



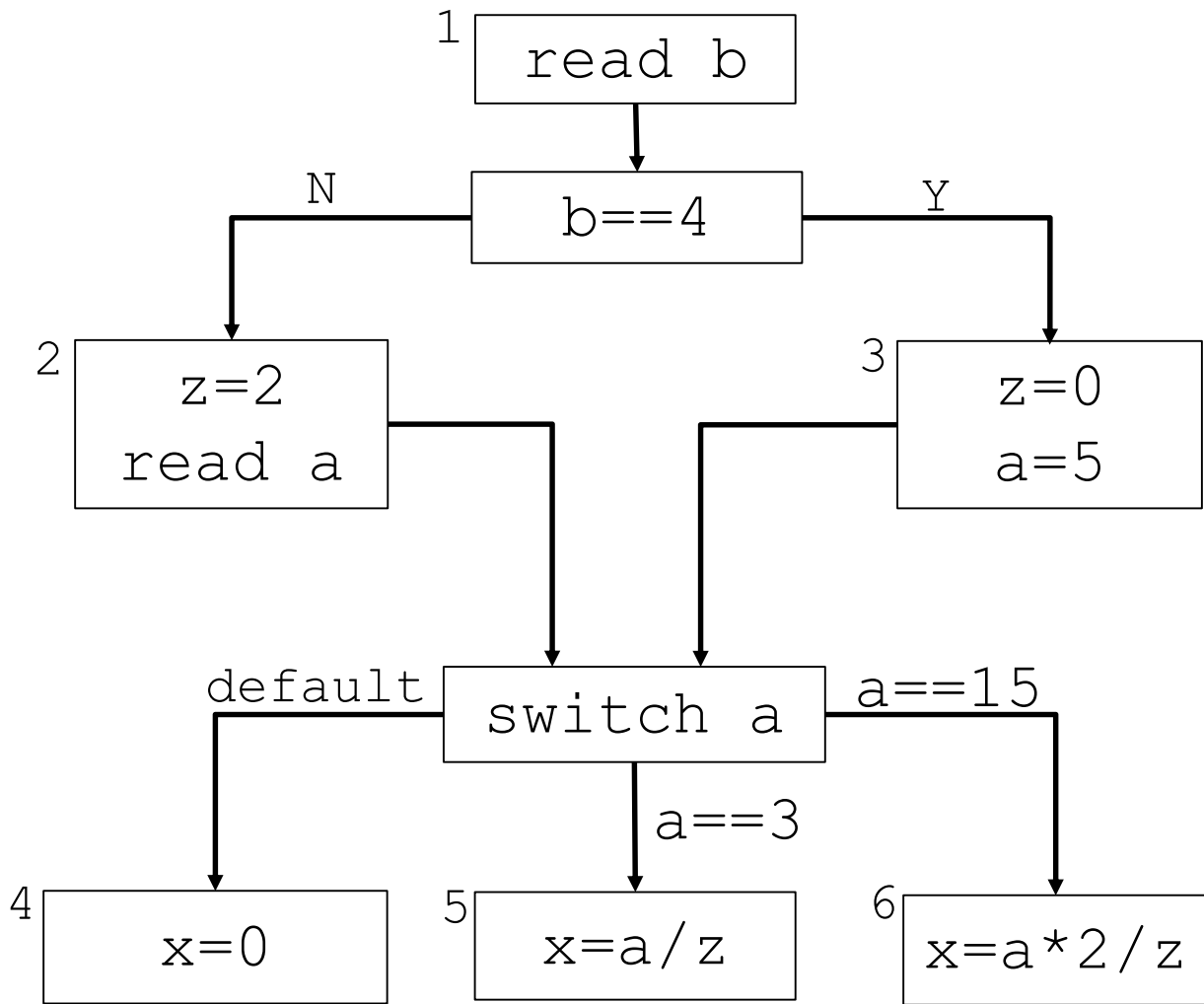
Path Sensitive MFP Solutions In Presence of Intersecting Infeasible Control Flow Path Segments

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and
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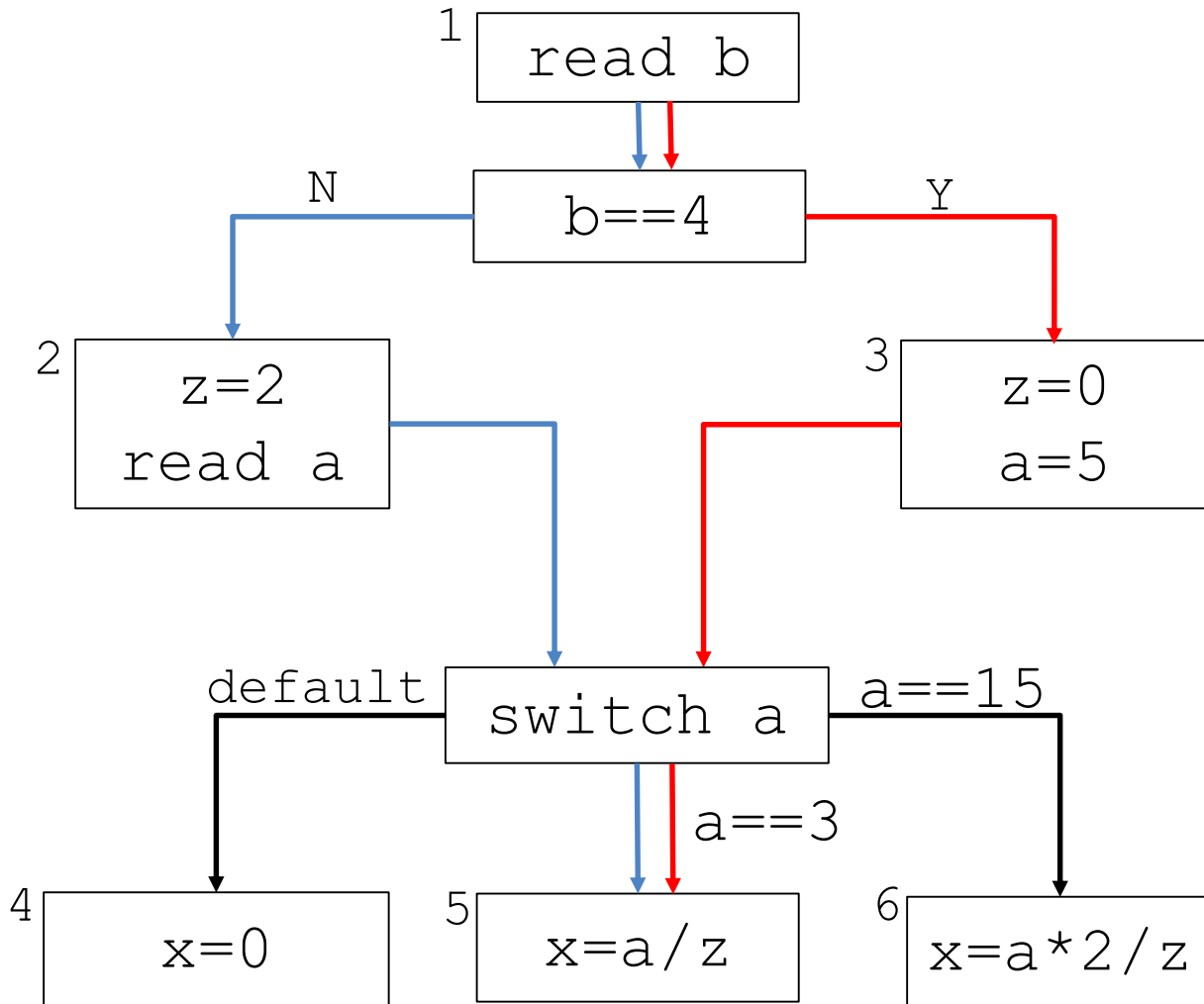
- Background : Solutions of Data Flow Analysis
- Motivation
- Our Solution
- Experiments and Results
- Direction of Future Work

Data Flow Analysis

Values of z at node 5 ?



Meet Over Paths (MOP) Solutions

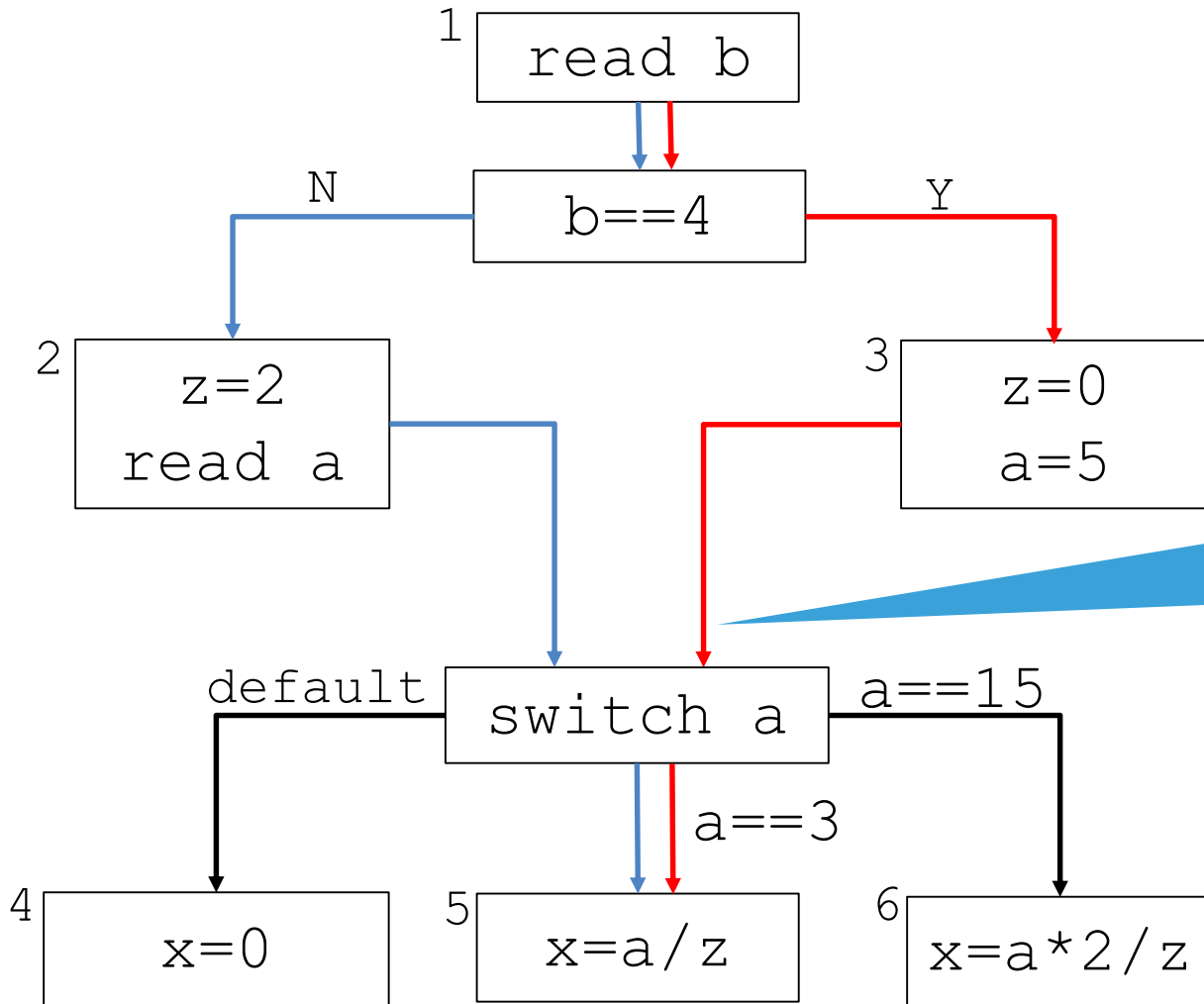


Values of z at node 5 ?

