DO}$

- here, the iteration space for  $S_1$  is

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

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

## \* Formal definition of 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 exists two iteration vectors  $i$  and  $j$  for the nest, such that

- i)  $i < j$  or  $i = j$  and there is a path from  $S_1$  to  $S_2$  in the body of the loop,
- ii) Statement  $S_1$  accesses memory location  $M$  on iteration  $i$  and statement  $S_2$  accesses location  $M$  on iteration  $j$ , and
- iii) One of these accesses is write.

## \* Transformations:

- A Transformation is safe if the transformed program has the same meaning as the original program.
- Two Computations are equivalent if, on the same inputs, they produce the same outputs in the same order.

## # Reordering Transformation:

- A transformation that changes the order of execution of the code, without adding or deleting any execution of any statement.
- A reordering transformation preserves a dependence if it preserves the relative execution order of the source and sink of that dependence.

## \* Theorem of Dependence:

Statement:

- Any reordering transformation that preserves every dependence in a program preserve the meaning of that program.

## Proof (By Contradiction):

- Assume the program be loop free and control free.
- Let  $s, s_1, s_2, \dots, s_n$  be the execution order in the original program.
- $s_{i_1}, i_2, \dots, i_m$  be the permutation of the statements.

- Assume that dependence is preserved but the meaning changes.
- i.e. Some output statement produces a different result from the corresponding output statement in the original program.
- Let,  $S_K$  be the first statement in the new order that produces an incorrect output.
- because the statement is exactly the same as the statement in the original program, it must have found an incorrect value in one of its input memory locations.
- 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 incorrect input in a specific location  $M$ .

### Case i:

A statement  $S_m$  that originally stored its result into  $M$  before it was read by  $S_K$ , now stores into  $M$  after it is read by  $S_K$  (i.e.,  $S_K$  reads old value).

i.e., reordering fail to preserve true dependence ( $S_m \rightarrow S_K$ )

### Case ii:

A statement  $S_m$  that originally stored into  $M$  after it was read by  $S_K$ , now writes  $M$  before  $S_K$  reads it (i.e.  $S_K$  reads new value).

i.e., reordering fail to preserve anti-dependence  
 $(S_m S^{-1} S_K)$

### Case ii:

Two ~~depende~~ statements that both write into M before it is read by SK, causing the wrong value to be left in M.

i.e., reordering failed to preserve output dependence

Hence, it exhausts the way that SK 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 to statement  $S_2$  on iteration  $j$ ; then the distance vector  $d(i,j)$  is defined as the vector of length  $n$  such that  $d(i,j)_k = i_k - j_k$

### \* Direction Vector:

Suppose that there is a dependence from statement  $S_1$  on iteration  $i$  to statement  $S_2$  on iteration  $j$ , then the direction vector  $\delta(i,j)$  is defined as,

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

for eg:-

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

S

for ( $j=1$ ;  $j \leq 100$ ;  $j++$ )

S

for ( $k=1$ ;  $k \leq 100$ ;  $k++$ )

S

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

$\downarrow$

$\downarrow$

Sink

$\downarrow$

source

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

$$\textcircled{1} \quad \text{distance vector} = \{3+1, 8, 5\} - \{3, 8, 5+1\}$$

$$(\text{sink} - \text{source}) = \{4, 8, 5\} - \{3, 8, 6\}$$

$$\textcircled{2} \quad \text{direction vector} = \{2\}$$

**Note:** For correct meaning & dependence, first place is always  $\leq$ .

\* E.g. 2: Complete distance and direction vector at iteration  $\{1, 1, 1\}$ , for following program.

DO I = 1, N

DO J = 1, M

DO K = 1, L

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

END DO

END DO

END DO

① Distance vector = sink - source

$$= (1+1, 1, 1) - (1, 1, 1)$$

$$= (2, 1, 1) - (1, 1, 1)$$

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

② Direction vector = ( $<, =, =$ )

### \* Loop Carried Dependence:

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

e.g:- DO I = 1, N

$$S_1 : A(I+1) = F(I)$$

$$S_2 : F(I+1) = A(I)$$

END DO

i.e. I = 1

I<sub>2</sub> = 2

$$A_2 = F_1$$

$$A_3 = F_2$$

$$F_2 = A_1$$

$$F_3 = A_2$$

### \* Loop independent dependence:

- Dependence exists within an iteration

- i.e. if the loop is removed, the dependence still exists. e.g:- DO I = 1, 10

$$S_1 : A(I) =$$

$$S_2 : \dots = A(I)$$

END DO

\* Find the type of dependence in following loop:

eg:-

DO : I = 1, 9

S<sub>1</sub> : A(I) = --

S<sub>2</sub> : -- = A(10-I)

END DO.

On the fifth iteration of loop, statement S<sub>1</sub> stores into A(5) while statement S<sub>2</sub> fetches from A(5).

Therefore, the dependence is loop-independent.

eg:- for (i = 1; i < n; i++)

$\Sigma$

S<sub>1</sub> : A[i] = A[i-1] + 1; (S<sub>1</sub> is loop carried dependency)

S<sub>2</sub> : B[i] = A[i]; (S<sub>2</sub> is loop independent)

$\Sigma$

i.e., for S<sub>1</sub>:

I = 1

I<sub>2</sub> = 2

I = 3

A[1] = A[0] + 1

A[2] = A[1] + 1

A[3] = A[2] + 1

↖

↗

i.e. Loop-carried dependent.

For S<sub>2</sub>:

B[i] = A[i]

i = 1

B[1] = A[1]

i.e., the value of B[i] is directly dependent on value of A[i].  
Therefore, it is loop independent.

## \* Parallelization:

- It is valid to convert a Sequential loop to a parallel loop if the loop carries no dependence.
- for e.g.:  $A[0] = 1$

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

S

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

$$A_1 = A_1 + A_0$$

$$A_2 = A_2 + A_1$$

$$A_3 = A_3 + A_2$$

parallel X

dependence ✓

e.g. 2:  $A[0] = 1$

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

S

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

$$A[1] = A[1] + A[0];$$

$$A[3] = A[3] + A[2];$$

$$A[5] = A[5] + A[4];$$

parallel ✓

dependence X

## \* Dependence Testing:

- It is a method used to determine whether dependences exist between two subscripted references to the same array in a loop nest.

### General problem:

Do  $i_1 = l_1, u_1$

Do  $i_2 = l_2, u_2$

Do  $i_n = l_n, u_n$

$s_1 : A(f_1(i_1, \dots, i_n), \dots, f_m(i_1, \dots, i_n)) = \dots$

$s_2 : g_1(i_1, \dots, i_n) = A(g_1(i_1, \dots, i_n), \dots, g_m(i_1, \dots, i_n))$

END DO

END DO.

here, dependence exists if

$$f(\alpha) = g(\beta) \text{ where, } \alpha \text{ & } \beta \text{ are iteration vector}$$

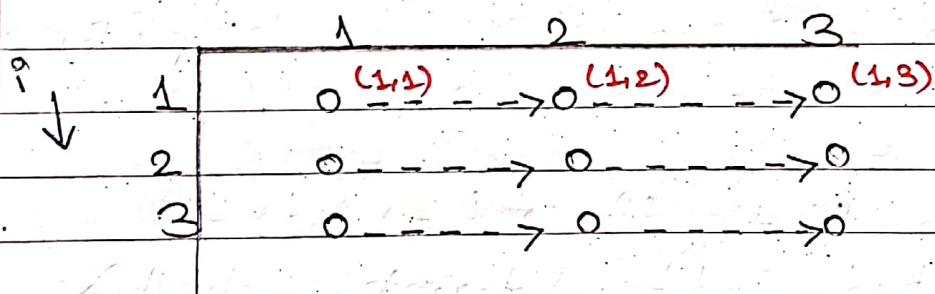
### \* Iteration Space Traversal Graph (ISTG):

- 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.
- For e.g:

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

for ( $j=1; j \leq 4; j++$ )

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



### \* GCD Test:

- We can use linear diophantine equation and GCD test to find the dependency on loop.
- Diophantine equation is a polynomial equation, usually involving two or more unknowns, such that the only solutions of interest are the integers ones.
- e.g:-  $Ax + By = c$ , where  $A, B, C$  are integers.
- If  $\text{GCD}(A, B)$  divides  $C$ , then dependency exists

and in that case the loop is not parallelizable.  
e.g:- Solving diophantine equation.

$$70x + 112y = 168$$

Step 1:

$$\text{GCD}(70, 112) = ?$$

$$\begin{array}{r} 70 \\ ) 112 \quad (1 \\ - 70 \\ \hline 42 \end{array}$$

$$\begin{array}{r} 42 \\ ) 70 \quad (1 \\ - 42 \\ \hline 28 \end{array}$$

$$\begin{array}{r} 28 \\ ) 42 \quad (1 \\ - 28 \\ \hline 14 \end{array}$$

$$\begin{array}{r} 14 \\ ) 28 \quad (1 \\ - 28 \\ \hline 0 \end{array}$$

$$\begin{array}{r} 0 \\ ) 14 \quad (1 \\ - 14 \\ \hline 0 \end{array}$$

Step 2: Find the value of  $x$  &  $y$

Reverse-method:

$$14 = 42 - 28$$

$$= 42 - (70 - 42) \quad (\because 42 = 70 - 42)$$

$$= 2(42) - 70$$

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

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

Multiply both side by 12:

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

$$\therefore x = 24$$

$$y = -36$$

\* eq-1: Find the dependency in following Loop:

Do  $i = i, N$

$$A(4\underset{x}{i}) = \dots = A(2\underset{y}{i} + 2)$$

END Do.

Sol-

$$4x = 2y + 2$$

$$\text{or, } 4x - 2y = 2$$

\* For which iteration dependency exists?

$$x=2, y = \frac{4 \times 2 - 2}{2}$$

$$= 3$$

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

$(x=2, y=3)$  dependency exists

Since, 2 divides 2, there exists dependency in the loop, hence the loop is not parallelizable.

\* eq-2: Find whether the dependency will exist in following loop or not & find the iteration vector.

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

S

$$A(3x + 20) = \dots = A[2x]$$

?

$$\text{Sol: } 3x + 20 = 2y$$

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

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

$$\text{Let, } x=2 \text{ then } y = \frac{3 \times 2 + 20}{2} = 13$$

Iteration vector =  $(x=2, y=13)$  whose dependency exists.

\* eg:- Find the dependence in following cases:

Case 1 :-

DO I = 1, N

DO J = 1, N

A(2I + 2J) = - - -

- - - = A(4I - 6J + 3)

END DO

END DO

$$\text{Sol:- } 2a + 2b = 4c - 6d + 3$$

$$2a + 2b - 4c + 6d = 3$$

$$\text{GCD}(2, 2, -4, 6) = 2 \text{ & } 3 \text{ is not divisible by } 2$$

So, No dependency exists.

Case 2 :- ( $S_1 \rightarrow S_1, S_2 \rightarrow S_2$ )

DO I = 1, 3

DO J = 1, 3

DO K = 1, 3

$$S_1 : A(I+1, 2J+2, K+1) = B(I, 2J, K)$$

$$S_2 : C(I, J, K) = A(I, 1, 9-K)$$

END DO

END DO

END DO.

Sol:- For  $S_1 \rightarrow S_1$ ,

$$a+1+2b+2+c+1 = d+2e+f$$

$$a+1+2b+2+c+1-d-2e-f=0$$

$$a+2b+c-d-2e-f+4=0$$

$$a+2b+c-d-2e-f = -4$$

## \* Subscript categories:

### ① ZIV (zero index integer):

- If it contains no loop index variable.

for e.g:-  $\text{DO } I = 1, 100$

$$\text{S.I. } A(e_1) = A(e_2) + B(j)$$

$\text{END DO}$

where,  $e_1$  &  $e_2$  are constant.

### ② SIV (single index variable):

- If it contains only one index variable.

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

$$A(4 \underset{=}{I}) =$$

$$A(2 \underset{=}{I} + 2)$$

$\text{END DO}$

### ③ MIV (multiple index variable):

- If it contains multiple loop index variables.

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

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

$$A(2 \underset{=}{I} + 2 \underset{=}{J}) =$$

$$A(4 \underset{=}{I} - 6 \underset{=}{J} + 3)$$

$\text{END DO}$

$\text{END DO}$

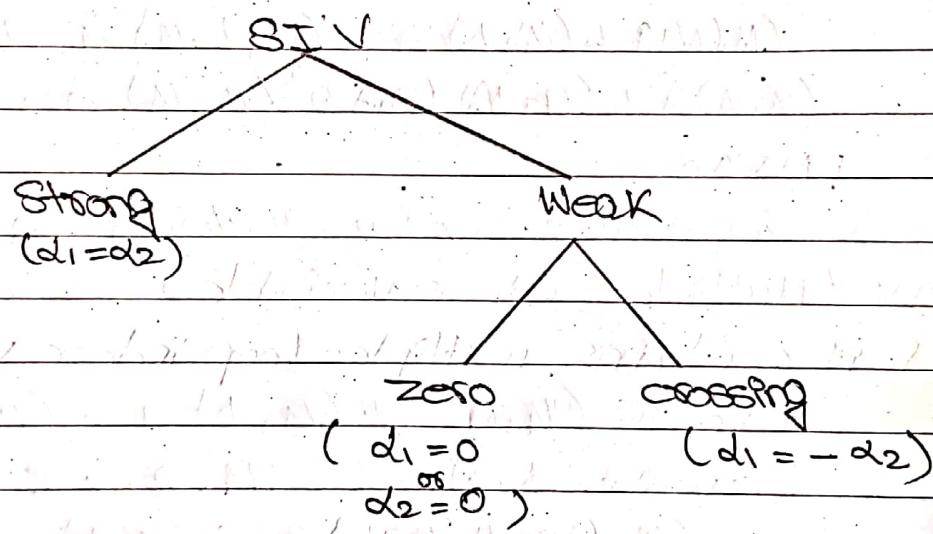
## \* ZIV Test:

- ZIV subscripts contains no references to any loop induction variables.
- They do not vary within any loop.

e.g:-  $\text{DO } I = 1, N$   
 $A(e_1) = A(e_2) + B(I)$

END DO

here, if  $(e_1 - e_2) \neq 0$ , then there is no dependence



\* Assume the following statements

S<sub>1</sub> :  $A(\dots, d_1 I + c_1, \dots) = \dots$

S<sub>2</sub> :  $\dots = A(\dots, d_2 I + c_2, \dots)$

case i:

$(d_1 = d_2 \text{ i.e. Strong SIV Test})$

case ii:

$(d_1 = -d_2 \text{ i.e. Weak crossing SIV Test})$

### ① Strong SIN Test:

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

- If  $\alpha \in \mathbb{Z}$  and  $|\alpha| \leq U-L$  then dependency exists.

for e.g.:

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

$$S1 : A(I+2*N) = A(I+N) + C$$

END DO

i.e. let ( $\alpha_1 = 1$  &  $\alpha_2 = 1$ ) & compare above eqn with

$$A(\dots, \alpha_1 I + C_1, \dots) =$$

$$(A(I-1), A(I)) = A(\dots, \alpha_2 I + C_2, \dots)$$

we get,

$$C_1 = 2N \quad \& \quad C_2 = N$$

then,

$$\alpha = \frac{C_2 - C_1}{\alpha} = \frac{N - 2N}{1} = -N \in \mathbb{Z} \quad \text{True}$$

Also,

$$|\alpha| \leq U-L \quad (\text{where, } U=N \text{ & } L=1)$$

$$|\alpha| \leq (N-1) \quad (\text{True})$$

$$N \leq N-1 \quad \text{False,} \quad (\text{False})$$

For dependency to exists both  $\alpha \in \mathbb{Z}$  &  $|\alpha| \leq U-L$  needs to be satisfied but in our case  $|\alpha| \leq U-L$  doesn't satisfied so, No dependency exists.