- Computes value along each path separately

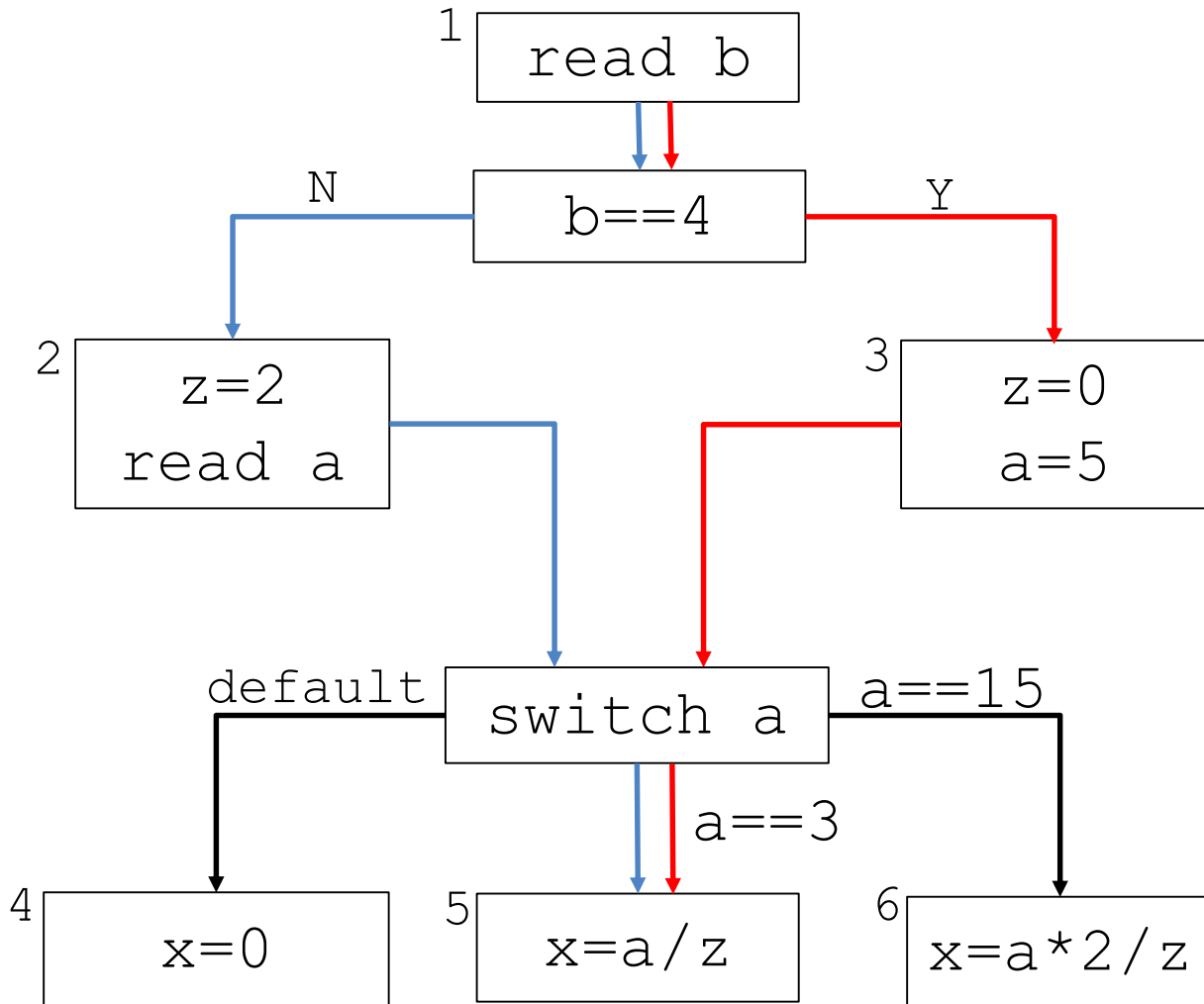
Node	Value of z from paths	
	Blue	Red
5	$z=2$	$z=0$

Meet Over Paths (MOP) Solutions



- An Infeasible Path
- Approaches exist to detect such paths

Meet Over Paths (MOP) Solutions

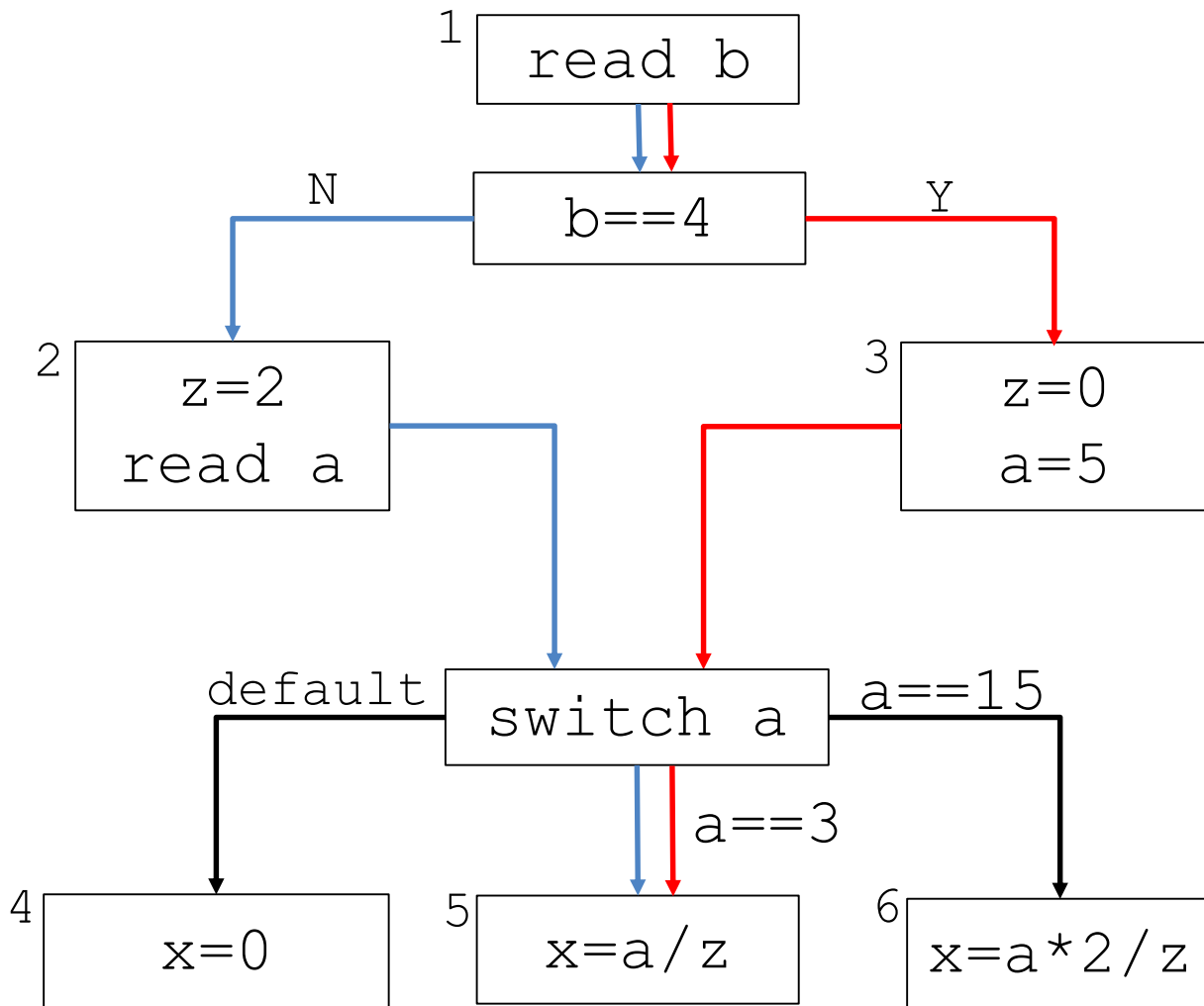


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Meet Over Paths (MOP) Solutions



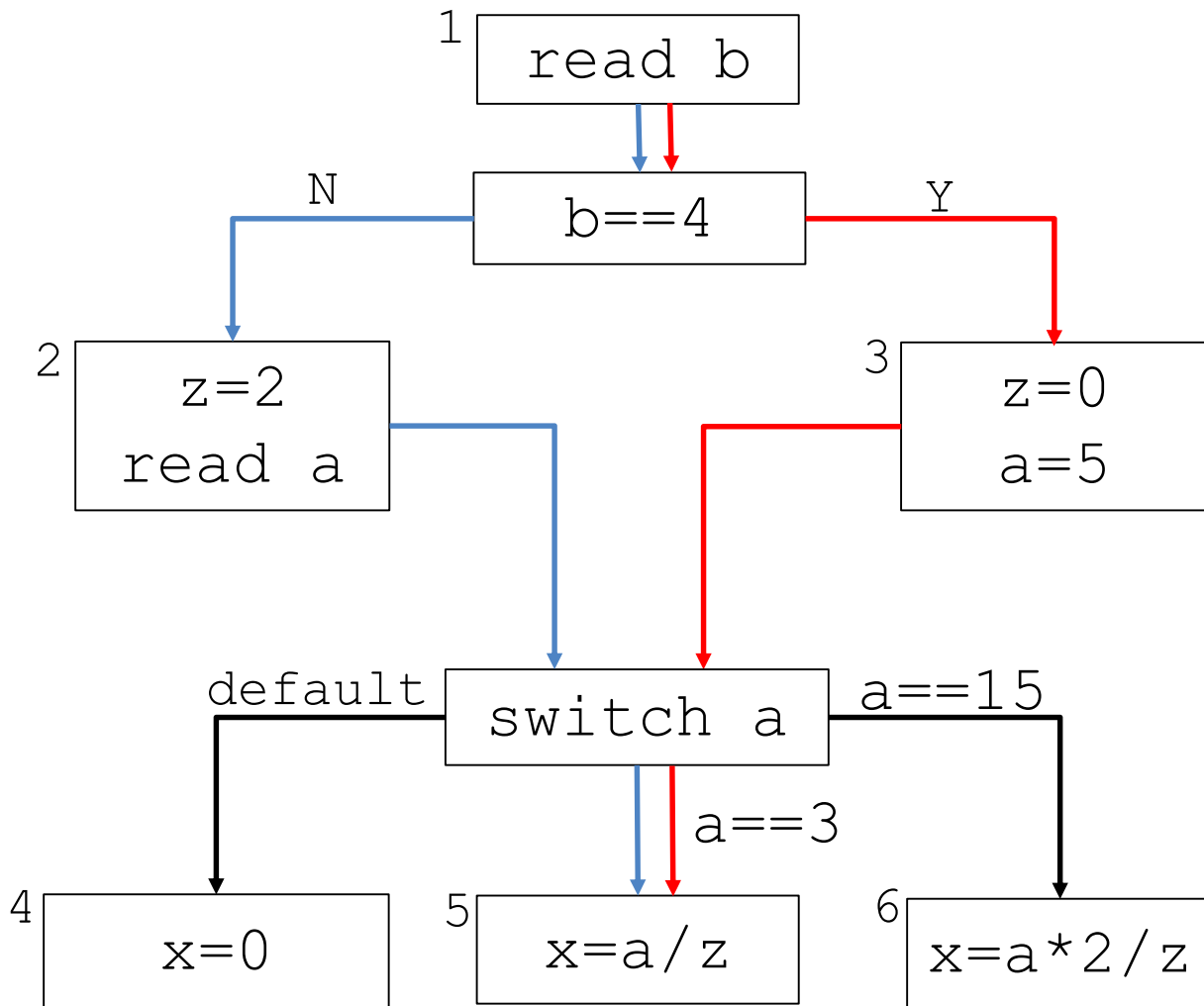
Values of z at node 5 ?

- Computes value along each path separately

Node	Value of z from paths	
	Blue	Red
5	$z=2$	$z=0$

- Red path is infeasible so $z=0$ is discarded, so $z=2$. (Precise)
- Not Scalable: maintains values of the order of $O(\text{number of paths} * \text{number of nodes})$
- Number of paths is exponential.

Maximum Fix Point (MFP) Solutions



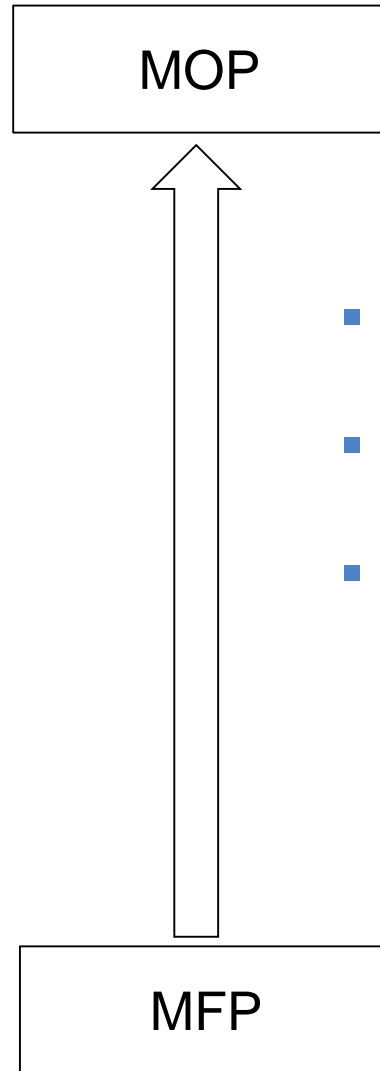
Values of z at node 5 ?

- Compute range of values reaching along all paths

Node	Value Range of z from all paths
5	$z=[0,2]$

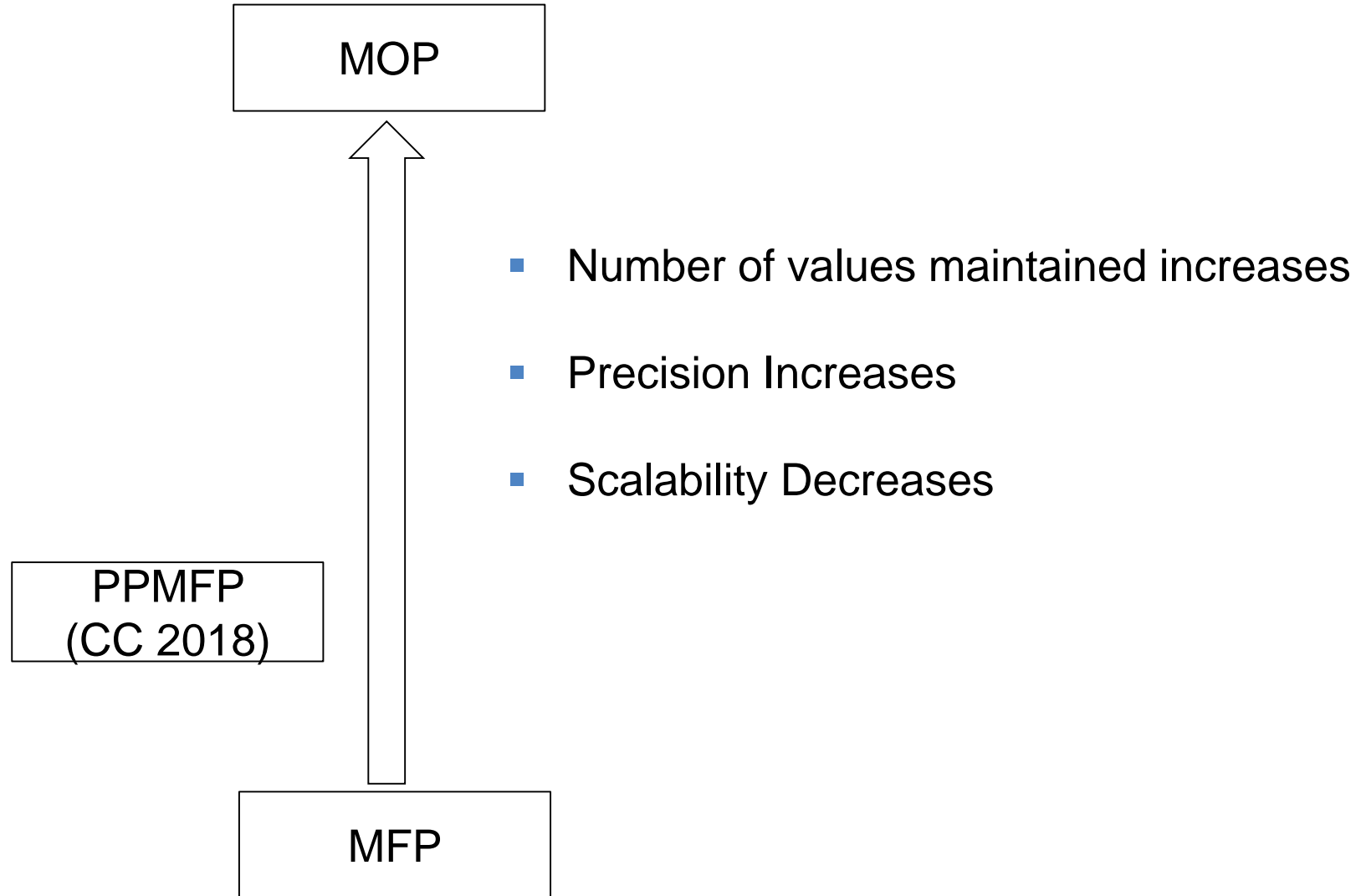
- Scalable: computes only one value per program point
- Imprecise: $z=0$ is included which reaches along infeasible path (marked in red)

Scalability and Precision Trade-off

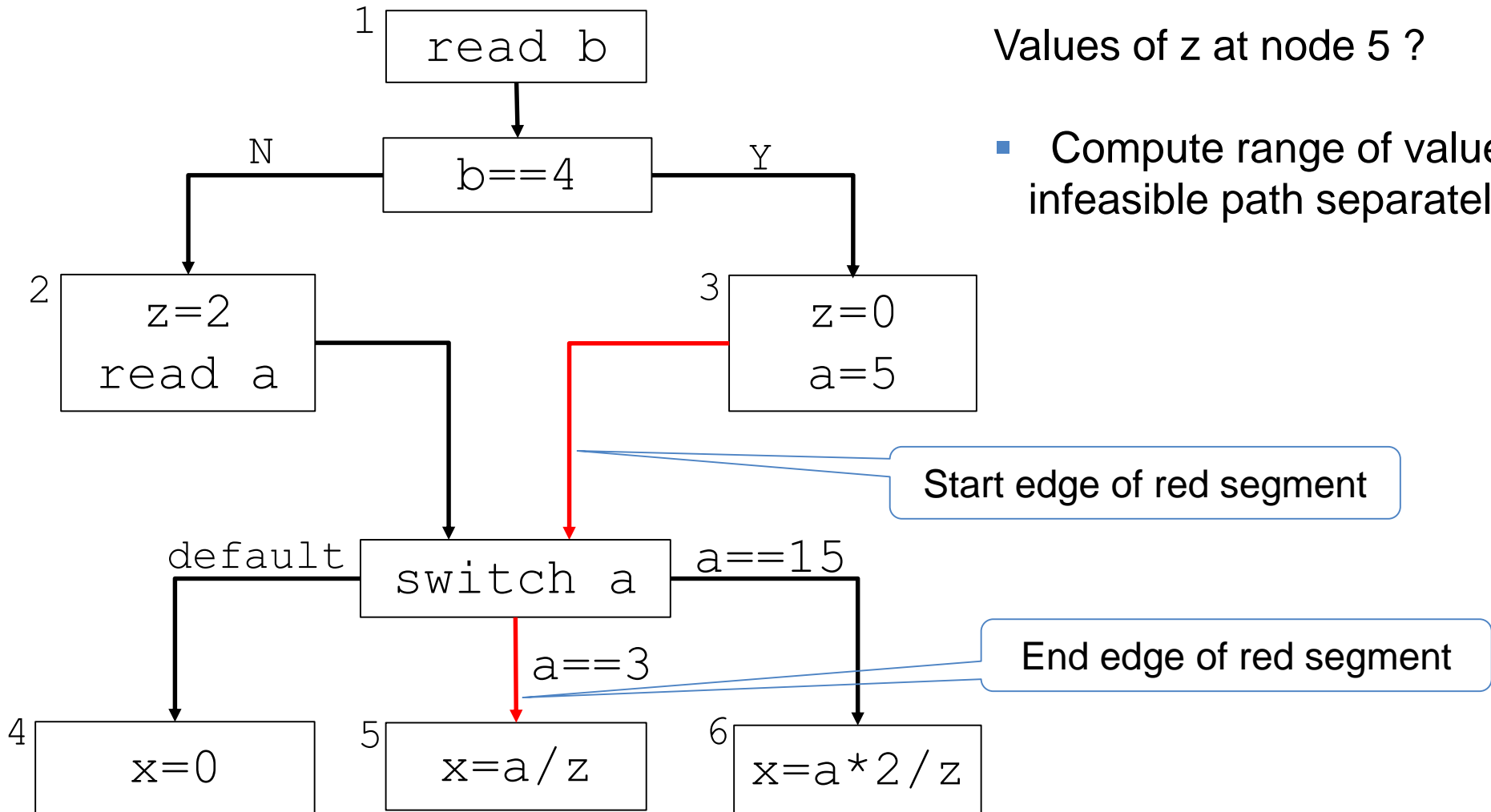


- Number of values maintained increases
- Precision Increases
- Scalability Decreases

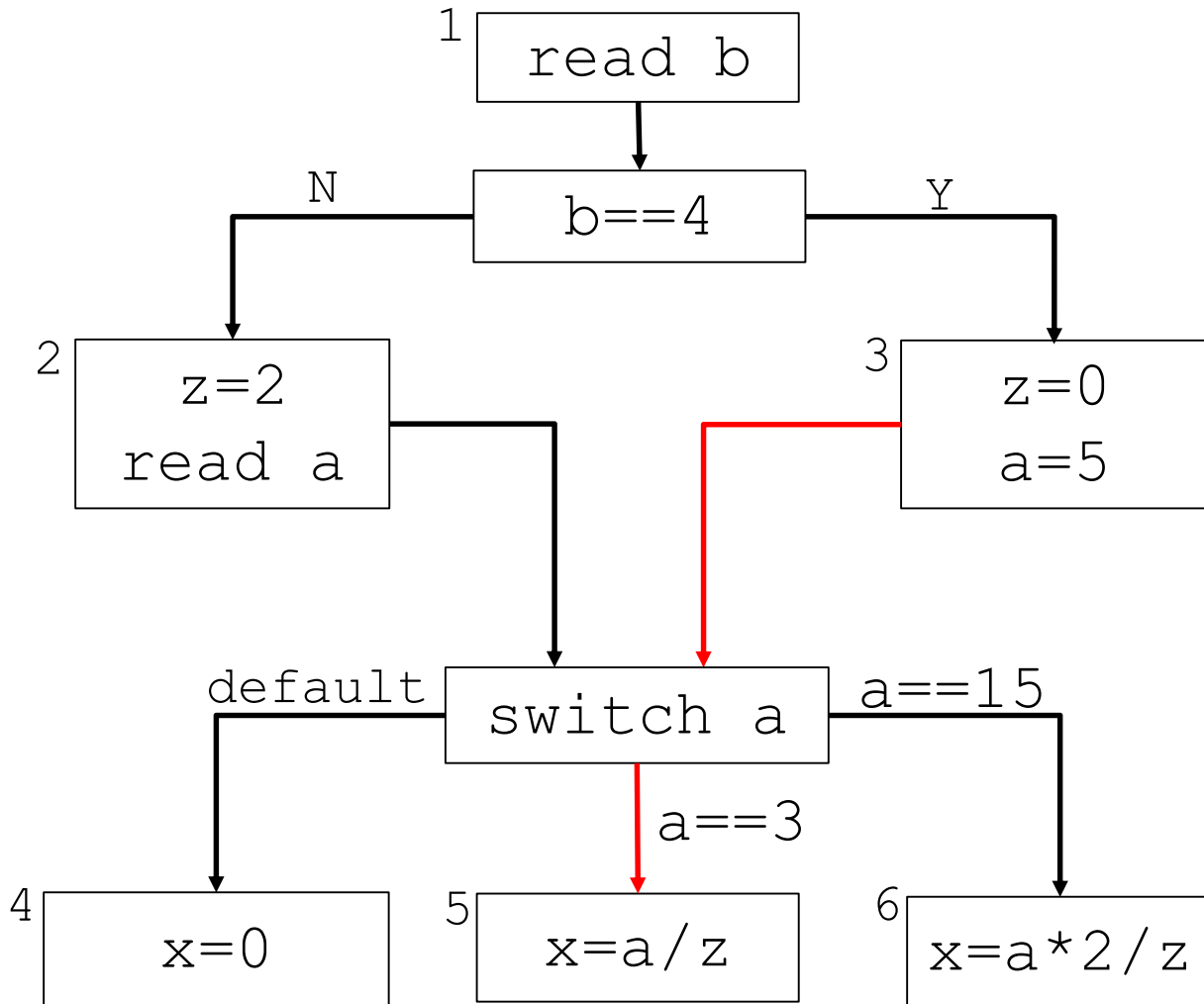
Partially Path Sensitive Solutions



Prior Work: PPMFP (CC 2018)