### \* Weak zero SIV Test:

-  $a = \frac{c_2 - c_1}{d}$ , if  $a$  is integer then dependence exists.

e.g.:  $\text{DO } I = 1, N$

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

**END DO**

i.e.  $A(I, N) = A(1, N) + A(N, N)$

$$\cancel{I=1}, \quad A(1, N) = \cancel{A(1, N) + A(N, N)}$$

$$\cancel{I=2}, \quad A(2, N) = \cancel{A(1, N) + A(N, N)}$$

$$\cancel{I=N-1}, \quad A(N-1, N) = \cancel{A(1, N) + A(N, N)}$$

$$\cancel{I=N}, \quad A(N, N) = \cancel{A(1, N) + A(N, N)}$$

Dependency exists so, we need to remove dependency

by:

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

$$\text{DO } I = 2, N$$

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

**END DO**

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

This program will run iteration  $I=1$  &  $I=N$  outside the loop which removes the dependency so, parallelization is possible.

## \* Weak crossing SIV test:

- $\alpha = C_2 - C_1$  if  $2\alpha$  is integer then dependence exist.
- e.g:- DO  $I=1, N$   
 $S_1 : A(I) = A(N-I+1) + C$   
 END DO  
 i.e.  $A(1) = A(N-1+1) + C = A(N) + C$   
 $I_1 : A(1) = A(N-I+1) + C = A(N) + C$   
 $I_2 : A(2) = A(N-1) + C$   
 $I = N-1 : A(N-1) = A_2 + C$   
 $I = N : A(N) = A_1 + C$

dependency exists; so we need to remove dependency

by:

```

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
  
```

This program will divide the programs in two half which removes the dependency so, parallelization is possible.

## Unit : 3

### Preliminary Transformations

(This chapter permits methods of preliminary Transformations to make them fit for dependence testing)

#### \* Loop Overheads: Fit for dependence Testing)

- ① Initialize Counter } Software
- ② Increment / Decrement } Software
- ③ Test and branch } Software
- ④ FSM (Finite state Machine) } Hardware
- ⑤ Condition check } Hardware
- ⑥ Extra cycles for R/W Memory }

#### \* Loop Induction Variables:

- An Induction variable is a variable that gets increased or decreased by a fixed amount on every iteration of a loop, or is a linear function of another induction variable.
- The loop index is trivially an induction variable.
- for e.g:-

```
J = 0
Do I = 1, N
    J = J + 1
    K = 2 * J
    m = 3 * K
    A = B + C
End Do
```

↑  
Value  
doesn't change  
so, it isn't induction variable ?

I is loop Induction variable.

Note: I, J, K, m are induction variable i.e. their values changes linearly.

where,

↓

## \* Induction Variable Optimization:

for ( $i=0; i < N; i++$ )

S

$$j = 4 * i + 3 \Rightarrow i=0; j=3; \\ i=1; j=7; \\ i=2; j=11$$

2<sub>j</sub>

~~Non optimization~~  $i=N; j=4*N+3;$

for ( $i=0; i < N; i++$ )

S

for ( $i=j+3; i \leq 4*N+3; i=j+4$ )

S

$y = f(i)$

2<sub>j</sub>  $y = f(j)$

## \* Preliminary Transformation:

- Most dependence test requires subscript expression to be linear function of loop induction variables.
- Best programs are not typically written with dependence testing in mind.
- A number of transformations can be applied prior to dependence testing with the goal of making testing more accurate known as preliminary transformation.

### Advantages:

- Higher dependence test accuracy,
- Easier implementation of dependence test.

e.g.  $INC = 2$

$KI = 0$

$[ \because KI = 0 ]$

$DO I = 1, 100$

$DO J = 1, 100$

$[ 2 ]$

$KI = KI + INC$

$[ \because KI = 2 ]$

$U(KI) = U(KI) + W(J)$   $\leftarrow 2, 4, 6, \dots, 100$

$END DO$

$S(I) = U(KI)$

$END DO$

- Only two subscripts  $w(J)$  and  $s(I)$  are linear functions of the loop induction variables.
- The expression  $U(KI)$  cannot be tested in the form written because  $KI$  varies within the loop.
- $INC$  is invariant within the inner loop.
- Assignment to  $KI$  within  $J$  loop increments its value by a constant amount on each loop iteration.
- $KI \Rightarrow$  Auxiliary induction variable.

i.e. The above code must be transformed to make testing more accurate

### \* Induction Variable Substitution:

- Transforms every reference to an auxiliary induction variable into a direct function of loop index.

**Step 1:** Replace references to auxiliary induction variables with function of loop index

$INC = 2$

$KI = 0$

$\text{DO } I = 1, 100$

$\text{DO } J = 1, 100$

$KJ = KI + INC * (I - 1)$

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

$\text{END DO}$

$KI = KI + 100 * INC$

$S(I) = U(KI)$

$\text{END DO}$

**Step 2:** Remove all references to  $KI$

$INC = 2$

$KI = 0$

$\text{DO } I = 1, 100$

$\text{DO } J = 1, 100$

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

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

$\text{END DO}$

$KI = KI + 100 * INC$

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

$\text{END DO}$

$KI = KI + 100 * 100 * INC$

**Step 3:** Substitute the constants:

$$\text{INC} = 2$$

$$KI = 0$$

$$\text{DO } I = 1, 100$$

$$\text{DO } J = 1, 100$$

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

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

END DO

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

END DO

$$KI = 20000$$

**Step 4:** Remove all unused code

$$\text{DO } I = 1, 100$$

$$\text{DO } J = 1, 100$$

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

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

END DO

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

END DO.

## \* Loop Normalization:

- To make the dependence testing process as simple as possible, many compilers normalize all loops to run from a lower bound of 1 to some upperbound with a step of 1. i.e. 1

(for ( $i=1$ ;  
for ( $i=1$ ;  $i < N$ ;  $i++$ ) ✓  
for ( $i=13$ ;  $i < N$ ;  $i=i+2$ ) ✗

- Replace references to the original loop, induction variables with linear function of the new induction variables.
- This transformation is called Loop Normalization.

## \* Algorithm:

Procedure normalizedLoop ( $L_0$ ) //  $L_0$  is the loop to be normalized

- 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 adjusted loop header

do  $i = 1, (U-L+S)/S$

$S_2$ : replace each reference to  $I$  within the loop by  
 $i * S - S + L;$

END Normalized Loop

eg:-  $\text{Do } I = 1, M$   
 $\quad \quad \quad \text{Do } J = I, N \rightarrow (L = I, U = N, S = 1)$   
 $\quad \quad \quad A(J, I) = A(J, I-1) + 5$   
 $\quad \quad \quad \text{END DO} \rightarrow (J * S - S + L) [J * 1 - 1 + I \rightarrow J - 1 + I]$   
 $\text{END DO}$

↓ Normalized

let  $J$  be the loop to be normalized i.e.

$\text{Do } I = 1, M$   
 $\quad \quad \quad \text{Do } J = 1, (N-I+1) [\because i=1, (U-L+S)/S]$   
 $\quad \quad \quad A(J-1+I, I) = A(J-1+I, I-1) + 5$   
 $\quad \quad \quad \text{END DO} [\because J = 1, J * S - S + L]$

END DO.

Also, we need to check the meaning of the program  
before & after Normalization i.e.

### ① Before Normalization:

$$I = 1, J = 1, 2, 3$$

$$A(1,1), A(2,1), A(3,1)$$

$$I = 2, J = 2, 3$$

$$A(2,2), A(3,2)$$

### ② After Normalization:

$$I = 1, J = 1, 2, 3$$

$$A(1,1), A(2,1), A(3,1)$$

$$I = 2, J = 1, 2$$

$$A(2,2), A(3,2)$$

e.g.: Do  $I = 7$ , max, 3

$$A(I) = B(5) + 5$$

END DO.

$\downarrow$  Normalized.

Do  $I = 1, \text{max} - 7 + 3) / 3$   $\therefore i=1, (0-1+8)/3$

$$A(3i+4) = B(3i+4) + 5 \quad \therefore i=i*8-8+17$$

END DO.

## ① Before Normalization:

$$I = 7$$

$$A_7 = B_7 + 5$$

~~$A_{10} = B_{10} + 5$~~

~~$A_{13} = B_{13} + 5$~~

## ② After Normalization:

$$I = 1, \text{max}$$

$$A(3 \times 1 + 4) = B(3 \times 1 + 4) + 5$$

$$\Rightarrow A_7 = B_7 + 5$$

$$I = 2,$$

$$A(3 \times 2 + 4) = B(3 \times 2 + 4) + 5$$

$$\Rightarrow A_{10} = B_{10} + 5$$

## Data Flow Analysis:

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

for e.g:-

$d_1 : x = a+b$

\* denotes the definition of  $x$  using  $(a, b)$ .

## Data Flow properties:

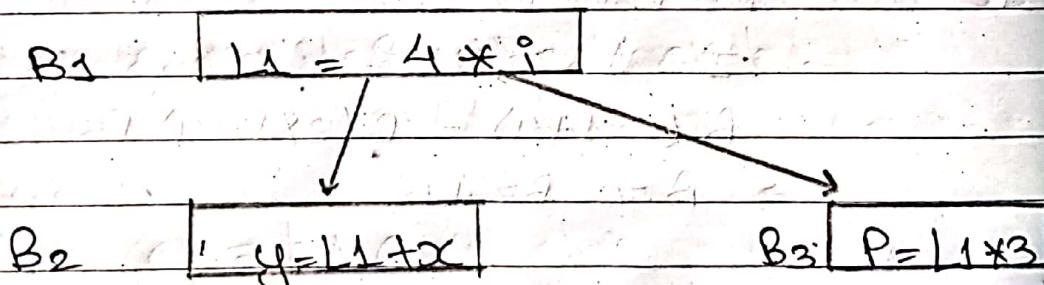
① Available expression

② Reaching Definition

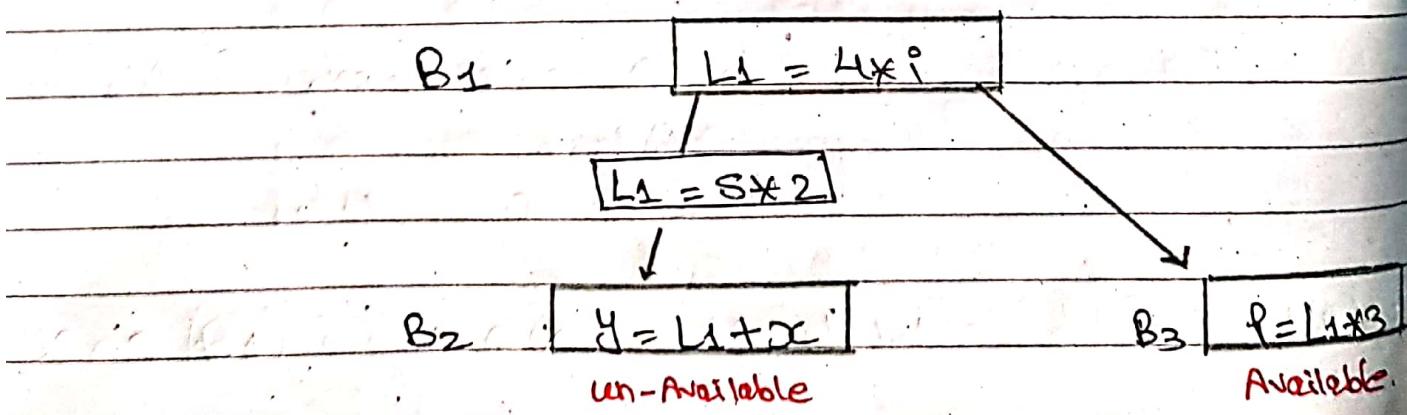
### Available expression:

An expression "a+b" is said to be available at program point "x"; if none of its operands gets undefined before their use.

for e.g:-

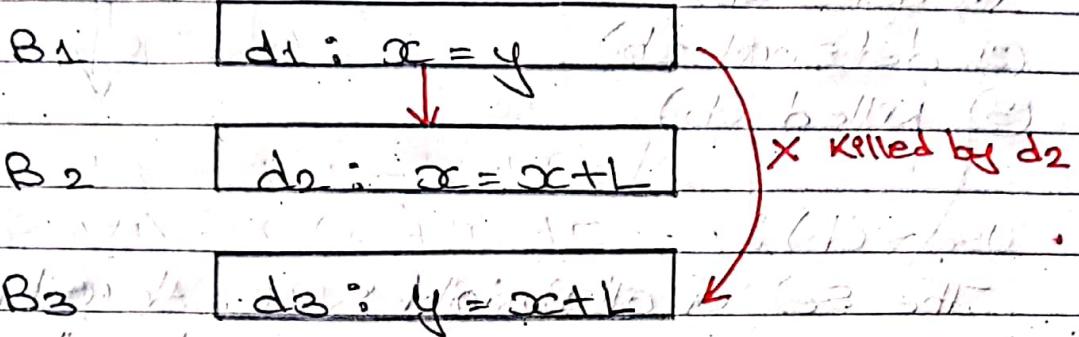


#  $L1$  is Available expression for both  $B2$  &  $B3$



## ② Reaching Definition:

- A definition  $d$  is reaching to a point  $x$  if  $d$  is not killed or redefined before that point.
- For e.g.:-



- $d_1$  is reaching definition for  $B_2$  but not for  $B_3$ , it is killed by  $d_2$  in  $B_2$ .
  - For e.g.:-
- Definitions:
- $d_1 : a = b - 3$
  - $d_2 : b = a + 2$
  - $d_3 : a = x + y$
  - $d_4 : c = a + 2$
- Annotations indicate the flow of values:
- An arrow points from  $d_1$  to  $d_2$ .
  - A red circle with a cross marks  $d_2$ , labeled "X killed by  $d_3$ ".
  - An arrow points from  $d_3$  to  $d_2$ .
  - An arrow points from  $d_3$  to  $d_4$ .
  - An arrow points from  $d_1$  to  $d_4$ .

## \* Definition-use graph:

- It is a graph that contains an edge from each definition point in the program to every possible use of the variable at run time.
- Provides the map of variables usage.
- Heavily used by the transformations.

## \* Definition-use graph sets (or definition-use chain)

- Basic block Computation produces the following Sets.

- ① Uses (b)
- ② defsonet (b)
- ③ killed (b)

### • Uses (b) :

The set of all variables used within block b that have no prior definitions within the block.

### • defsonet (b) :

The set of all definitions within blocks b that are not killed within the blocks.

### • killed (b) :

The set of all definitions that defines variables killed by other definitions within block b.

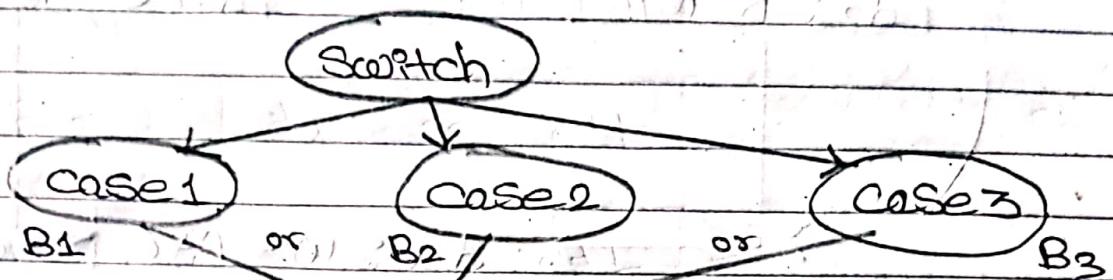
- For e.g:-

$d_1 : a = b + c$	B1
$d_2 : d = a * 2$	
$d_3 : f = a + d$	
$d_4 : a = 2$	a is killed by $d_4$ , so not defsonet

uses(B1) : {b, c}, defsonet(B1) = {d, f}, killed(B1) = {a}

### \* Blocks:

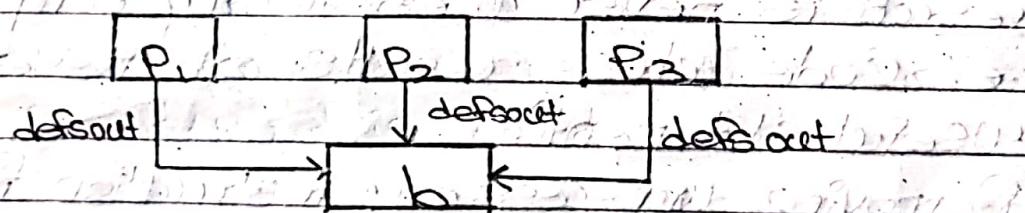
- basic block is a maximal group of statements such that one statement in the group is executed if and only if every statement is executed.
- e.g:-



### \* Reaches(b):

- Let us assume a graph with one basic block  $b$ , and some number of predecessors, each of which can reach  $b$ , through some form of control flow.

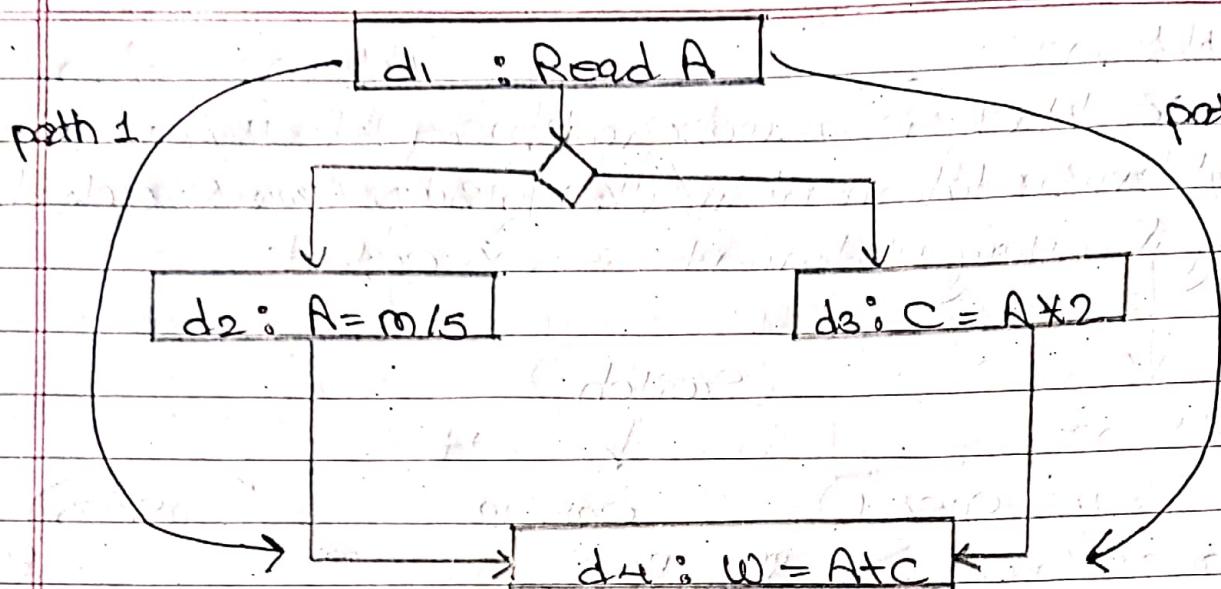
$$\text{reaches}(b) = \text{S} \cup P_1 \cup P_2 \cup P_3 \dots$$



- In this graph, reaches( $b$ ) along any one predecessor  $p$  is the set of all definitions that reach  $p$  (reaches( $p$ )) and not killed inside  $p$  ( $\neg \text{killed}(p)$ ) plus those definitions in  $P$  that reach the exit of  $P$  (defout( $p$ )) i.e.

$$\text{reaches}(b) = \bigcup_{P \in \text{pre}(b)} (\text{defout}(p) \cup (\text{reaches}(p) \cap \neg \text{killed}(p)))$$

$P_1 \quad P_2 \quad P_3$



- Here,  $d_1$  reaches  $d_4$  along path 2 but does not reach  $d_4$  along path 1. Since,  $d_2$  killed the definition of  $d_1$ .

### \* Dead Code Elimination :

- Dead code is a section in the source code of the program which is executed but whose result is never used in any computations.
- i.e. Code whose results are never used in any 'useful statement'.
- Removing unnecessary instruction from the program.

- For e.g. -  ~~$t = a$~~   ~~$C = 0xb$~~   ~~$C = a * b$~~   ~~$d = a * b + 4c$~~   ~~$d = 11a * b + 4c$~~  ~~elimination~~

## \* Algorithm for Dead Code Elimination:

Procedure eliminate dead code (P);

- let worklist = {absolutely useful statement};  
while worklist  $\neq \emptyset$  do begin

$x$  = an arbitrary element of worklist;  
mark  $x$  useful;

worklist = worklist - { $x$ };

for all  $(y, x) \in \text{defuse}$  do

if  $y$  is not marked useful then

worklist = worklist U { $y$ };

end

delete every statement that is not marked useful;

end eliminate dead code.

## \* Constant Propagation:

- Initially, discover values that are constant on all possible execution, & propagate values i.e replace all variables that have constant values at runtime with those constant values.

- It is process of substituting the constant values in the place of all variables that holds them.

### Steps:

- ① Use of variables replaced by a constant value called propagation.
- ② expressions evaluated at compile time ~~need not be evaluated at execution time~~ i.e. If such expression are inside loops, a single evaluation at compile time don't need to can save many evaluations at execution time.

- e.g:-  $x = 14$

$$y = 7 - x/2 \rightarrow y = 7 - 14/2$$

return  $y(28/x+2)$  return  $y(28/14+2)$

$$x = 14$$

$$y = 7 - 14/2$$

return  $y(28/14+2)$



$$x = 14$$

$$y = 0$$

return 0;

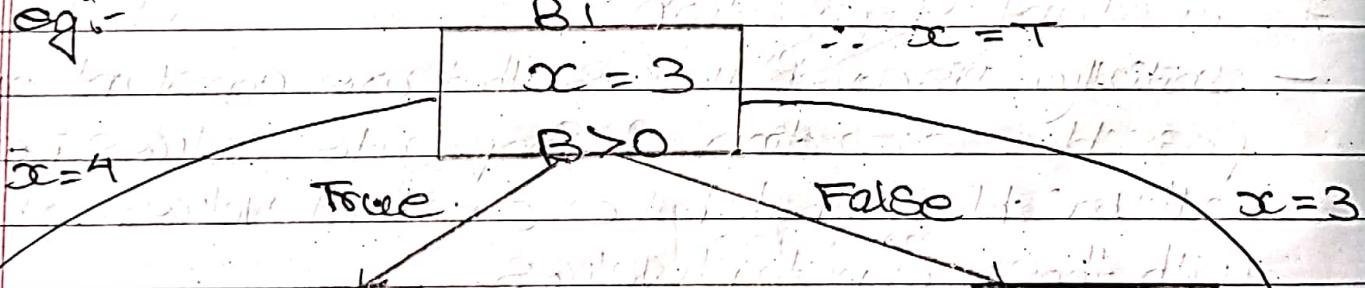
### \* Symbols used:

① L (Bottom)  $\rightarrow$  This statement never executes,

② C  $\rightarrow$  Constant.

③ T (Top)  $\rightarrow$  not a constant i.e.  $x$  can be any value

e.g:-



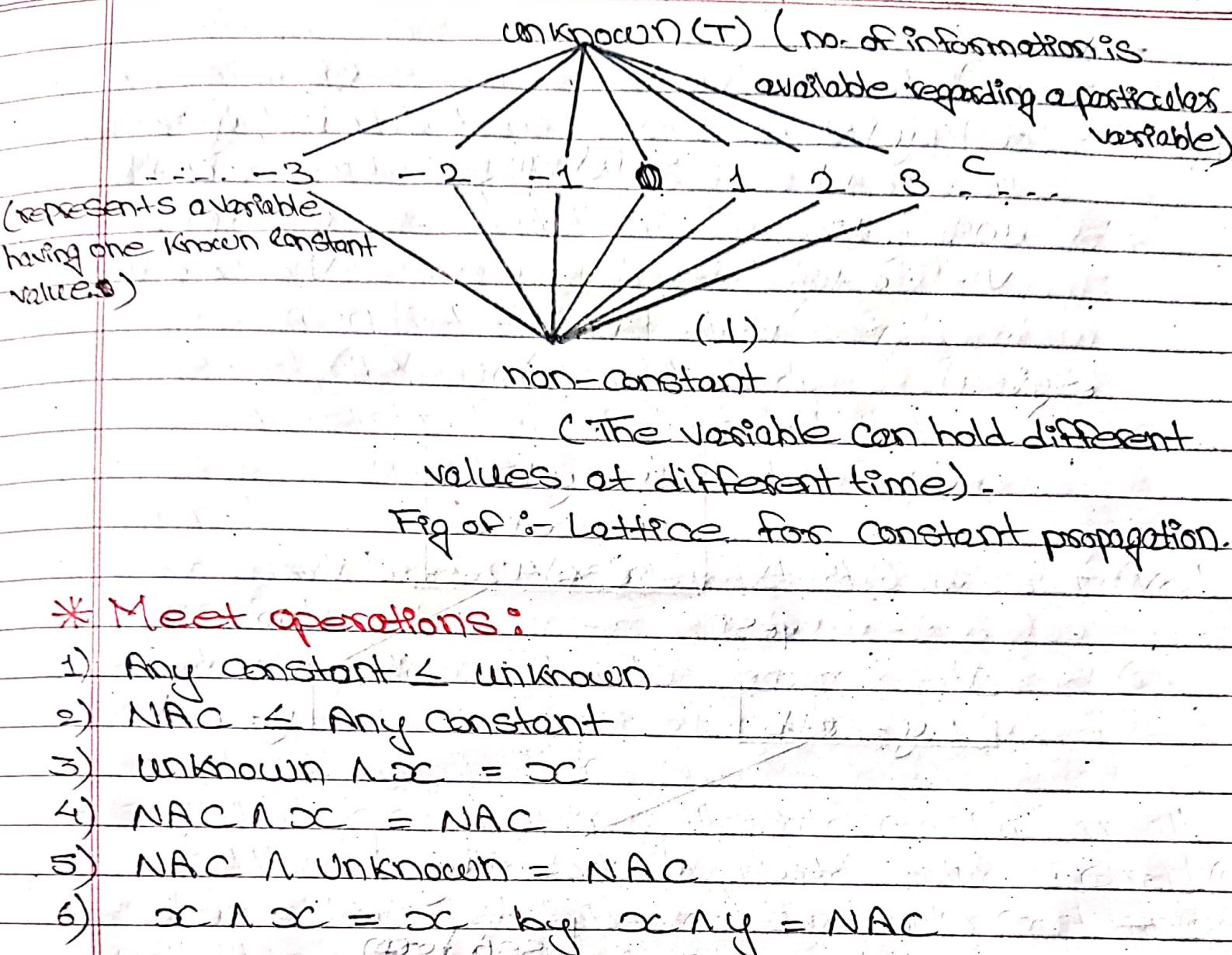
B2

$$y = 2 + w$$

$$x = 4$$

$$y = 0$$

$$A = 2 * x$$



### \* Meet operations:

- 1) Any constant  $\leq$  Unknown
- 2) NAC  $\leq$  Any constant
- 3) Unknown  $\wedge$   $x$  =  $x$
- 4) NAC  $\wedge$   $x$  = NAC
- 5) NAC  $\wedge$  Unknown = NAC
- 6)  $x \wedge x = x$  by  $x \wedge y = \text{NAC}$

If  $x \neq y$

### \* SSA (Single Static Assignment) Form:

- A program is in SSA form, if each use of variable is reached by exactly one definition.
- Optimization become simpler if each variable has only one definition.
- i.e. every variable has single definition.

- for eg:- find CTC condition

$$x = y + z$$

$$x = x + 1$$

$$w = y + z$$

$$v = x + 3$$

$$x_1 = y + z$$

$$x_2 = x_1 + 1$$

$$w = y + z$$

$$v = x_2 + 3$$

e.g:-

$$x = y + z$$

$$x = x + z$$

$$x \leq 42$$

yes

no

$$y = ab$$

$$y = a - b$$

SSA form

$$x_1 = y_1 + z$$

$$x_2 = x_1 + z$$

$$x_2 \leq 42$$

yes

no

$$y_2 = ab$$

$$y_3 = a - b$$

$$y_4 = \phi(y_2, y_3)$$

$$z = x_2 + y_4$$

## The $\phi$ Function:

It is a Merge function.

$\phi$  merges multiple definitions along multiple control paths into a single definition.

At a basic block with  $P$  predecessors, there are  $P$  arguments to the  $\phi$  functions.

$$\text{i.e., } x_{\text{new}} = \phi(x_1, x_2, \dots, x_P)$$

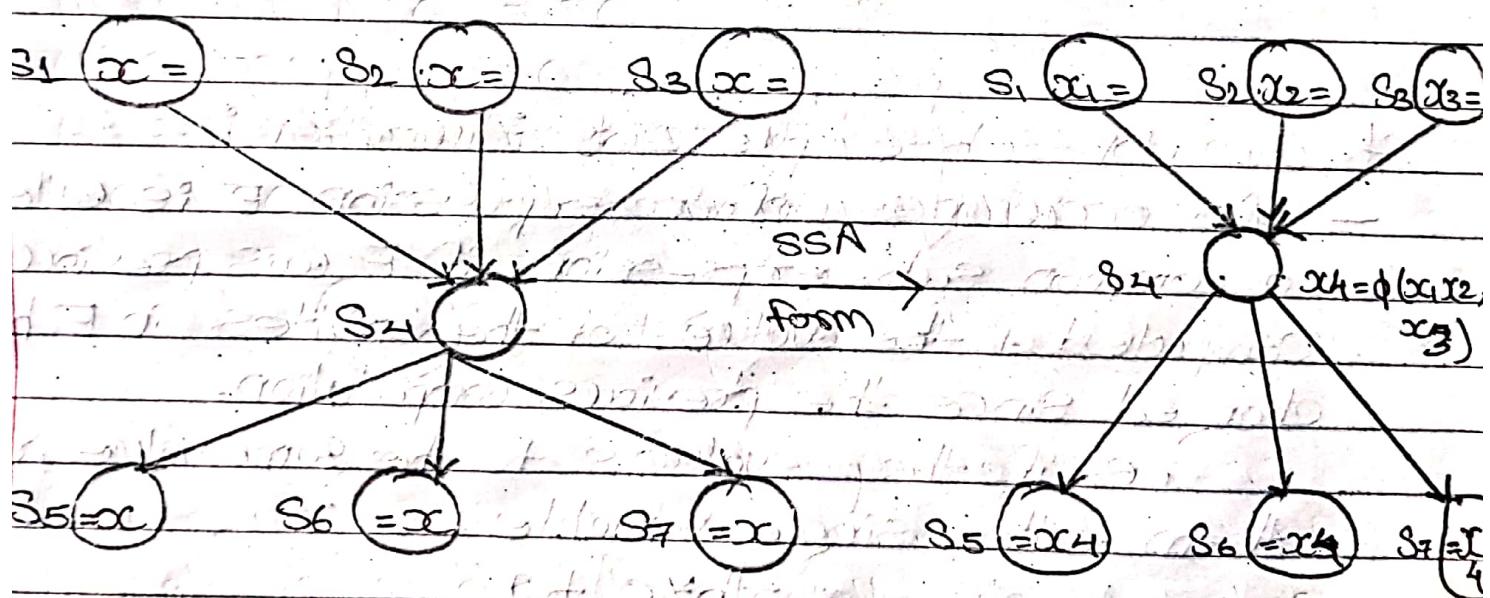
$\phi$  function has the semantics of copying the correct definition depending on which path they are reached by the execution flow.