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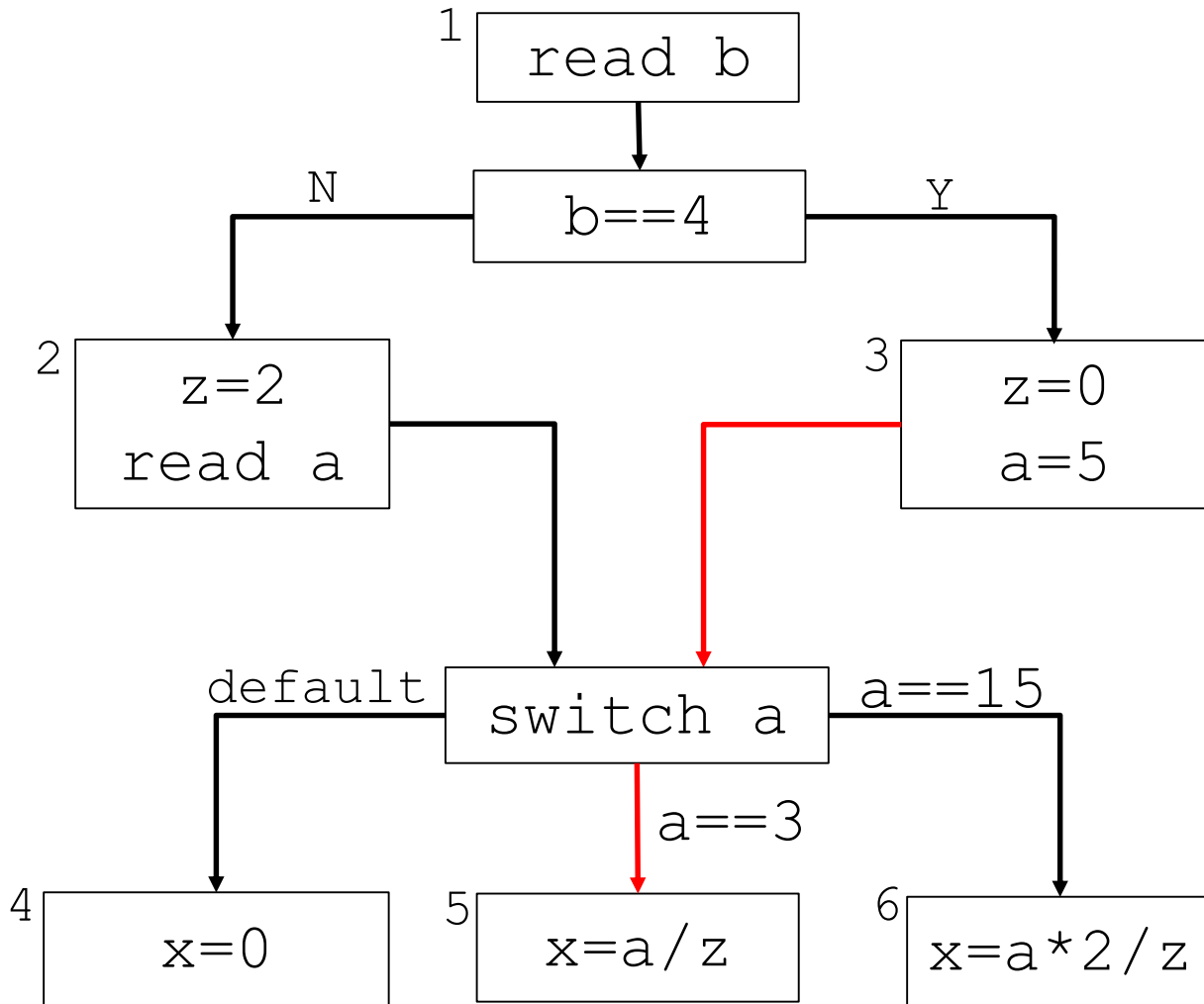


Values of z at node 5 ?

- Compute range of values along feasible and infeasible path separately

Node	Value range of z from	
	Feasible Paths	Infeasible segment start Red
4	$z=[2,2]$	$z=[0,0]$
5	$z=[2,2]$	$z=[0,0]$
6	$z=[2,2]$	$z=[0,0]$

Prior Work: PPMFP (CC 2018)

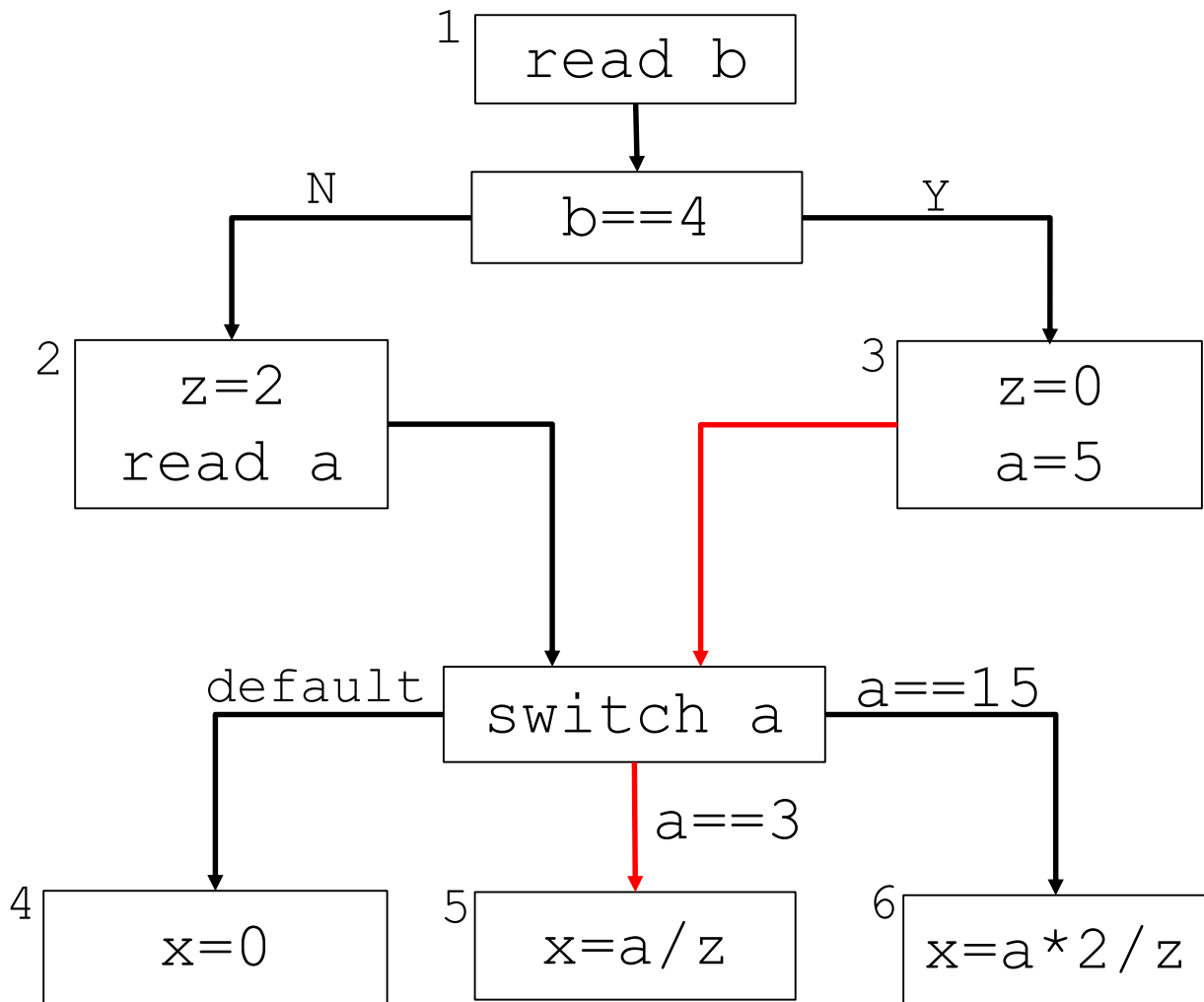


Values of z at node 5 ?

- Compute range of values along feasible and infeasible path separately

Node	Value range of z from	
	Feasible Paths	Infeasible segment start Red
4	$z=[2,2]$	$z=[0,0]$
5	$z=[2,2]$	$z=[\text{X}, 0]$
6	$z=[2,2]$	$z=[0,0]$

Prior Work: PPMFP (CC 2018)



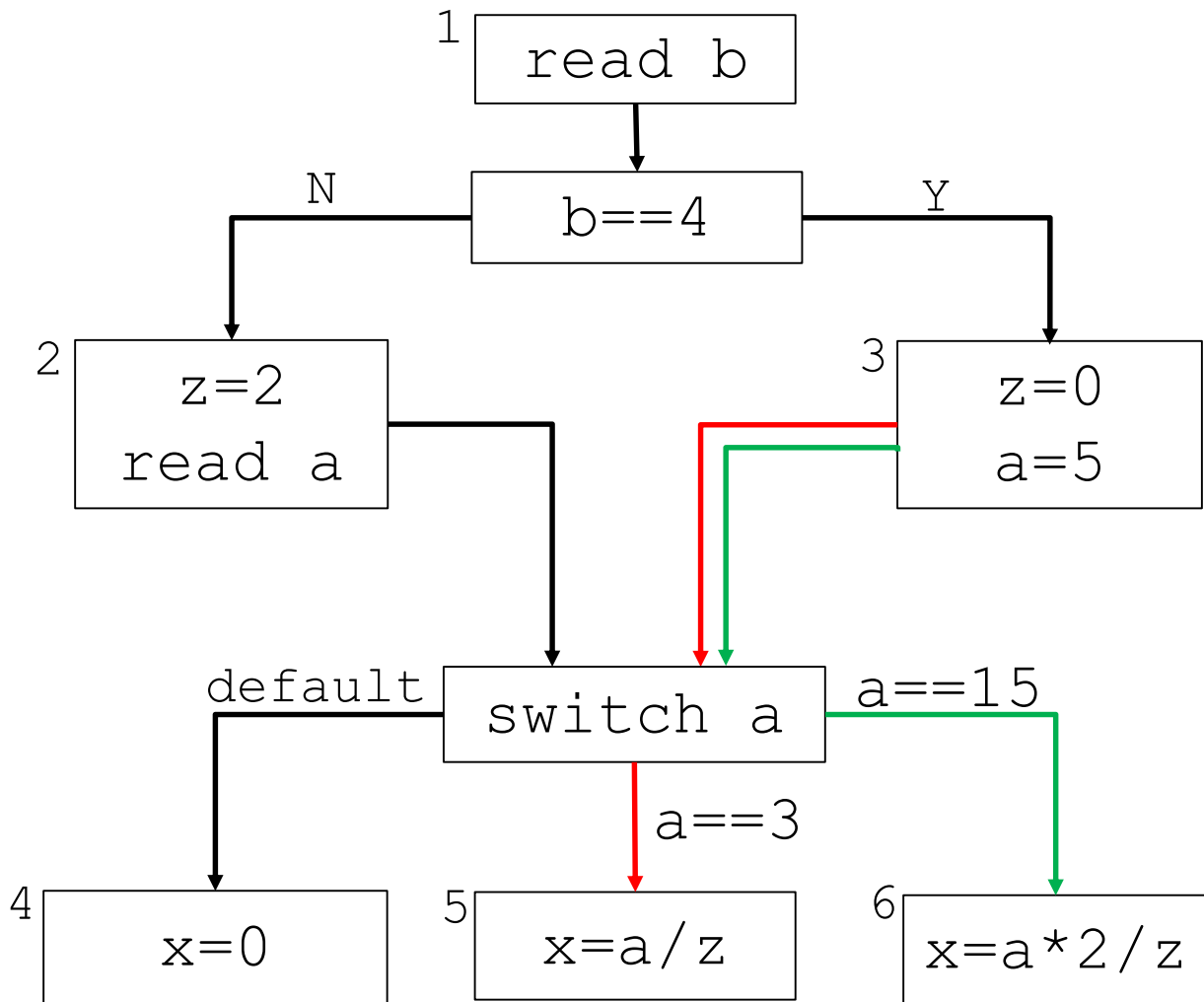
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- The final range is meet of ranges from all buckets (except discarded ranges)

Green Path Segment is also Infeasible



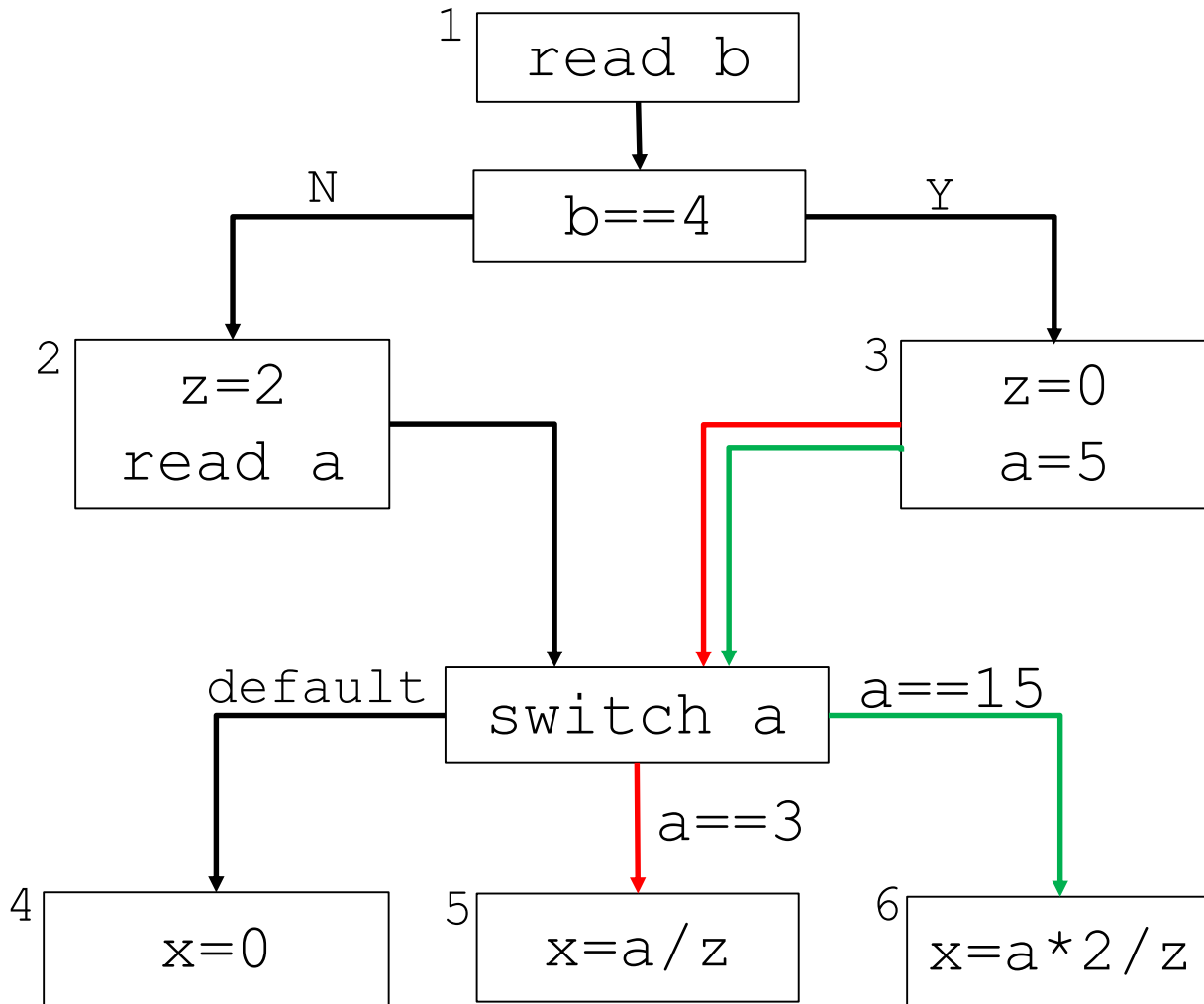
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One bucket for Green path segment

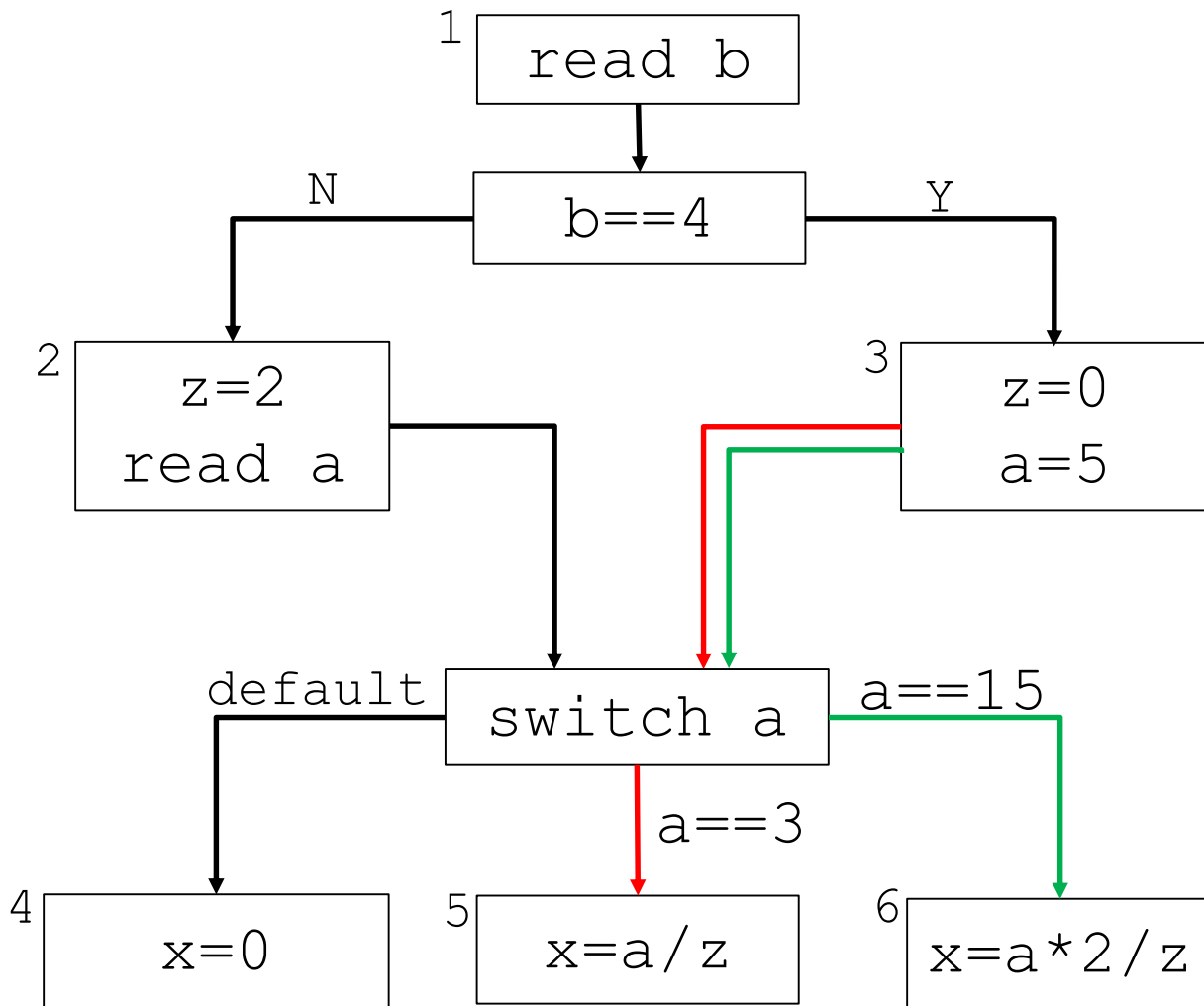


Values of z at node 5 ?

- Compute range of values along feasible and infeasible path separately

Node	Value range of z from		
	Feasible Paths	Infeasible segment start Red	Green
4	$z=[2,2]$	$z=[0,0]$	$z=[0,0]$
5	$z=[2,2]$	$z=\text{X}0$	$z=[0,0]$
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Prior Work: PPMFP (CC 2018)