## SSA (Single Static Assignment):

reduces the number of definition-use edges.

improved performance of algorithm.

for e.g:-



Statements  $S_1, S_2$ , &  $S_3$  all define the variable  $x$ . These definitions all reach the uses in statements  $S_5, S_6, S_7$  by passing through statement  $S_4$ . There are nine edges:  $(S_1, S_5), (S_1, S_6), (S_1, S_7), (S_2, S_5), (S_2, S_6),$

$(S_2, S_7), (S_3, S_5), (S_3, S_6), (S_3, S_7)$

- To reduce this number of operations is to put a special pseudo operation in the node for statement  $S_4: x = x$ . Because this definition kills the values of  $x$  that are created in statements  $S_1, S_2$  &  $S_3$ . The total number of definition-use edges in the modified program is six:
- $(S_1, S_4), (S_2, S_4), (S_3, S_4), (S_4, S_5), (S_4, S_6) \text{ & } (S_4, S_7)$

\* Construction of SSA typically proceeds in two major points

- i) Identification of the points where merge functions, called  $\phi$ -functions are needed.
- ii) Variable renaming to create a unique name for each definition point.

\* Common Sub-expression Elimination:

- An occurrence of an expression  $E$  is called a common sub-expression, if  $E$  was previously computed & the values of the variables in  $E$  have not changed since the previous computation.

i.e. if they evaluate to the same value, replace them with a single variable.

For eg:-  $a = b * c + g$

$$d = b * c * k$$

$$\boxed{\text{temp} = b * c}$$

$$a = \text{temp} + q$$

$$d = \text{temp} * k$$

$$\text{eg:- } t_6 = 4 * i$$

$$x = a[t_6]$$

$$t_7 = 4 * j \rightarrow \text{temp}$$

$$t_8 = 4 * j$$

$$t_9 = a[t_8]$$

$$a[t_7] = t_9$$

$$t_{10} = 4 * j \rightarrow \text{temp}$$

$$a[t_{10}] = x$$

goto B2

$$t_6 = 4 * i$$

$$x = a[t_6]$$

$$t_7 = \text{temp}$$

$$t_8 = \text{temp}$$

$$t_9 = a[\text{temp}]$$

$$a[\text{temp}] = t_9$$

$$t_{10} = \text{temp}$$

$$a[\text{temp}] = x$$

goto B2

### \* Forward Substitution:

- It is the reverse of common Sub expression Elimination.
- It may seem that Common Sub-expression reduces the ALU operations.
- But still it might not necessary. Advantages, since it causes a register to be occupied for long time to hold an expression's value.
- For eg:-

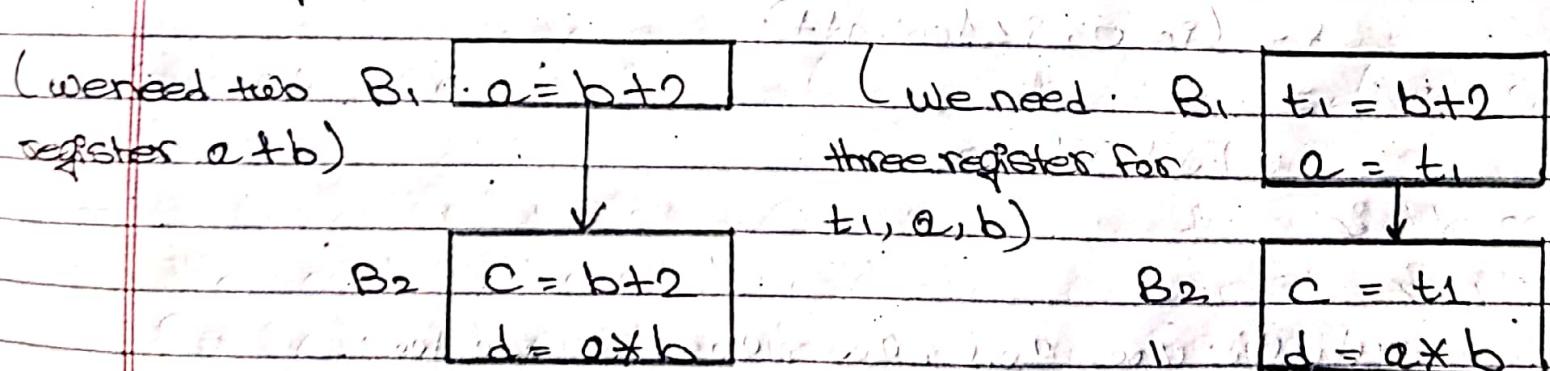


Fig (i)

Fig (ii)

## Unit 4 : Loop optimization

### \* Interchange Loop optimization :

- The process of Switching the nesting order of two loops. (exchange inner loop with outer loop).
- for eg:

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

  S

    for ( $j = 0; j < 100; j++$ )

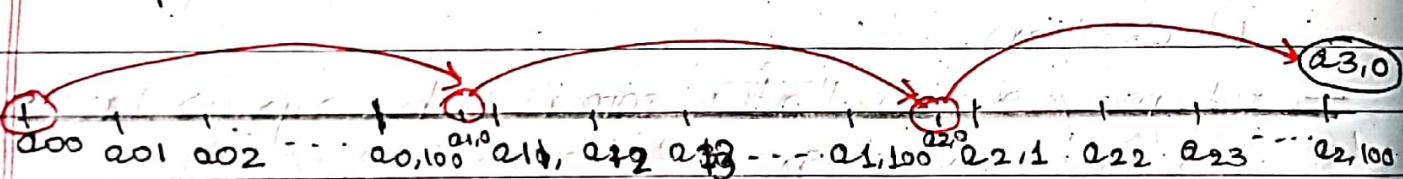
      S

$a[j][i] = 0;$

    S

  S

Output:  $a_{00}, a_{10}, a_{20}, \dots, a_{100}, a_{01}, a_{11}, a_{21}, \dots, a_{101}, a_{02}, a_{12}, a_{22}, \dots, a_{102}, \dots, a_{03}, a_{13}, a_{23}, \dots, a_{103}, \dots, a_{100}$



### Loop Interchange

for ( $j = 0; j < 100; j++$ )

  S

    for ( $i = 0; i < 100; i++$ )

      S

$a[j][i] = 0;$

    S

  S

Output:  $a_{00}, a_{0,1}, a_{0,2}, a_{0,3}, \dots, a_{0,100}$

~~DO I = 1, N  
DO J = 1, M  
A(I,J) = A(I,J) + B  
END DO  
END DO~~

- but not all loop interchange are safe.

for e.g:-  $\text{DO } J = 1, M$

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

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

END DO

END DO

Result:

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

$$J=2, I=2 \quad A_{22} = A_{31} + B$$

(True dependence)

$$J=2, I=1 \quad A_{13} = A_{22} + B$$

$$I=2 \quad A_{23} = A_{32} + B$$

### Loop Interchange

~~DO I = 1, N  
DO J = 1, M  
A(I,J+1) = A(I+1,J) + B  
END DO  
END DO~~

$\text{DO } J = 1, M$

X Loop interchange is

not possible

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

END DO

END DO

Result:

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

$$I=2, J=1$$

$$J=2 \quad A_{13} = A_{22} + B$$

$$A_{22} = A_{31} + B$$

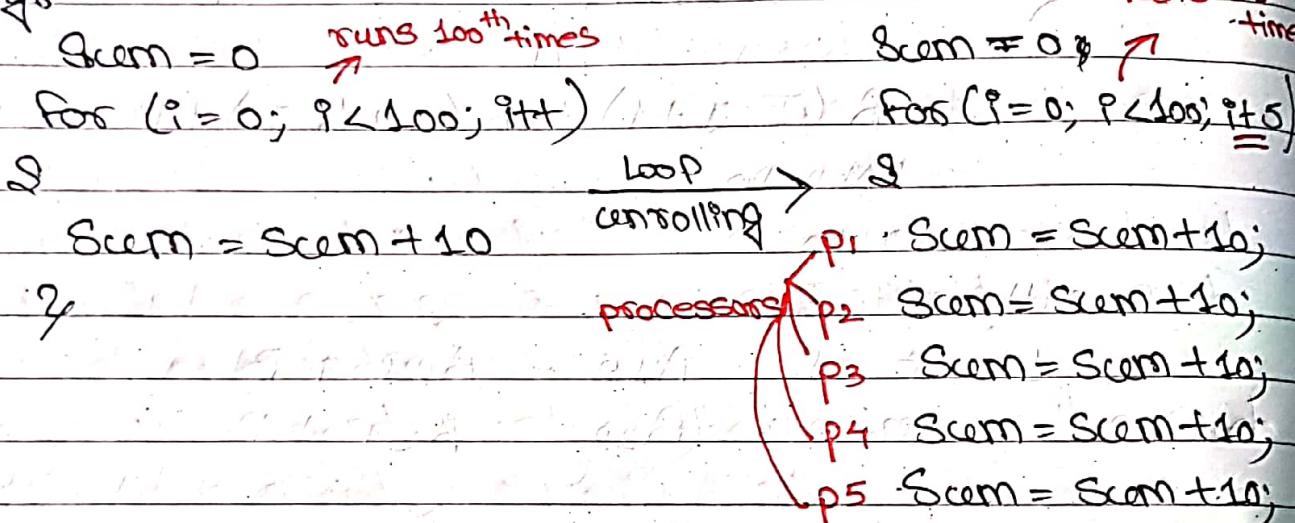
Anti-dependence

$$I=2, J=2$$

$$A_{23} = A_{32} + B$$

## \* Loop unrolling:

- Loop transformation technique that helps to optimize the execution time of a program.
- It basically replicates loop body multiple times, adjusting loop terminal code.
- e.g:-



## \* Loop invariant: (change करने वाली Variable)

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

e.g:-

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

S

$$x = i + a/b;$$

$$y = y + 2;$$

2

$$n = a/b$$

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

S

$$x = i + n;$$

$$y = y + 2;$$

2

## \* Loop Fusion :

- Adjacent Loops are merged to a single loop.
- for e.g:-

$\text{for } (i=0; i < 100; i++)$  # Same loop

$S_1 : x[i] = 1;$  + Fusion  $\rightarrow \text{for } (i=0; i < 100; i++)$

$S_2 : y[i] = 2;$  Loop Fusion  $x[i] = 1;$

$\text{for } (i=0; i < 100; i++)$  # same loop

$S_3 : y[i] = 0;$  with loop fusion, it becomes  $y[i] = 1;$

## \* Fusion Safety :

- A loop independence independent dependence between statement  $S_1$  if  $S_2$  in loop  $L_1$  if  $L_2$  respectively is fusion preventing if fusing  $L_1$  &  $L_2$  causes the dependence to be carried by the combined loop.
- for e.g:-  $\text{DO } I = 1, N$

$S_1 : A(I) = B(I) + C$

END DO

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

$S_2 : D(I) = A(I+1) + E$

END DO

| Loop Fusion

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

$S_1 : A(I) = B(I) + C$

$S_2 : D(I) = A(I+1) + E$

END DO

Result:

$$I_1 : A_1 = B_1 + C_1$$

$$D_1 = A_2 + E \quad (\text{Loop independent dependence})$$

$$I_2 : A_2 = B_2 + C_2$$

$$D_2 = A_3 + E$$

### \* Loop Vectorization:

- Loop vectorization helps to transform procedural loops by assigning a processing unit to each pair of operands.
- Programs spent most of their time within such loops.
- Therefore, Vectorization can significantly accelerate them, especially over large datasets.
- for e.g.

`for (i=0; i<1024; i++)`

`c[i] = a[i] + b[i];`

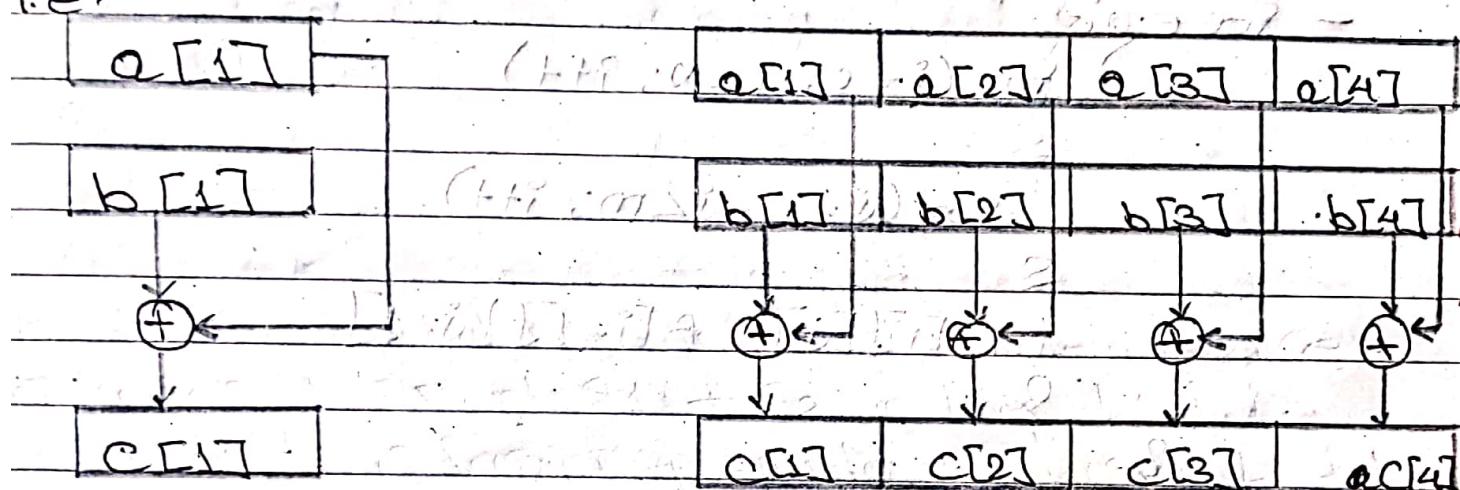
Vectorized form

`for (i=0; i<1024; i+=4)`

`c[i:i+3] = a[i:i+3] + b[i:i+3];`

$c_1, c_2, c_3, c_4$        $a_1, a_2, a_3, a_4$        $b_1, b_2, b_3, b_4$

here,  $C[i:i+3]$  represents the four array elements  $c[i], c[i+1], c[i+2], c[i+3]$ , i.e., Vector processor can perform four operations for a single vector instruction. Since, the four vector operations complete in roughly the same time as one scalar instruction, the vector approach can run upto four times faster than the original code, i.e.