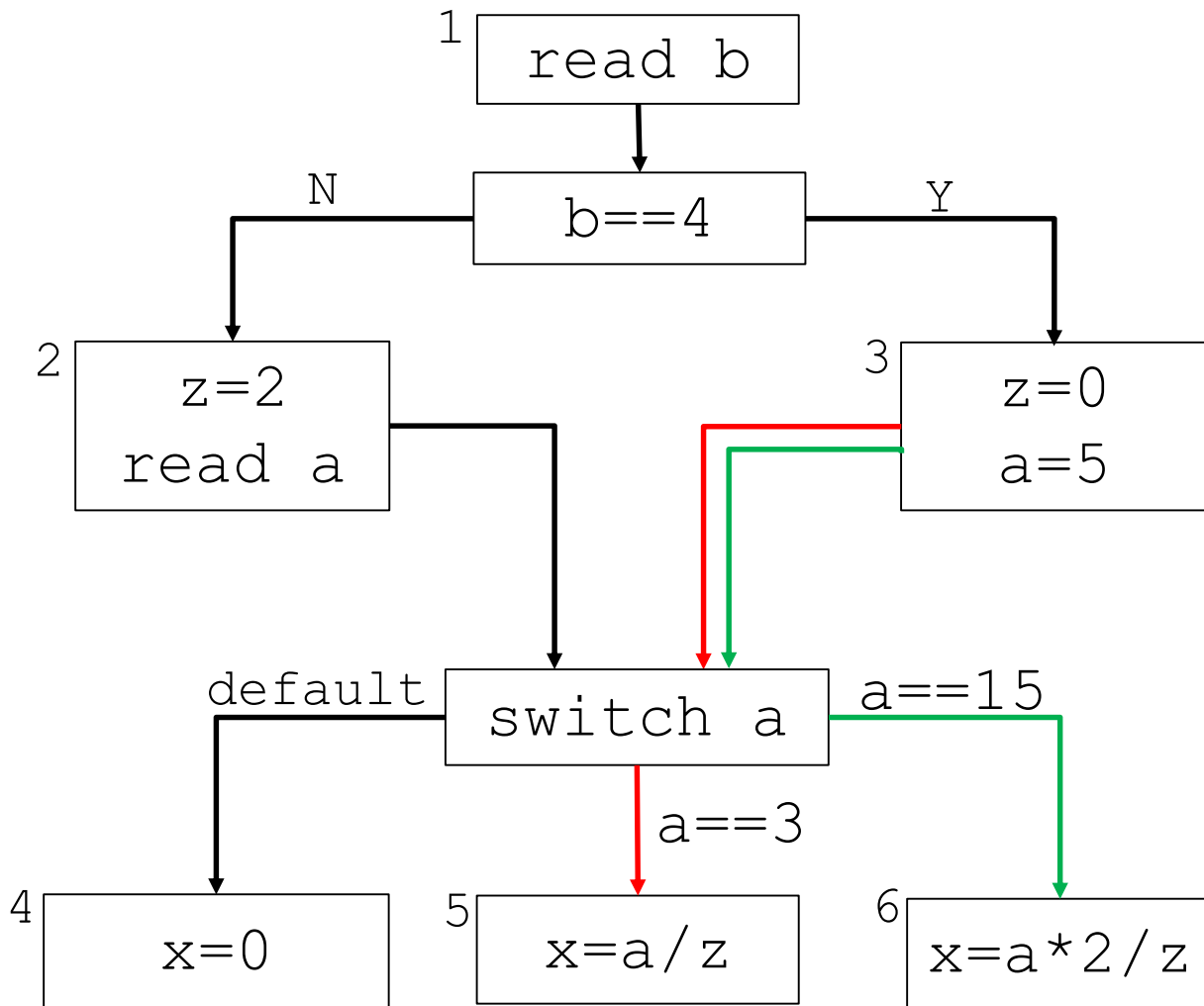


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		Red	Green
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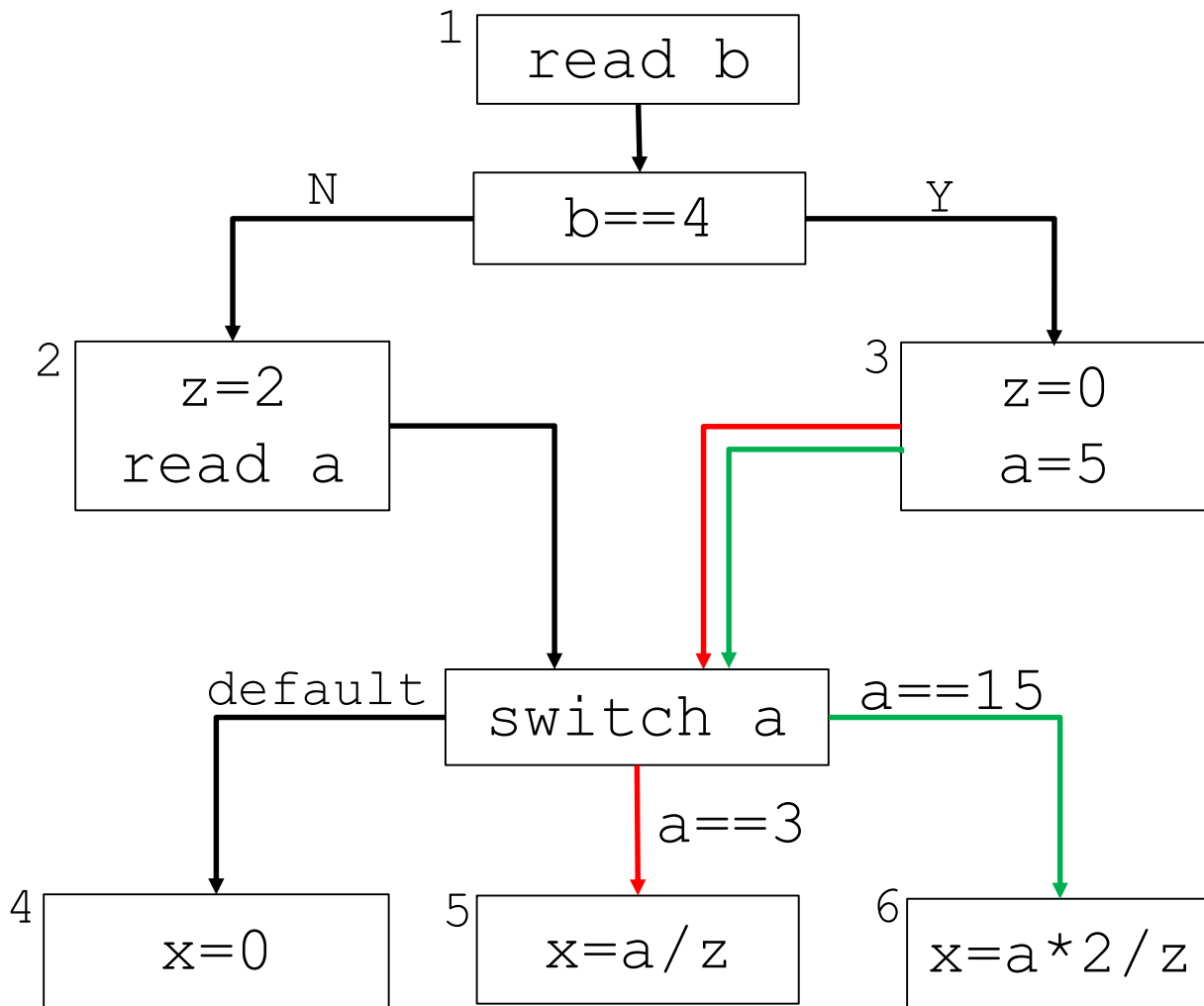


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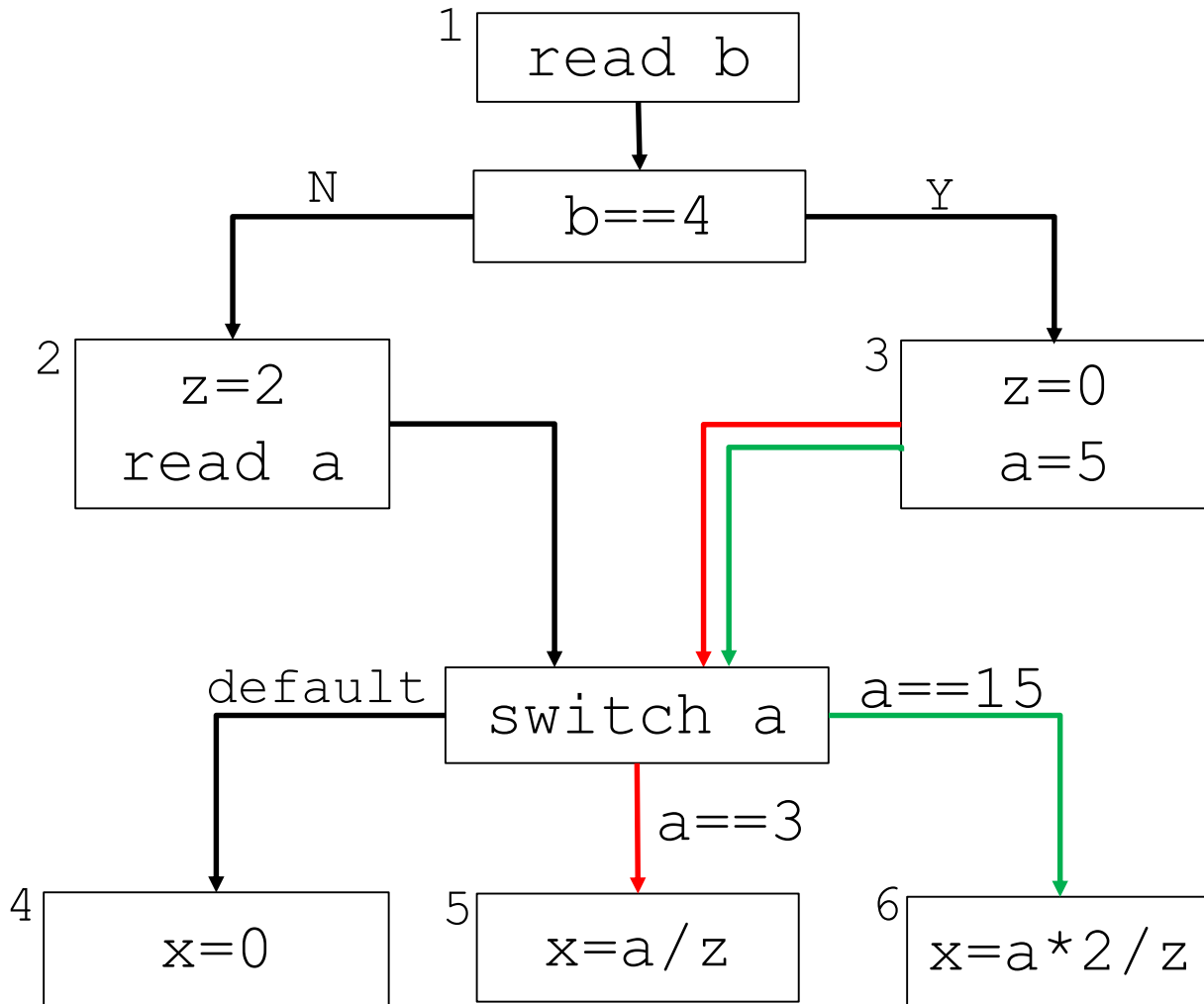
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	Feasible Paths	Infeasible segment start Red	Green
4	$z=[2,2]$	$z=[0,0]$	$z=[0,0]$
5	$z=[2,2]$	$z=\text{X}[0]$	$z=[0,0]$
6	$z=[2,2]$	$z=[0,0]$	$z=\text{X}[0]$

- Imprecise: $z=[0,0]$ is part of green bucket at node 5 and data flow value in green bucket is not discarded at node 5.

Intersecting Infeasible Path Segments

- On average 70% infeasible path segments were intersecting in our benchmarks
- Keeping one bucket for one path segment creates duplication, which brings imprecision
- We need to create buckets that represent group of path segments to achieve precision

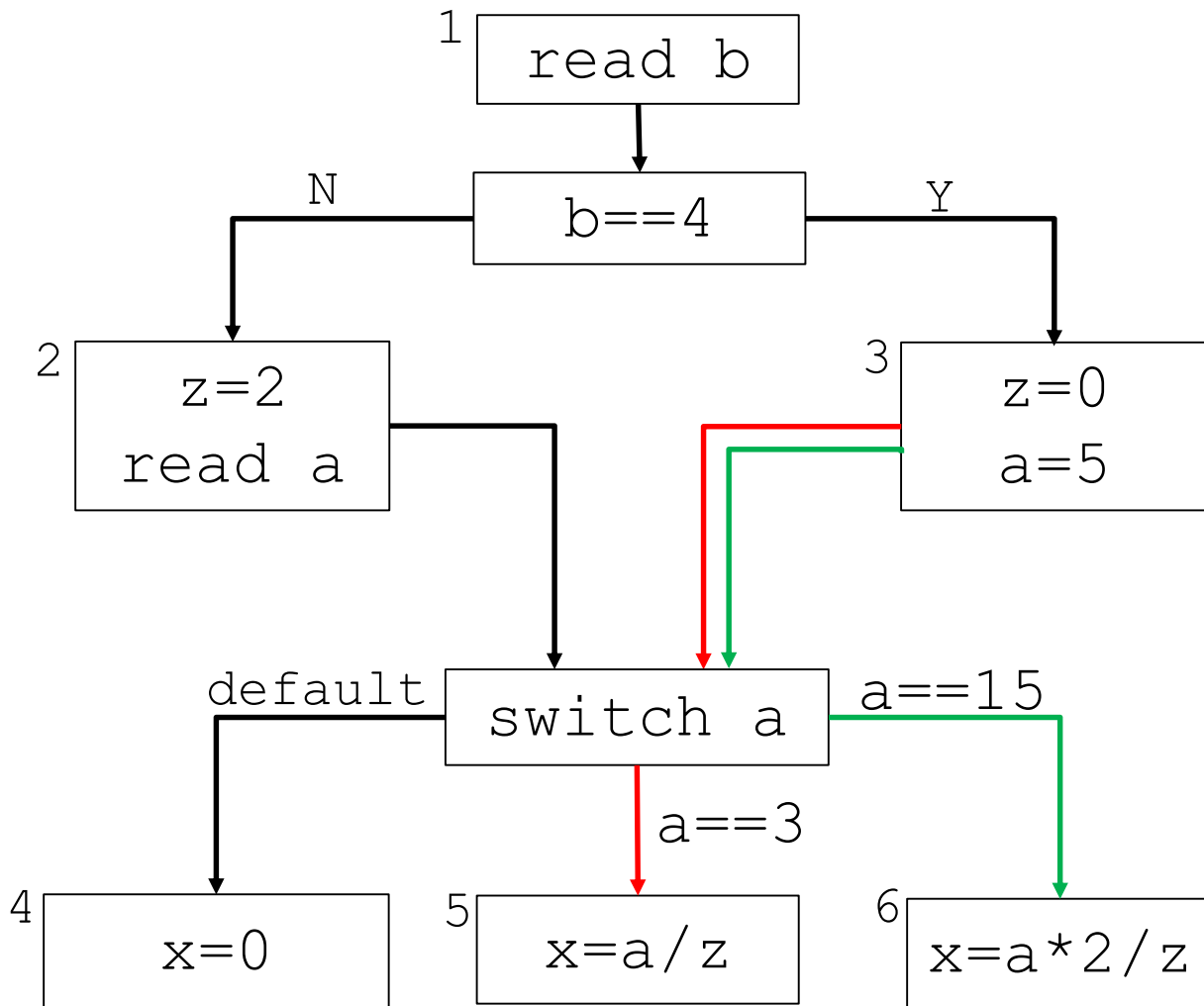
Our Idea



- Keep a bucket for each color combination (each color represents one infeasible path segment)

Node	Feasible Paths	Value range of z from		
		Infeasible segment start		
		Red	Green	Red \wedge Green
5	$z=[2,2]$			$z=[0,0]$
6	$z=[2,2]$			$z=[0,0]$

Our Idea



- Keep a bucket for each color combination (each color represents one infeasible path segment)

Node	Feasible Paths	Value range of z from		
		Infeasible segment start		
		Red	Green	Red \wedge Green
5	$z=[2,2]$			$z=$ 0
6	$z=[2,2]$			$z=$ 0