Fig①: Original code

Fig② : Vectorization code

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.

$$\text{Original code: } \text{for } (i=1; i \leq N; i++) \quad \text{for } (i=1; i \leq N; i=i+4)$$

$$\text{S} \quad A[i] = 2 \times B[i] + 1; \quad \xrightarrow{\text{vectorized form}} \quad S \quad A[i:i+3] = 2 \times B[i:i+3] + [1, 1, 1, 1];$$

Fig 3: Loop Vectorization scheme of length 4.

## \* Loop Skewing:

- It is a transformation that reshapes an iteration space to make it possible to express parallelism with conventional parallel loops.
- It changes the shape of the iteration space without changing the dependencies.
- It looks like geometrical transformation which can help to expose 4 canonical parallelism.
- For e.g:-

for ( $i = 0; i < N; i++$ )

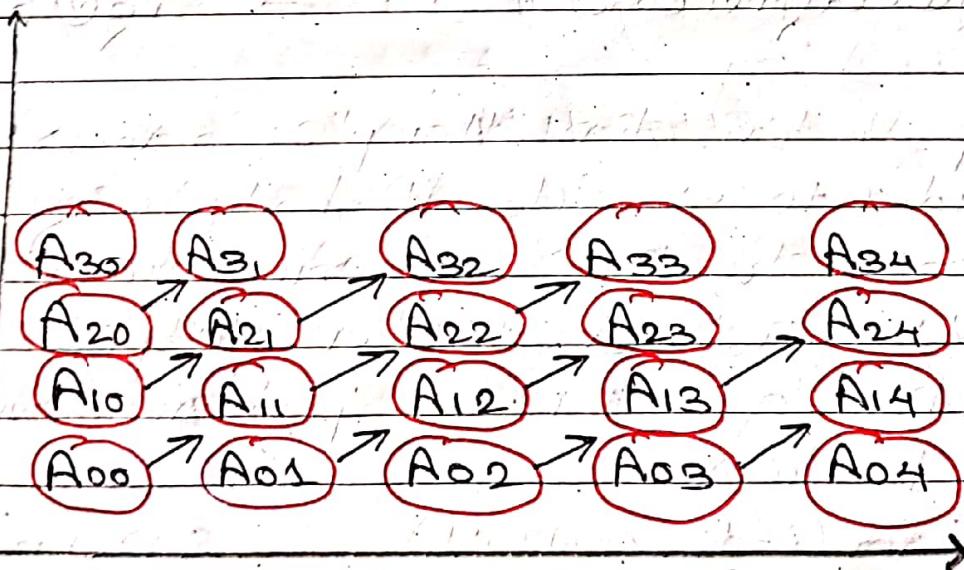
S

for ( $j = 0; j < m; j++$ )

S

$$A[i][j] = A[i-1][j-1]$$

Q



Iteration Space.

- The dimension for  $S_1 \rightarrow [0, N] \times [0, M]$
- The given function can be modeled as:
 
$$(i, j) = (i'-1, j'-1)$$

$$\Rightarrow p(i, j) = p(i'-1, j'-1)$$
- i.e.  $p = i - i'$  satisfies the space position constraint.
- now,  $[-M, N]$  be the <sup>minimum</sup> & maximum value that  $p$  can take,
- $-M = p_{\min} - i_{\max} = 0 - M + 1$
- $N = i_{\max} - i_{\min} = N - 0$
- now, the naive code is generated as:
 

```

for (p = -M; p <= N; p++)
  for (i = 0; i <= N; i++)
    for (j = 0; j <= M; j++)
      if (p == i - j)
        statement S1
      
```

In this loop, there is no data dependency, that's two iterations are completely disjoint.
- Now, we have to eliminate the empty iterations.

① Tightening the bound for inner most loop ( $i$ )

- Since,  $p = i - j \Rightarrow j = i - p$

for ( $p = -M$ ;  $p \leq N$ ;  $p++$ )

if  $(i - p) \geq 0 \text{ and } i - p \leq M$

~~A[i][i-p]~~

$$A[i][i-p] = A[i-1][i-p-1]$$

else

2

2

②

Now, there is still some empty iterations in  $i$  loop

- hence,

$$i - p \geq 0 \Rightarrow i \geq p$$

$$i - p \leq M \Rightarrow i \leq M + p$$

now,

for ( $p = -M$ ;  $p \leq N$ ;  $p++$ )

Previous lower  
bound  $\uparrow$

Previous upper  
bound  $\downarrow$

for ( $i = \max(0, p)$ ;  $i \leq \min(N, p+M)$ ;  $i++$ )

$$A[p][i-p] = A[i-1][i-p-1]$$

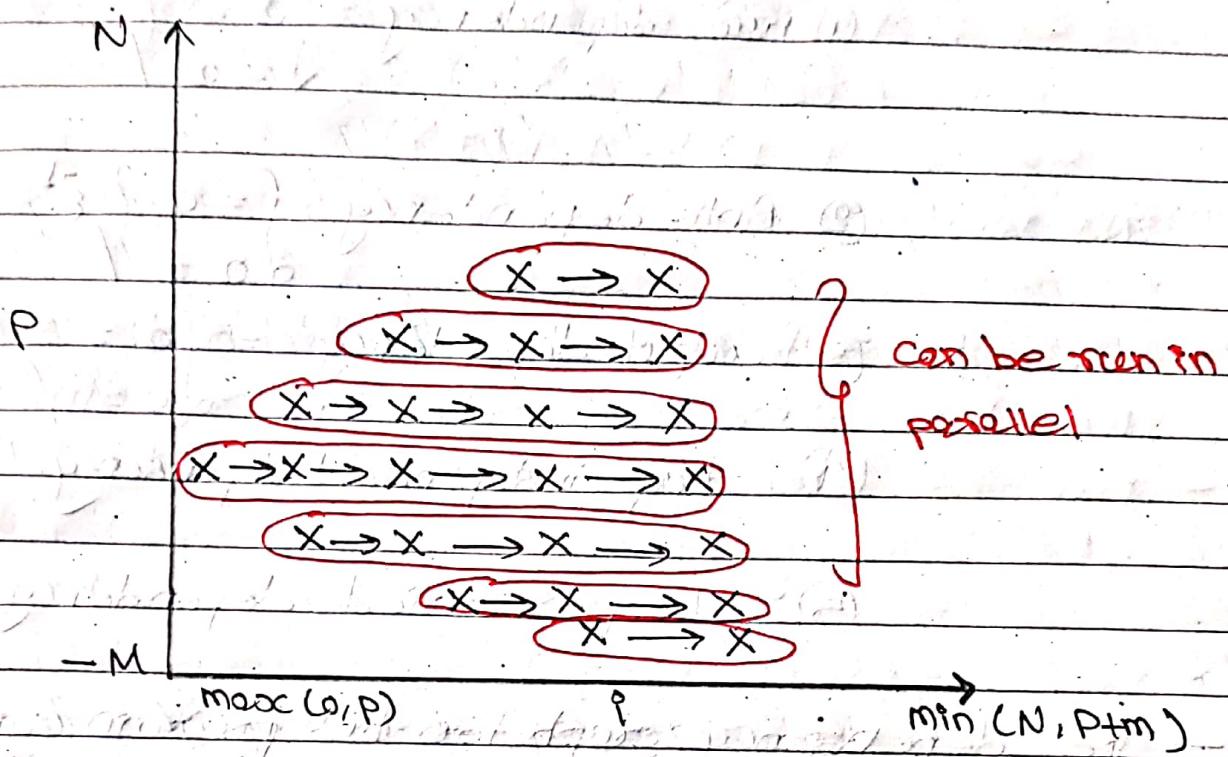
} no if condition

2

2

2

- how the iteration space looks like:



- Now the outerloop can be parallelized.

### \* Scalar Expansion:

- The program frequently uses scalar temporaries in computations involving arrays.

e.g:-

$DO \quad I = 1, N$

$S_1 : T = A(I)$

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

$S_3 : B(I) = T$

END DO.

{ swap the contents of two

variables

Note: Important notations :

$$\textcircled{1} \text{ True dependency } = \left\{ \begin{array}{l} a = \\ = a \end{array} \right\}$$

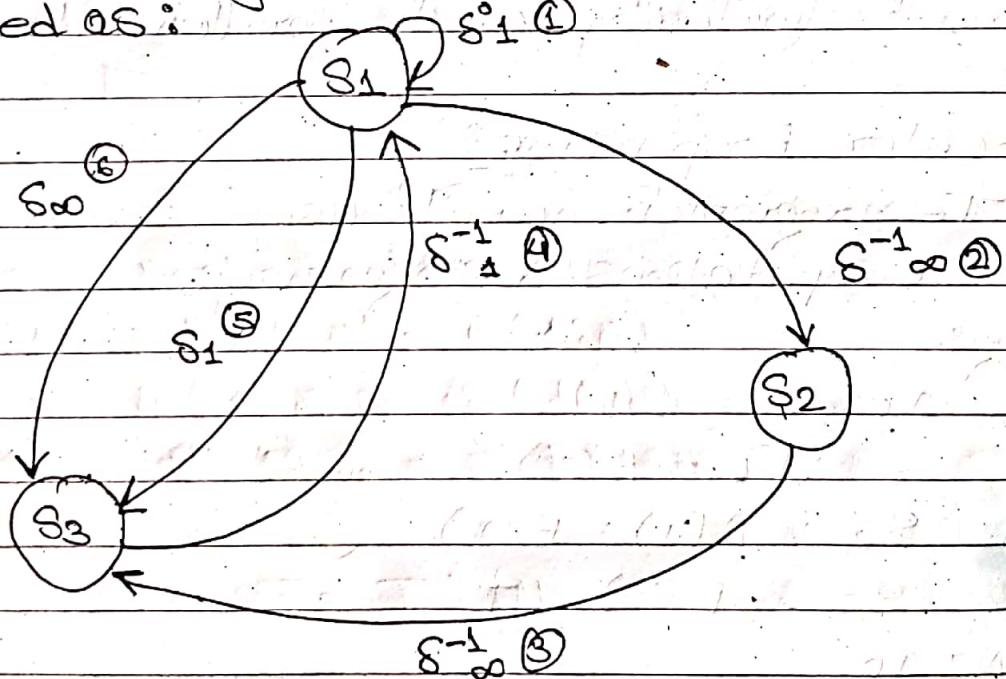
$$\textcircled{2} \text{ Anti-dependency } = \left\{ \begin{array}{l} a = \\ a = \end{array} \right\}^{-1}$$

$$\textcircled{3} \text{ output dependency } = \left\{ \begin{array}{l} a = \\ a = \end{array} \right\}$$

$$\textcircled{4} \text{ Loop independent dependency } = \infty$$

$$\textcircled{5} \text{ Loop carried dependency } = 1$$

- The dependency graph for this program can be explained as :



case ii: In first iteration  $\tau$  is defined and in second iteration it is again defined, so there is loop carried dependency (output dependency)

Case ii: Loop independent dependency due to A(I)  
also, Anti-dependency.

Case iii: Loop independent dependency due to B(I)  
also, (Anti-dependency).

Case iv: T is used in S<sub>2</sub> & again defined in next iteration, So loop carried dependency (Anti-dependency).

Case v: S<sub>1</sub> of first iteration defined T & S<sub>2</sub> of second iteration is using it, So loop carried dependency (True dependency).

Case vi: Loop independent dependency due to T.  
(True dependency).

- All loop carried dependencies are due to scalar variable T
- So, use Vector Variable instead of Scalar Variable
- i.e., If each iterations has a separate locations to use as a temporary, these dependency disappears
- So, Scalar transformation is the process of transforming the programs scalar references with the references of a compiler generated temporary array that has a separate location for each loop iterations.
- now, the code looks like :

DO I = 1, N:

$$S_1 : T \$ (I) = A(I)$$

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

$$S_3 : B(I) = T \$ (I)$$

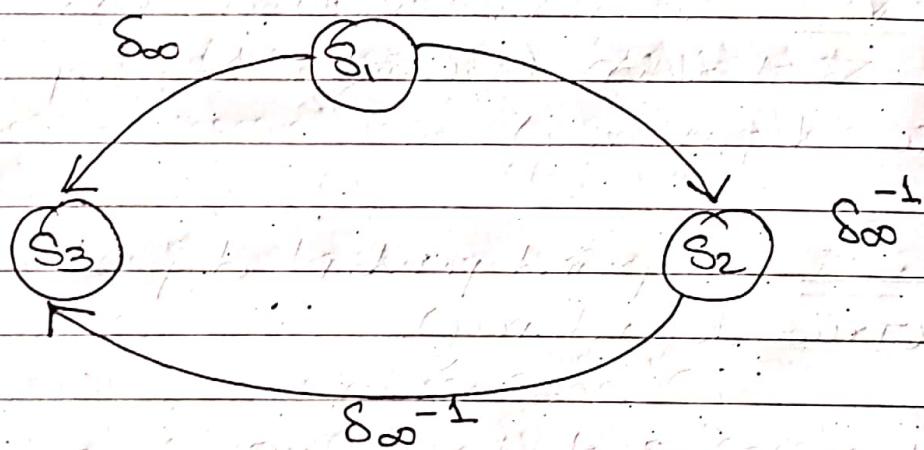
END DO



Replacing T by T\$

$T = T \$ (N)$  ∵ here T is original variable which may have some use after this program.

- now the dependency graph looks like:



- and can be vectorized as

$$S_1 : T \$ (1:N) = A(1:N)$$

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

$$S_3 : B(1:N) = T \$ (1:N)$$

i.e.,  $T = T \$ (N)$

## \* Array Renaming:

- Array locations are sometimes reused, i.e (creating unnecessary anti-dependencies and offset dependencies)
- e.g:

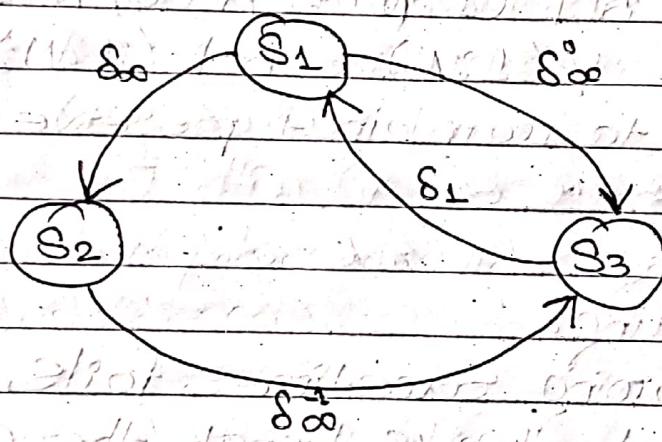
Do  $I = 1, N$

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

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

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

- The dependence graph will be



- here, there is cycle in dependence graph, so it cannot be vectorized.
- Since  $A(I)$  is redefined in  $S_3$ , it has no relation with  $A(I)$  of  $S_2$ , so break this using array renaming
- now, after array renaming it becomes

Do  $I = 1, N$

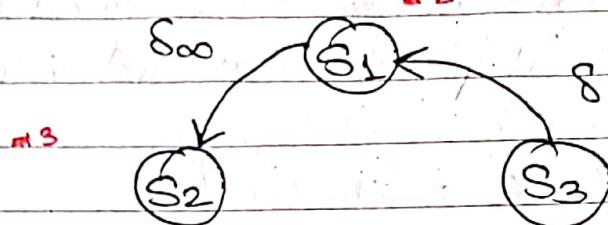
$$S_1 : A\$ (I) = A(I-1) + X$$

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

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

END DO

- now, the dependence graph will be,



- Since, there is no cycle. So we can vectorize this as,

$$S_3 : A(1:N) = B(1:N) + C$$

$$S_1 : A\$ (1:N) = A(0, N-1) + X$$

$$S_2 : Y(1:N) = A\$ (1:N) + Z$$

- Reordering to maintain & preserve their related dependences.