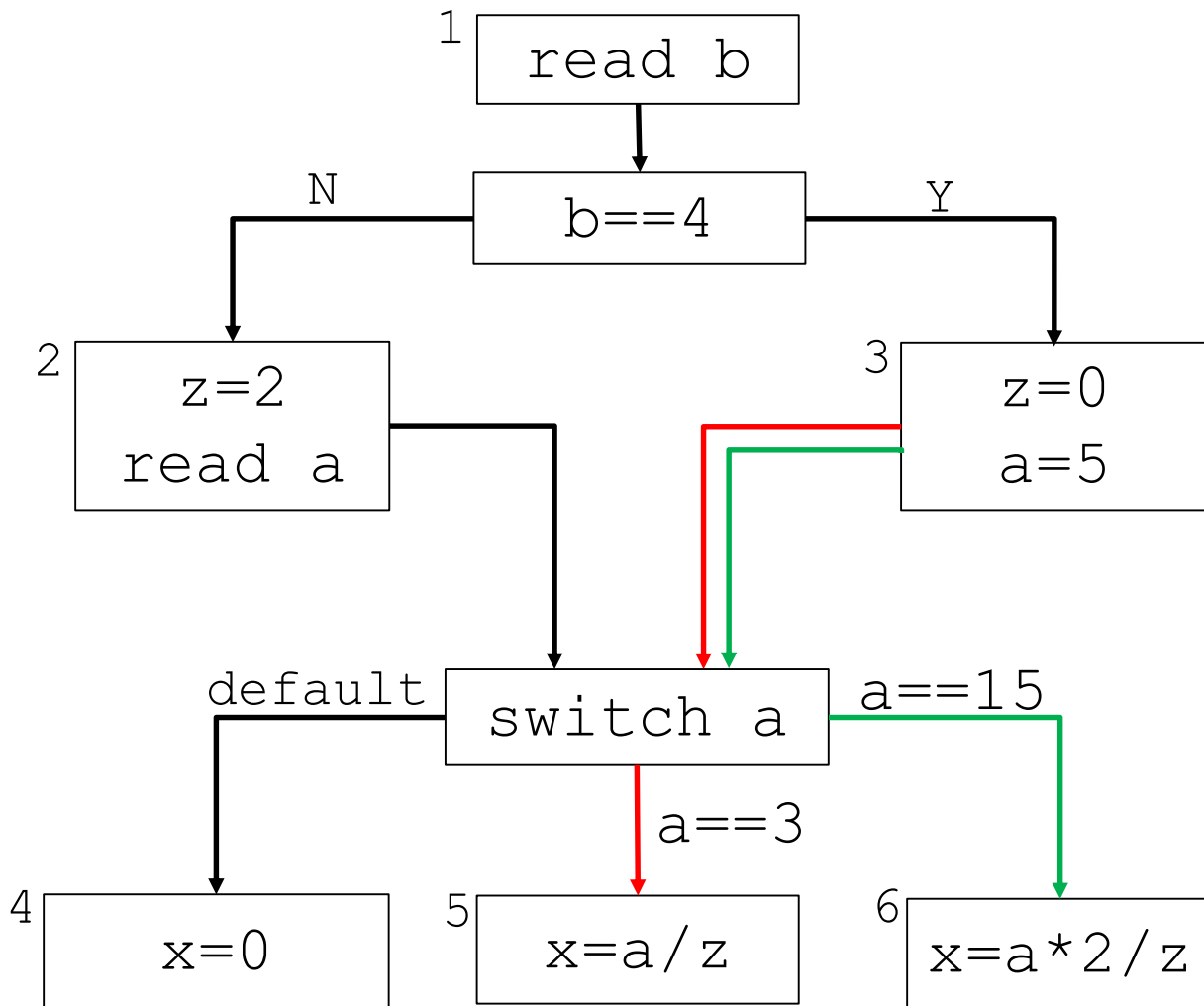
Why Prior Work (PPMFP) Did Not Do It

- Low assessed Impact: How many Infeasible Path Segments are intersecting?
- High cost - seems that exponential number of Buckets will be required: For K infeasible path segments:
 1. PPMFP Solution keeps K buckets
 2. Our Solution will require 2^K buckets?(Seems as bad as MOP solution in terms of complexity)

Our Contribution

- Low assessed Impact: How many Infeasible Path Segments are intersecting? **Average 70%**
- High cost - seems that exponential number of Buckets will be required: For K infeasible path segments:
 1. PPMFP Solution keeps K buckets
 2. Our Solution will require 2^K buckets? **Requires number of buckets = $O(\text{Number of Edges})$**
(Seems as bad as MOP solution in terms of complexity)
- We propose heuristics to reduce number of buckets even further

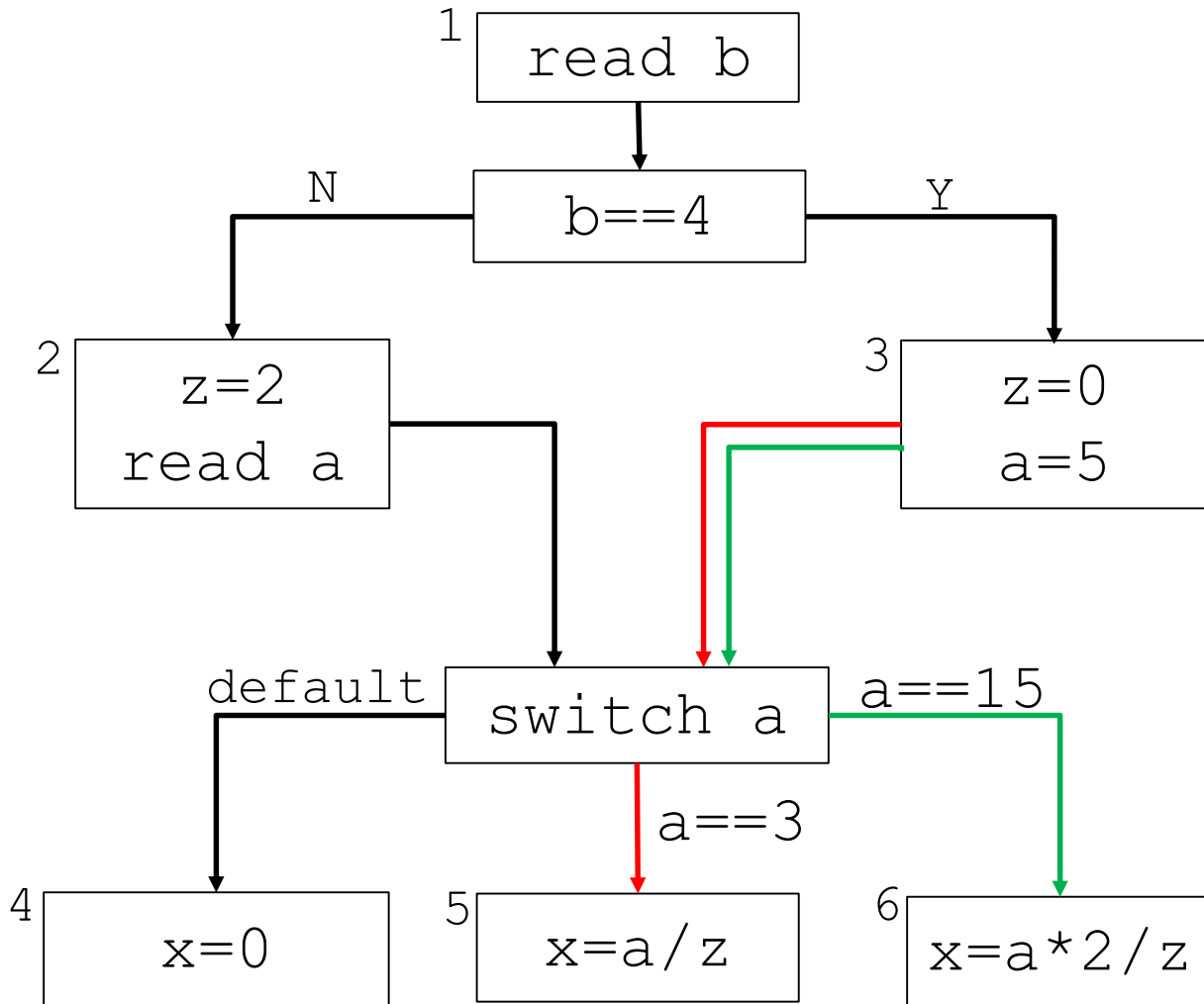
How Many Buckets



- A Data Flow Value at a node is assigned to buckets representing colors of outgoing edges
- Maximum buckets at a node = | out edges |
- Total buckets = $N * E$, $E = | \text{out edges} |$