### \* Node Splitting:

- Array renaming sometimes fails,
- It may not always break the cycle.
- e.g:

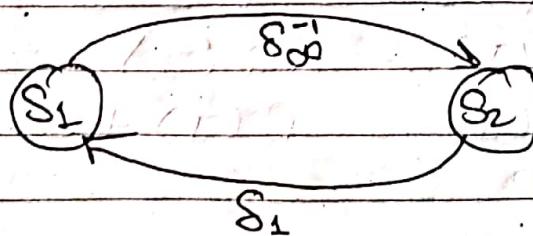
DO. I = 1, N

$$S_1 : A(I) = x(I+1) + x(I)$$

$$S_2 : x(I+1) = B(I) + 32$$

END DO.

- The dependence graph looks like:



- which creates a cycle, so cannot be vectorized.

- This cycle cannot be broken using copy renaming because we cannot break the iterations in different parts.
- In such case node splitting can be used.
- The main target of node splitting is also to break the cycle.
- i.e., breaking anti-dependence.
- makes copy of node from which anti-dependence emanates. (source of Anti-dependence).
- here,  $A(I) = X(I+1) + X(I)$
- $$\text{IS the part that is the source of anti-dependence.}$$
- So, split the node  $S_1$ .
- now,

DO  $I = 1, N$

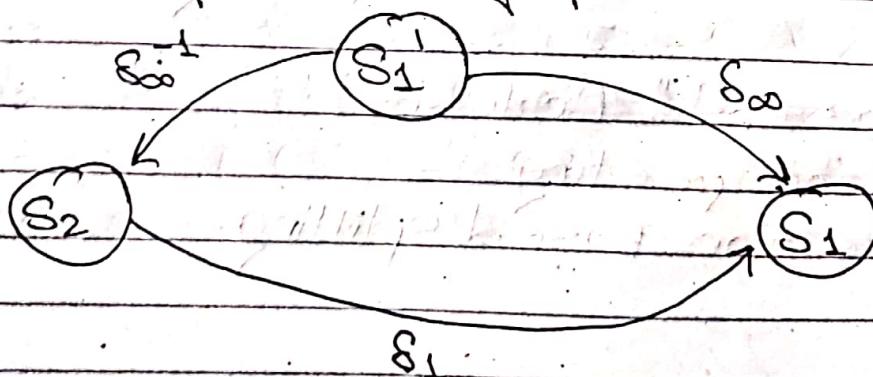
$S_1 : X\$ (I) = X(I+1)$

$S_1 : A(I) = X\$ (I) + X(I)$

$S_2 : X(I+1) = B(I) + B_2$

END DO

- Now, the dependence graph will be,



- here, there is no cycle, even though one dependence has increased.
- This can be vectorized as:

$$S_1 : X\$ (1:N) = X (2:N+1)$$

$$S_2 : X (2:N+1) = B (1:N) + 32$$

$$S_3 : A (1:N) = X \$ (1:N) + X (1:N)$$

### \* Node-Splitting Algorithm:

- 1) Takes a loop independent anti-dependence.
- 2) Add new assignment  $x : T\$ = \text{Source}(\omega)$ .
- 3) Insert  $x$  before  $\text{Source}(\omega)$ .
- 4) Replace  $\text{Source}(\omega)$  with  $T\$$ .
- 5) make changes in the dependence graph.

### \* Index-Set Splitting:

- It sub-divides the loop into different iteration ranges.
- Tries partial parallelization.
- i.e. Iterations not involving in dependence can be parallelized.
- Common Index-Set splitting transformations are:
  - i) Threshold Analysis
  - ii) Loop peeling
  - iii) Section Based Splitting

e.g.: for  $(i=0; i < N; i++)$

$$A_i = B_i + Cx \rightarrow \text{Not involve in dependence.}$$

$$X^i = Y_i + D \rightarrow \text{True dependence}$$

$$Z^i = X^i + E$$

$\downarrow$   
Index - Set splitting

$$A_i = B_i + Cx \rightarrow A[1:N] = B(1:N) + Cx$$

for  $(i=0; i < N; i++)$

$$X^i = Y_i + D$$

$$Z^i = X^i + E$$

### i) Threshold Analysis:

- Threshold is the number of iterations between the source and sink of the dependence
- i.e., threshold = distance between source & sink.
- Threshold = 5 means, if source is in 1st iteration then sink will be on 6th iterations.

e.g.:  $A(I+20) = A(I) + B$

$$\text{DO } I = 1, 20$$

$$A(I+20) = A(I) + B \rightarrow$$

END DO

$$I=1, A_{21} = A_1 + B$$

$$I=2, A_{22} = A_2 + B$$

$$I=3, A_{23} = A_3 + B$$

- here, threshold = 20

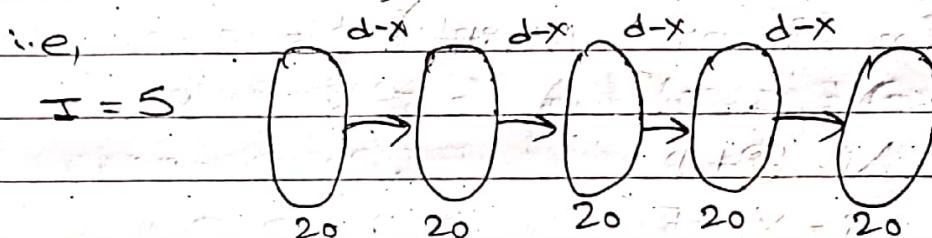
$$I=20, A_{40} = A_{20} + B$$

$$I=21, A_{41} = A_{21} + B$$

dependence occurs after 20 iterations.

- i.e., the value defined in 1<sup>st</sup> iteration is used in 2<sup>nd</sup> iteration, 2<sup>nd</sup> in 3<sup>rd</sup> iteration, 3<sup>rd</sup> in 4<sup>th</sup> iteration, so on.
- but here the maximum value of  $I$  is 20, so sink is never executed here,
- So, this loop has no dependencies.
- all iterations are independent and can be vectorized as

$$A(21:40) = A(1:20) + B$$



- now, let us consider another example:

e.g:-  $\text{DO } I = 1, 100$

$$A(I+20) = A(I) + B$$

$\text{END DO}$

$\text{Threshold} = 20$

- now, we have dependence among iterations.

- So, we can divide 100 iterations into chunk of 20 iterations each (called strip mining).

~~if the next~~  $\text{DO } I = 1, 100, 20$

~~do~~  $\text{DO } J = I, I + 19$

$$\boxed{A(J+20) = A(J) + B} \rightarrow \text{Parallel}$$

~~do~~  $\text{END DO}$

~~do~~  $\text{END DO}$

- now inner loop can be vectorized but outer loop has to execute sequentially.
- So, it can be vectorized as

DO I = 1, 100, 20

$$A(I+20 : I+39) = A(I : I+19) + B$$

END DO

END DO

- e.g:- DO I = 1, 100  $\rightarrow I = 1, A_{99} = A_1 + B$   
 $A(100-I) = A(I) + B \quad I = 2, A_{98} = A_2 + B$   
 END DO

Threshold = 50

DO I = 1, 100

$$A(99 : 100) = A(1 : N) + B$$

END DO

$$I=49 \quad A_{51} = A_{49} + B$$

$$I=50 \quad A_{50} = A_{50} + B$$

$$I=51 \quad A_{49} = A_{51} + B$$

### ii) Loop peeling:

- used when source of dependence is in a single iteration,

- e.g:- DO I = 1, N  
 $A(I) = A(I) + A(1)$   
 END DO  $\rightarrow A_1 = A_1 + A_1$

- In every iterations from 2 to N, we are using  $A_1$ , calculated in 1st iteration.

- So, Peel off that operation out of the loop.

$$A(1) = A(1) + A(1)$$

DO I = 2, N

$$A_2 = A_2 + A_1$$

$$A(I) = A(I) + A(1)$$

$$A_3 = A_3 + A_1$$

END DO

- now, can be vectorized as?

$$A(1) = A(1) + A(1)$$

$$A(2:N) = A(2:N) + A(1)$$

### iii) Section based splitting:

- Peel off a group of statement,

- variation of loop peeling.

e.g.:

DO I = 1, N

DO J = 1, N/2

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

END DO

DO J = 1, N

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

END DO

END DO

divide into two

1 - N/2

N/2 + 1 - N

- here, S<sub>1</sub> has dependence to S<sub>2</sub> because of B, so outerloop cannot be vectorized because of B
- since, inner loops have different upperbands i.e. N, N/2, all statements of second innerloop are not dependent.
- i.e., only N/2 statements of second innerloop are dependent
- so, position second innerloop that uses result of S<sub>1</sub> & that does not.

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

$\text{DO } J = 1, N/2$

$S_1 : B(J, I) = A(J, I) + C$

$\text{END DO}$

$\text{DO } J = 1, N/2$

$S_2 : A(J, I+1) = B(J, I) + D$

$\text{END DO}$

$\text{DO } J = N/2 + 1, N$

$S_3 : A(J, I+1) = B(J, I) + D$

$\text{END DO}$

$\text{END DO}$

- now, there is three inner loops &  $S_3$  is dependence free.

- This permits the vectorization of  $S_3$  in two dimensions, while the remainder will vectorize only in  $J$ -dimension.

- now, we get.

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

$\text{DO } J = N/2 + 1, N$

$S_3 : A(J, I+1) = B(J, I) + D$

$\text{END DO}$

$\text{END DO}$

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

$\text{DO } J = 1, N/2$

$S_1 : B(J, I) = A(J, I) + C$

$\text{END DO}$

$\text{DO } J = 1, N/2$

$S_2 : A(J, I+1) = B(J, I) + D$

$\text{END DO}$

$\text{END DO}$

- now, we can vectorize as:

$$S_3 : A(N/2+1:N, 2:N+1) = B(N/2+1:N, 1:N)+I$$

DO I = 1, N

$$S_1 : B(1:N/2, I) = A(1:N/2, I) + C$$

$$S_2 : A(1:N/2, I+1) = B(1:N/2, I) + D$$

END DO.

### \* Alignment:

- Many loop carried dependencies are due to memory alignment issues.
- If we can align all references, then dependencies would go away, & parallelism is possible.

e.g:-

$$DO I = 2, N$$

$$S_1 : A(I) = B(I) + C(I)$$

$$S_2 : D(I) = A(I-1) * 2$$

$S_1$  There is loop carried dependence, so we cannot parallelize

- The two statements can be aligned to compute and use the values in the same iteration by adding an extra iteration and adjusting the indices of one of the statement to produce.

Do  $I = 1, N$

$S_1 : \text{IF } (I > 1) A(I) = B(I) + C(I)$

$S_2 : \text{IF } (I < N) D(I+1) = A(I) * 2.0$

END DO

- $S_1$  will not execute in first iteration,
- $S_2$  will not execute in last iteration.

### Previous Code

$$I = 2$$

$$A_2 = B_2 + C_2$$

$$D_2 = A_1 * 2.0$$

$$I = 3$$

$$A_3 = B_3 + C_3$$

$$D_3 = A_2 * 2.0$$

$$I = 4$$

$$A_4 = B_4 + C_4$$

$$D_4 = A_3 * 2.0$$

$$I = N$$

$$A_N = B_N + C_N$$

$$D_N = A_{N-1} * 2.0$$

### Aligned Code

$$I = 2$$

$$A_2 = B_2 + C_2$$

$$D_2 = A_2 * 2.0$$

$$I = 3$$

$$A_3 = B_3 + C_3$$

$$D_4 = A_3 * 2.0$$

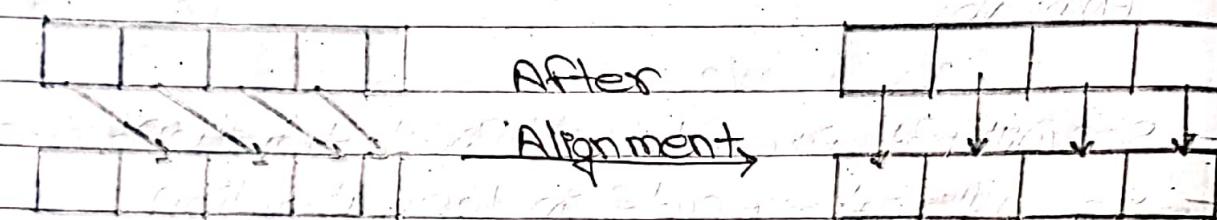
$$I = N$$

$$A_N = B_N + C_N$$

- So, Comparing these two, we can see that meaning is same but dependency has changed from loop carried dependency to loop independent.

dependency.

- now, we can parallelize this loop.
- This can be visualized as.



### \* Code Replication:

- An Alignment conflict occurs if two or more dependences emanating from the same source and entering the same sink.

e.g:-

Do  $I = 1, N$

$$A(I+1) = B(I) + C$$

$$X(I) = A(I+1) + A(I)$$

$S_1$

$S_{\infty}$

- After Alignment we get,

Do  $I = 0, N$

$$\text{IF } (I = 0) \quad A(I+1) = B(I) + C$$

$$\text{IF } (I = N) \quad X(I+1) = A(I+2) + A(I)$$

END DO

previous code $I = 1,$ 

$$A_2 \leftarrow B_1 + C$$

$$X_1 = A_2 + A_1$$

 $I = 2$ 

$$A_3 = B_2 + C$$

$$X_2 = A_3 + A_2$$

 $I = 3$ 

$$A_4 = B_3 + C$$

$$X_3 = A_4 + A_3$$

Aligned code $I = 0,$ 

$$X_1 = A_2 + A_1$$

 $I = 1,$ 

$$A_2 = B_1 + C$$

$$X_2 = A_3 + A_2$$

 $I = 2,$ 

$$A_3 = B_2 + C$$

$$X_3 = A_4 + A_3$$

- here, the original loop carried dependence has been eliminated but it has transformed the original loop independence dependent to loop carried dependence.

- i.e, the loop still cannot be run in parallel.
- In such case, we use code replication.
- It involves redundantly replications of some computations.

Do  $I = 1, N$

$$A(I+1) = B(I) + C$$

IF ( $I == 1$ )

$$t = A(I)$$

ELSE

$$t = B(I-1) + C$$

END IF

$$X(I) = A(I+1) + t$$

END DO

Original Code

$I=1$

$A_2 = B_1 + C$

$X_1 = A_2 + A_1$

$I=2$

$A_3 = B_2 + C$

$X_2 = A_3 + A_2$

Reproduced Code

$$\begin{aligned} I &= 1 \\ A_2 &= X \cdot A \cdot B_1 + C \\ t &= A_1 \\ X_1 &= A_2 + t \end{aligned}$$
  

$$\begin{aligned} I &= 2 \\ A_3 &= B_2 + C \\ t &= B_1 + C \\ X_2 &= A_3 + t \end{aligned}$$

- i.e., there is no loop carried dependence, so now it can be parallelized.

### \* Parallel Code Generation and its Problem:

## Unit 5:

### Control Dependence

#### \* Control Dependence:

Do 100 I = 1, N

S<sub>1</sub> : IF (A(I-1) > 0.0) GOTO 100

S<sub>2</sub> : A(I) = A(I) + B(I) \* C

100: CONTINUE

- here, S<sub>2</sub> has not any data dependence, so it can be executed in parallel.
- It can be vectorized as:

S<sub>2</sub> : A(1:N) = A(1:N) + B(1:N) \* C

Do 100 I = 1, N

S<sub>1</sub> : IF (A(I-1) > 0.0) GOTO 100

100: CONTINUE

- But this vectorized code is not equivalent to original code, why?
- In every iteration S<sub>2</sub> is not going to be executed as it depends on S<sub>1</sub>, called control dependence.

#### \* IF Conversion:

- IF Conversion Eliminate Control dependencies by converting them to data dependencies.
- The idea is to convert statements affected by branches to conditionally execute statements.

- For e.g:-

DO 100 I = 1, N

S1 : IF (A(I-1) > 0.0) GOTO 100

S2 : A(I) = A(I) + B(I) \* C

100 CONTINUE

- Can be converted as:

DO I = 1, N

IF (A(I-1) ≤ 0.0)

A(I) = A(I) + B(I) \* C

END DO

now, it can be vectorized as:

WHERE, (A(0:N-1) ≤ 0.0)

A(1:N) = A(1:N) + B(1:N) \* C

- e.g. 2 : DO 100 I = 1, N

S1 : IF (A(I-1) > 0.0) GOTO 100

S2 : A(I) = A(I) + B(I) \* C

S3 : B(I) = B(I) + A(I)

100 CONTINUE

↓ can be converted as

DO I = 1, N

S1 : IF (A(I-1) ≤ 0.0) A(I) = A(I) + B(I) \* C

S2 : IF (A(I-1) ≤ 0.0) B(I) = B(I) + A(I)

END DO

- It can be vectorized as:

DO  $I=1, N$

S<sub>1</sub>: IF  $(A(I-1) \leq 0.0)$   $A(I) = A(I) + B(I) * C$

END DO

S<sub>2</sub>: WHERE  $(A(0:N-1) \leq 0.0)$   $B(1:N) = B(1:N)$

### \* Branch classification:

- Control dependencies arises because of branch instruction, because it alters the flow.

#### ① Forward Branch:

- It transfers control to a target that occurs lexically after the branch but at the same level of nesting.

#### ② Backward Branch:

- It transfers control to a statement occurring lexically before the branch but at the same level of nesting.

#### ③ Exit branch:

- It terminates one or more loops by transforming control to a target outside a loop nest.  
e.g:- break statement

## \* Branch Removal (Forward Branches) :

### BASIC IDEA :

- i) Make pass through the program
- ii) Maintain a boolean expression "cc" that represent the condition that must be true for the current expression to be executed.
- iii) On encountering a branch, combine the controlling expression into "cc".
- iv) On encountering a target of branch, its controlling expression is discarded into "cc".

### - e.g: Removing forward branches :

DO  $I = 1, N$   $M_1$

C1 IF  $(A(I) > 10)$  GOTO 60

20  $A(I) = A(I) + 10$   $M_2$

C2 IF  $(B(I) > 10)$  GOTO 80

40  $B(I) = B(I) + 10$

60  $A(I) = B(I) + A(I)$

80  $B(I) = A(I) - 5$

END DO

- St. 20 is executed if C1 is false,
- St. 40 is executed if both C1 & C2 are false
- St. 60 can be directly reached by C1, C2 both are false or C1 is true
- St. 80 can be reached by falling from 60 or C1 false & C2 is true.
- now, inserting appropriate guards.

DO  $I = 1, N$

$$M_1 = A(I) > 10$$

20 : IF ( $\neg M_1$ )  $A(I) = A(I) + 10$

$$\text{IF } (\neg M_1) \quad M_2 = B(I) > 10$$

40 : IF ( $\neg M_1 \text{ AND } \neg M_2$ )  $B(I) = B(I) + 10$

60 : IF ( $(\neg M_1 \text{ AND } \neg M_2) \text{ OR } (N_1)$ )  $A(I) = B(I) + A(I)$

80 : IF ( $(\neg M_1 \text{ AND } \neg M_2) \text{ OR } (N_1) \text{ OR } (\neg M_1 \text{ AND } M_2)$ )  
 $B(I) = A(I) - 5$

- We can simplify it as:

DO  $I = 1, N$

$$M_1 = A(I) > 10$$

20 : IF ( $\neg M_1$ )  $A(I) = A(I) + 10$

$$\text{IF } (\neg M_1) \quad M_2 = B(I) > 10$$

40 : IF ( $\neg M_1 \text{ AND } \neg M_2$ )  $B(I) = B(I) + 10$

60 : IF ( $M_1 \text{ OR } \neg M_2$ )  $A(I) = B(I) + A(I)$

$$80 : B(I) = A(I) - 5$$

END DO

- It can be vectorized as : 10.  $I = 1, N$

$$N_1(1:N) = A(1:N) > 10$$

20: WHERE  $(\delta M_1)(1:N) A(1:N) = A(1:N) + 10$   
 WHERE  $(\delta M_2) N_2 = B(1:N) > 10$

40: WHERE  $(\delta M_1 \text{ AND } \delta M_2)$   
 $B(1:N) = B(1:N) + 10$

60: WHERE  $(M_1 \text{ OR } M_2)$   
 $A(1:N) = B(1:N) + A(1:N)$

$$80: B(1:N) = A(1:N) - 5$$

END DO

#Note: i) Backward branch ↗ refers to Branch  
 ii) Exit branch ↘ Branch notes

### \* Iterative Dependences:

Iterative statements can also create control dependence

e.g:-  $\rightarrow \text{range 1}$

20: DO  $I = 1, 100$

40:  $L = 2 * I$

60: DO  $J = 1, L \rightarrow \text{range 2}$

80:  $A(I, J) = 0$

END DO

END DO

- If the assumption is made that iterative statements do not carry any control dependences, the example could be incorrectly vectorized as,

20:  $\text{Do } I = 1, 100$

40:  $L = 2 * I$

END DO

$A(1:100, 1:L) = 0$

000 - - - 000  
000 - - - 000

- The original example zeroes out a triangular section of the result array.
- The vectorized example zeroes out a rectangular section.
- i.e. because dependencies are missing.
- Their dependencies must capture the notion that a DO statement controls the number of times a particular statement is executed.
- To model this, we will introduce the notion that each statement in a loop has an implicit iteration range input.
- e.g.

$A(I, J)$  ("range") denotes the statement is controlled by iteration range "range"

- The iteration range variable for a given loop will be assigned at a point corresponding to the point where the iteration range would be evaluated in the original program.

- e.g.: 20:  $\text{irange } 1 = (1, 100)$

$\text{DO } I = \text{irange } 1$

40:  $L = 2 \times I$  (irange (1))

60:  $\text{irange } 2 = (1, L)$  (irange (1))

$\text{DO } J = \text{irange } 2$

80:  $A(I, J) = 0$  (irange (2))

END DO

END DO

- now, substituting constants

$\text{DO } J = 1, 100$

$L = 2 \times I (1, 100)$

$\text{DO } J = 1, L (1, 100)$

$A(I, J) = 0 (1, L) (1, 100)$

END DO

END DO

It can be vectorized as

$\text{DO } I = 1, 100$

$L = 2 \times I$

$A(I, 1:L) = 0$

END DO

## CFG (Control Flow Graph):

It is a directed graph whose nodes are the basic blocks of a program.

### Dominators:

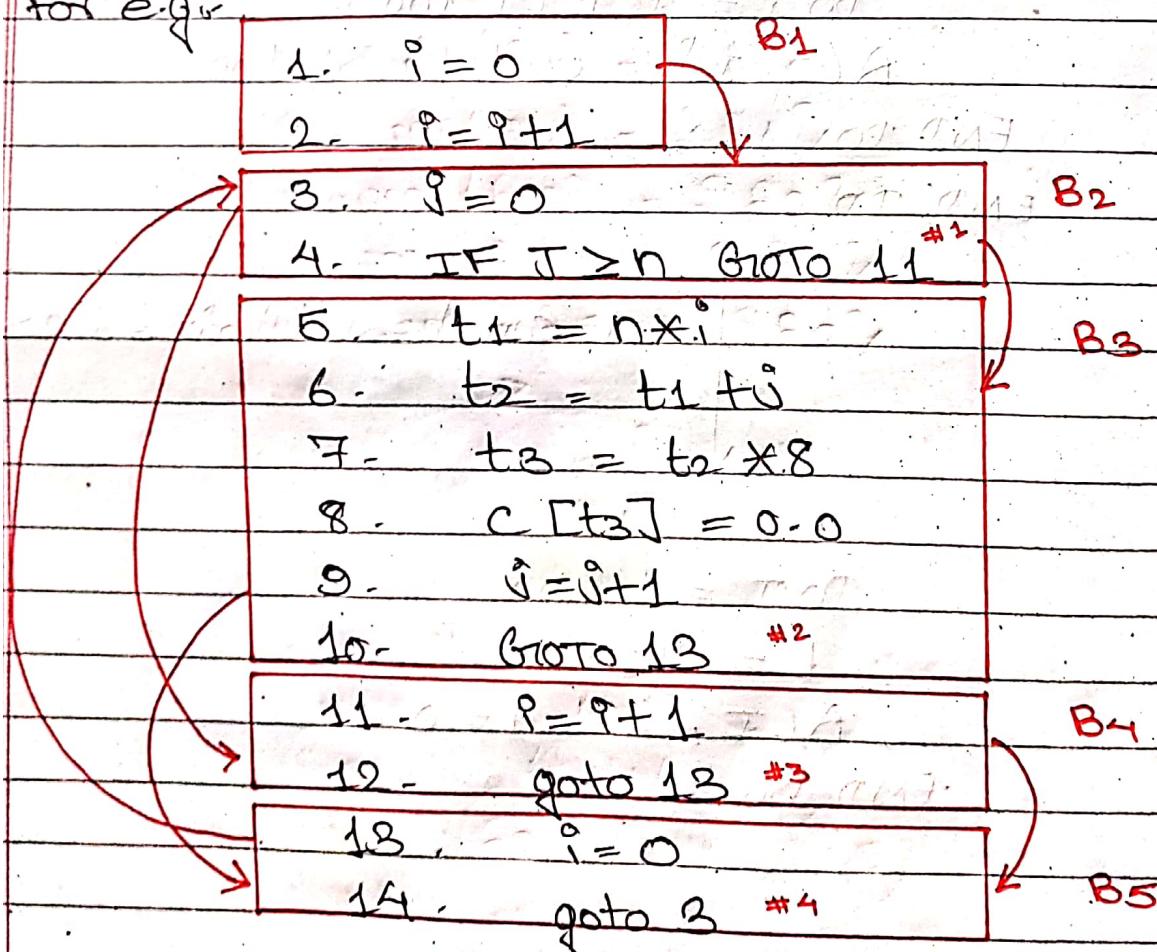
A node "d" of a flow graph  $G_i$  dominates a node "n" if every path in  $G_i$  from the initial node to "n" goes through "d".

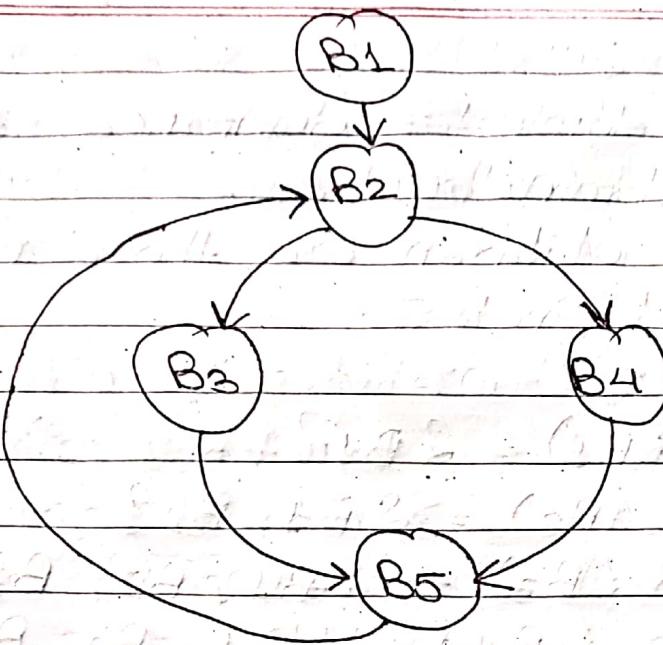
It is denoted as  $d \text{ dom } n$  or  $d \gg n$ .

every node dominates itself.

The initial node dominates all nodes in  $G_i$ .

for e.g.

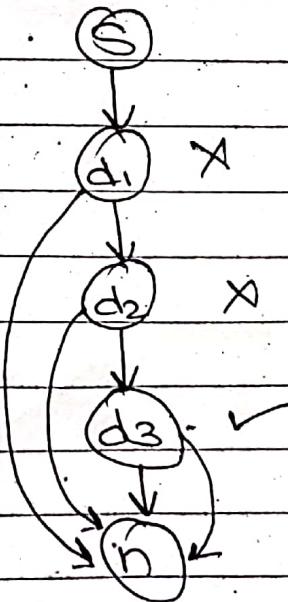




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### \* Immediate dominators:

- node  $d$  immediately dominates  $n$  iff
  - ①  $d \text{ dom } n$
  - ②  $d \neq n$
  - ③  $\nexists m \text{ s.t. } (m \neq n) \wedge (m \neq d) \wedge (d \text{ dom } m) \wedge (m \text{ dom } n)$
- i.e., closed dominator.



## \* Dominator Tree:

- Immediate dominator / dominance relationship form tree called dominator tree.
- Each node's children are those nodes, if immediately dominates.
- e.g:-

$$\text{dom}(B_1) = \{B_1\}$$

$$\text{dom}(B_2) = \{B_1, B_2\}$$

$$\text{dom}(B_3) = \{B_1, B_2, B_3\}$$

$$\text{dom}(B_4) = \{B_1, B_2, B_4\}$$

$$\text{dom}(B_5) = \{B_1, B_2, B_5\}$$

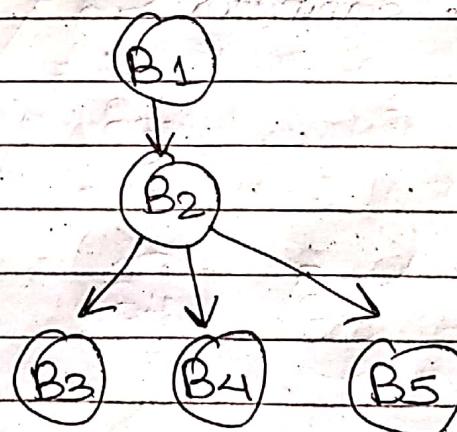
$$i.\text{dom}(B_1) = \{\emptyset\}$$

$$i.\text{dom}(B_2) = \{B_1\}$$

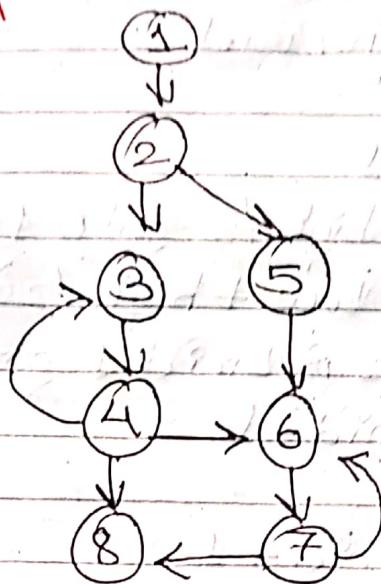
$$i.\text{dom}(B_3) = \{B_2\}$$

$$i.\text{dom}(B_4) = \{B_2\}$$

$$i.\text{dom}(B_5) = \{B_2\}$$



\* Create Dominators tree from following control flow graph:



Sol

$$\text{dom}(1) = \emptyset$$

$$\text{dom}(2) = \{1, 2\}$$

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

$$\text{dom}(5) = \{1, 2, 5\}$$

$$\text{dom}(4) = \{1, 2, 3, 4\}$$

$$\text{dom}(6) = \{1, 2, 6\}$$

$$\text{dom}(7) = \{1, 2, 6, 7\}$$

$$\text{dom}(8) = \{1, 2, 8\}$$

$$\text{idom}(1) = \emptyset$$

$$\text{idom}(2) = 1$$

$$\text{idom}(3) = 2$$

$$\text{idom}(4) = 1$$

$$\text{idom}(5) = 2$$

$$\text{idom}(6) = 2$$

$$\text{idom}(7) = 6$$

$$\text{idom}(8) = 2$$

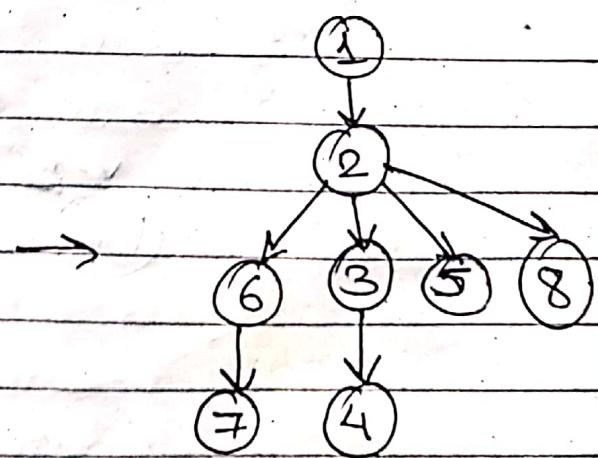
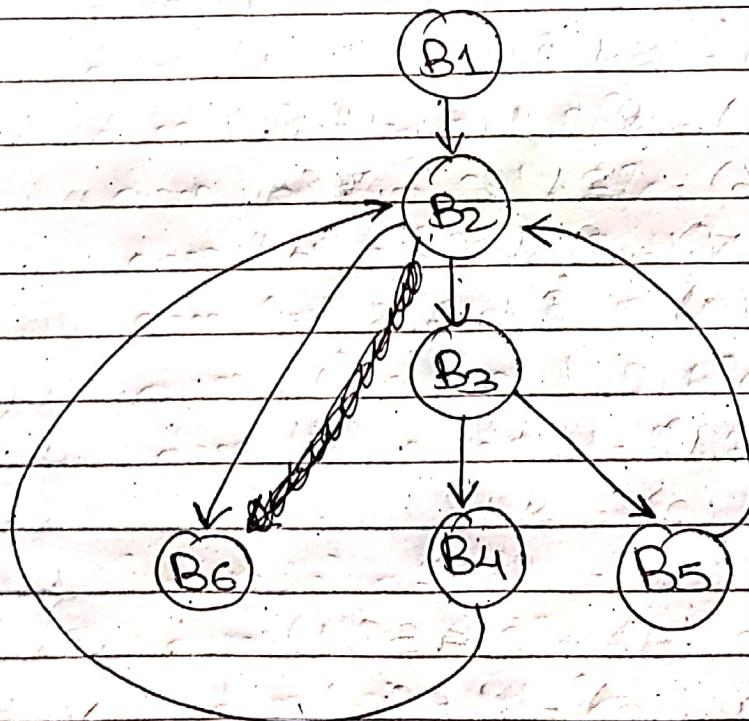


Fig: Dominant tree

\* Create a Dominant Tree from following program:

1. int low, high, mid
2. low = 0
3. high = n-1
4. IF low > high goto 11
5. mid = (low + high) / 2
6. IF  $\alpha > A[mid]$  goto 9
7. high = mid - 1
8. goto 4
9. low = mid + 1
10. goto 4
11. return mid
12. END



CFG

$$\text{dom}(B_1) = \{B_1\}$$

$$\text{dom}(B_2) = \{B_1, B_2\}$$

$$\text{dom}(B_3) = \{B_1, B_2, B_3\}$$

$$\text{dom}(B_4) = \{B_1, B_2, B_3, B_4\}$$

$$\text{dom}(B_5) = \{B_1, B_2, B_3, B_5\}$$

$$\text{dom}(B_6) = \{B_1, B_2, B_6\}$$

$$\text{idom}(B_1) = \{\emptyset\}$$

$$\text{idom}(B_2) = \{B_1\}$$

$$\text{idom}(B_3) = \{B_2\}$$

$$\text{idom}(B_4) = \{B_3\}$$

$$\text{idom}(B_5) = \{B_3\}$$

$$\text{idom}(B_6) = \{B_3\}$$

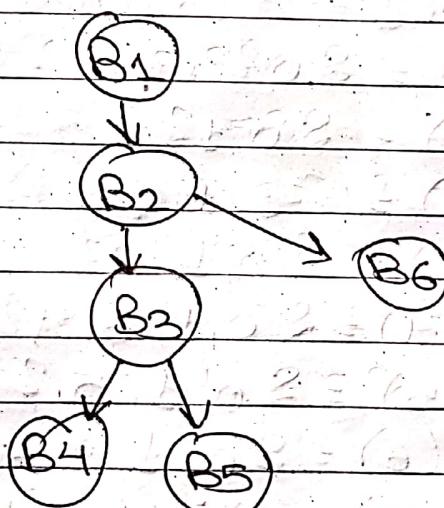
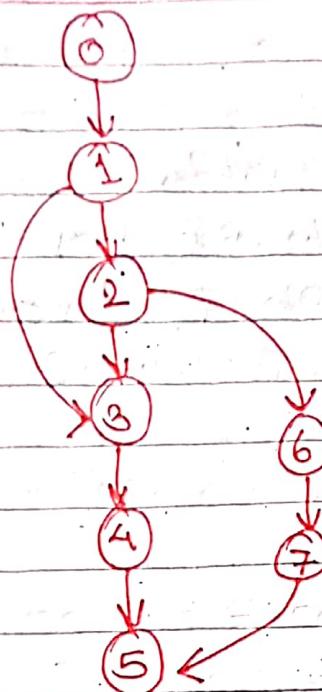


Fig: Dominant Tree



CFG

Create a Dominant Tree from given CFG:

= Sol

$$\text{dom}(0) = S_0 \emptyset$$

$$\text{dom}(1) = S_0, 1\emptyset$$

$$\text{dom}(2) = S_0, 1, 2\emptyset$$

$$\text{dom}(3) = S_0, 1, 3\emptyset$$

$$\text{dom}(4) = S_0, 1, 3, 4\emptyset$$

$$\text{dom}(5) = S_0, 1, 5\emptyset$$

$$\text{dom}(6) = S_0, 1, 2, 6\emptyset$$

$$\text{dom}(7) = S_0, 1, 2, 6, 7\emptyset$$

$$\text{now, } i\text{dom}(0) = S_0 \emptyset$$

$$i\text{dom}(6) = S_2 \emptyset$$

$$i\text{dom}(1) = S_0 \emptyset$$

$$i\text{dom}(7) = S_6 \emptyset$$

$$i\text{dom}(2) = S_1 \emptyset$$

$$i\text{dom}(3) = S_1 \emptyset$$

$$i\text{dom}(4) = S_3 \emptyset$$

$$i\text{dom}(5) = S_1 \emptyset$$

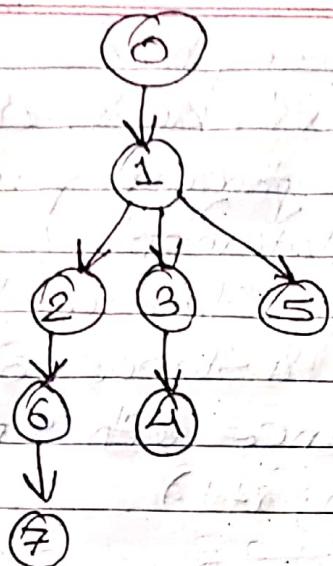
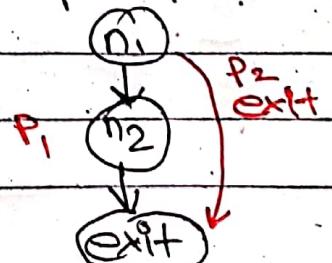


Fig: Dominant Tree

### \* Control Dependence :

- IF two statements are dependent to each other based on a control.
- For e.g:-  $\text{while } (\text{power}! = 0)$ 
  - $S_1 : z = z + x;$
  - $S_2 : \text{power} = \text{power} + 1;$
- Let C be a CDG<sub>1</sub> (Control dependence Graph) with nodes n<sub>1</sub> & n<sub>2</sub>, n<sub>1</sub> being predicate (i.e. Control).
- node n<sub>2</sub> is control dependent on n<sub>1</sub> if
  - ① There is at least one path from n<sub>1</sub> to program exit that includes n<sub>2</sub>.
  - ② and at least one path from n<sub>1</sub> to program exit that excludes n<sub>2</sub>.



## \* Program dependence Graph:

- It describes different kinds of dependence among statements in a program p.
- ① node → assignment statement.
- ② edge → edge from Statement  $S_1$  to Statement  $S_2$  iff some instance of  $S_1$  shares a data dependence with some instance of  $S_2$ .
- e.g.: for ( $i=0; i < n; i++$ )

S

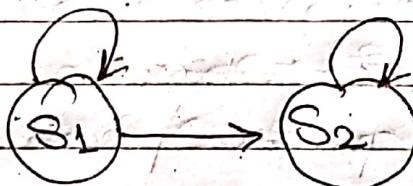
$$x[i] = x[i] + x[i-1]; \quad // S_1$$

2

$$\text{for } (i=0; i < n-10; i++)$$

$$S_2: x[i] = x[i] + y[x[i]] \quad // S_2$$

i.e.



## Unit - 6

## Interprocedural Analysis and optimization

## \* Interprocedure Analysis:

- It is the process of gathering information about the whole program instead of a single procedure
- i.e. Modifying more than one procedures.
- e.g:- Side-effect Analysis, Alias analysis.

## \* Side-effect Analysis:

- Modification and reference side effect.
- ① MOD(S) → Set of variables that may be modified as a side effect of call of S.
- ② REF(S) → set of variables that may be referenced as a side effect of call of S.

Do I = 1, N

S<sub>1</sub> : CALL P

S<sub>2</sub> : X(I) = X(I) + Y(I)

END DO.

- can Vectorize if,

1. P neither modifies X nor uses X
2. P does not modify Y.

### \* Alias Analysis:

- It describes a situation in which a data location can be accessed through different symbolic names (called aliases).
- It is a technique used to determine if a storage location may be accessed in more than one way.
- e.g:-

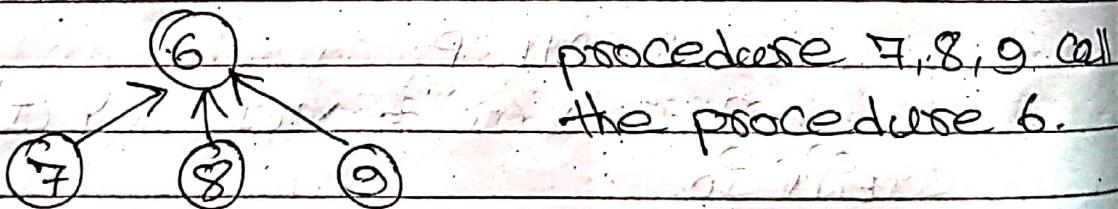
```

int * p;
int x = 4;
p = & x;
printf("%d", *p);
  
```

p ↗  
x  
4

### \* Call Graph:

- It is a directed graph in which each node is call site (i.e. a procedure) & each edge connects two nodes ( $f, g$ ) indicating that procedure  $f$  calls procedure  $g$ .
- e.g:-



### \* Live & Use Analysis:

- ① USE(S) → set of variables that are used in before any assignment (i.e. Variable in R.H.S but not in L.H.S of prior statement of S).

② KILL(S)  $\rightarrow$  set of variables that are assigned a value in S (i.e. Variables in LHS)

- ex:-

$$\begin{array}{|c|c|} \hline B_1 & \begin{array}{l} \cancel{x} P = q + r \\ \cancel{x} S = P + q \\ U = S + V \end{array} & \begin{array}{l} \\ \\ \end{array} \\ \hline \end{array}$$

$$B_2 \quad V = r + u$$

$$B_3 \quad q = 8 \times u$$

node	USE	KILL
B1	q, r, v	P, S, U
B2	r, u	V
B3	q, u	q
B4	v, r	q, r

### \* Constant Propagation and alias analysis:

S:

int x, y;

int \* p;

~~p = &x;~~

x can be either 4 or

~~5;~~  $\boxed{x = 5}$

~~\* p = 42;~~

$y = x + 1;$

2

- If P might point to xc, then we have two aliases that reach the last statement, so xc is not a constant.

### \* Inline Substitution:

- It instruct the compiler to just insert the function code in place, instead of calling the function.
- hence, no function call overhead.

### \* Side Effect to Arrays:

- checking whether two array accesses  $a[i]$  and  $b[i]$  are aliased, we need to consider not only the points to set of base variables, but also the values of i & j.

$a[i]$	$i = \text{UNDEF}$	$j = c_2$	$j = \text{NAC}$
$\& b[i]$			
$i = \text{UNDEF}$	Not Aliased	Not Aliased	Not Aliased
$i = c_1$	Not Aliased	Aliased if $c_1 = c_2$	Aliased
$i = \text{NAC}$	Not Aliased	Aliased	Aliased

### \* Procedure cloning:

- It is an interprocedural transformation where the compiler creates specialized copies of procedure bodies.

- e.g-

Subroutine P2 (input)

call P3 (3 \* input)

call P3 (4 \* input)

Subroutine P3 (input)

call P4 (5 \* input)

call P4 (6 \* input)

Main

P2

P3

Pn

main

P2(1)

P2(2)

P3

Pn

main

P2(1)

P2(2)

P3(1)

P3(2)

P3(3)

P4

Pn

Fig① : Initial program

Fig② : After cloning P2

Fig③ : After cloning P3