Reducing Number of Buckets

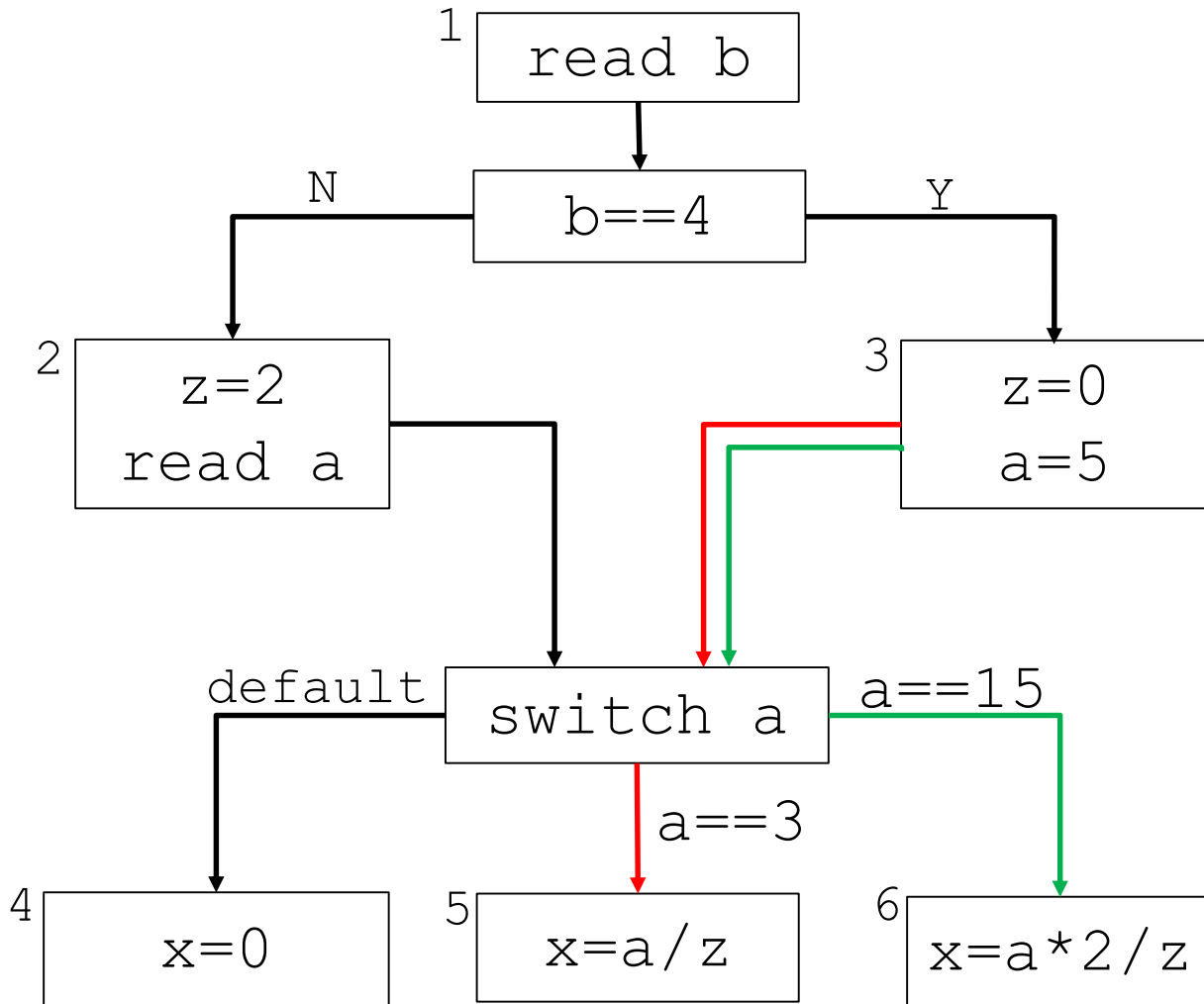
1. Eliminate Empty Buckets



Node	Feasible Paths	Value range of z from		
		Infeasible segment start		
		Red	Green	Red \wedge Green
5	$z=[2,2]$			$z=[0,0]$
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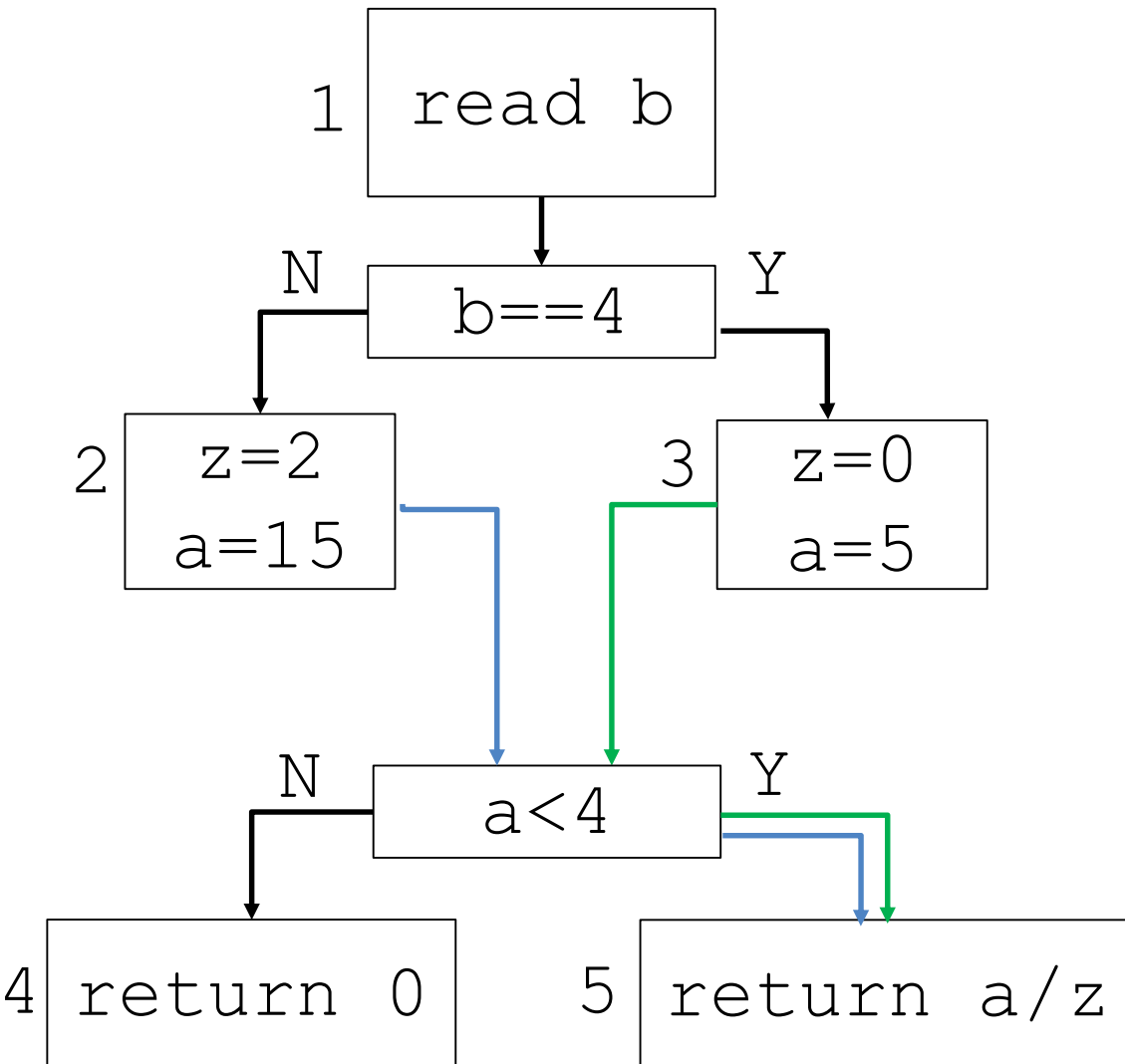
Reducing Number of Buckets

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Reducing Number of Buckets



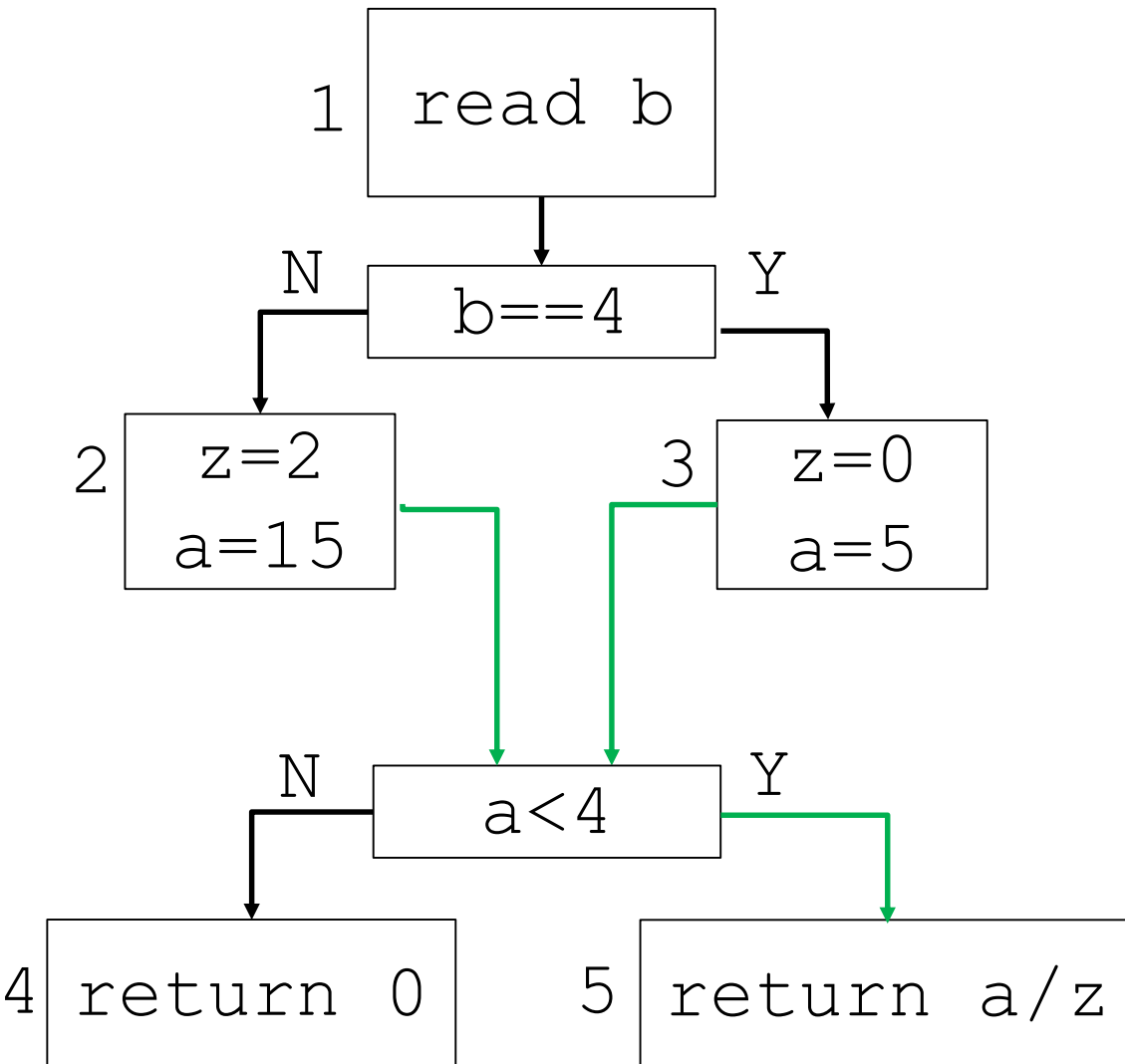
2. Merge bucket with same infeasibility Constraint

- Infeasibility condition: $a < 4 = \text{false}$, is same for blue and green path.

Node	Value range of z from		
	Feasible Paths	Infeasible segment start	
		Blue	Green
5		z=[2,2]	z=[0,0]

- So one bucket is sufficient for blue and green paths

Reducing Number of Buckets



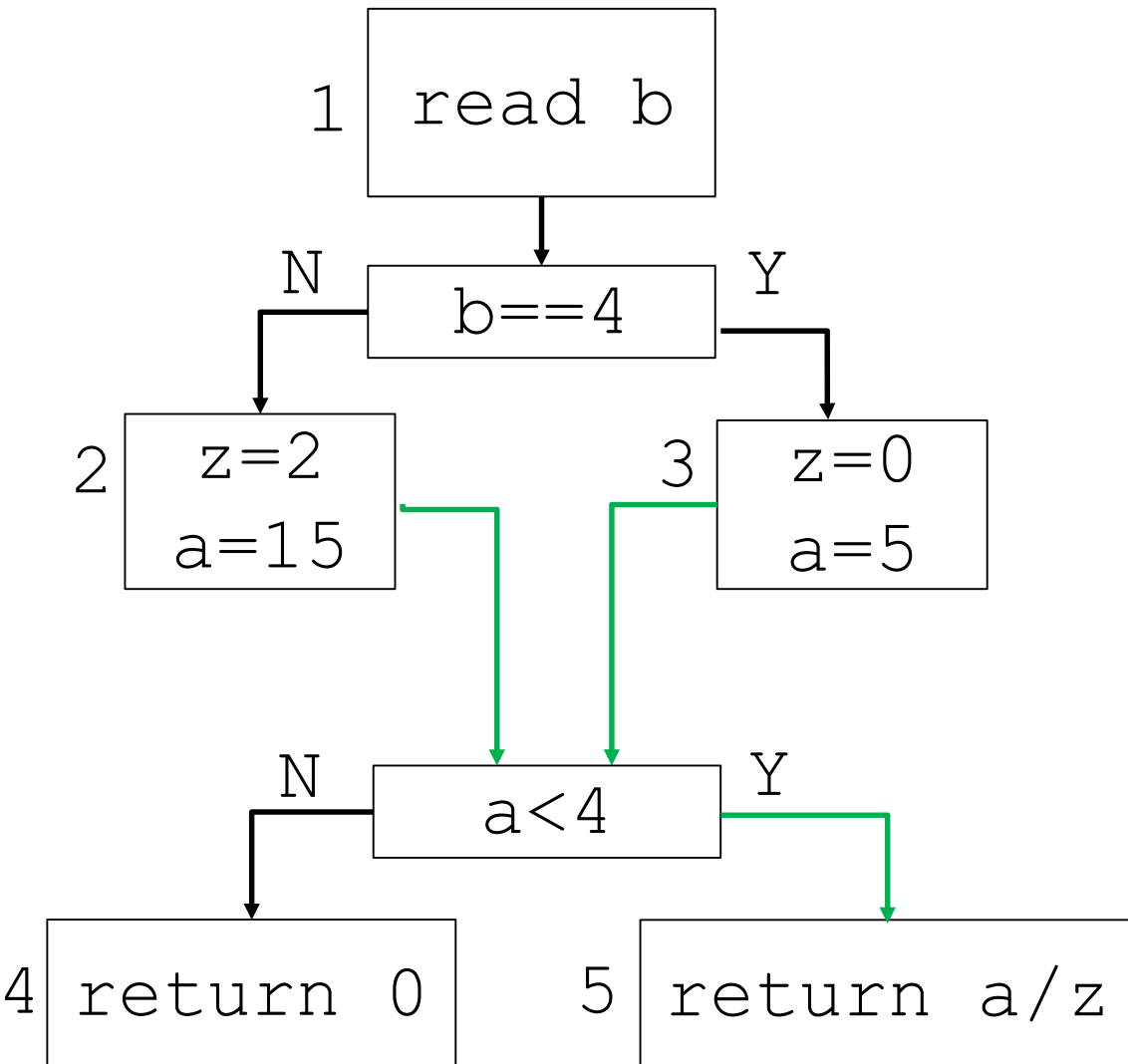
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Value range of z from		
Node	Feasible Paths	Infeasible segment start Green
5		$z=[0,2]$

- So one bucket is sufficient for blue and green paths

Reducing Number of Buckets



2. Merge bucket with same infeasibility Constraint

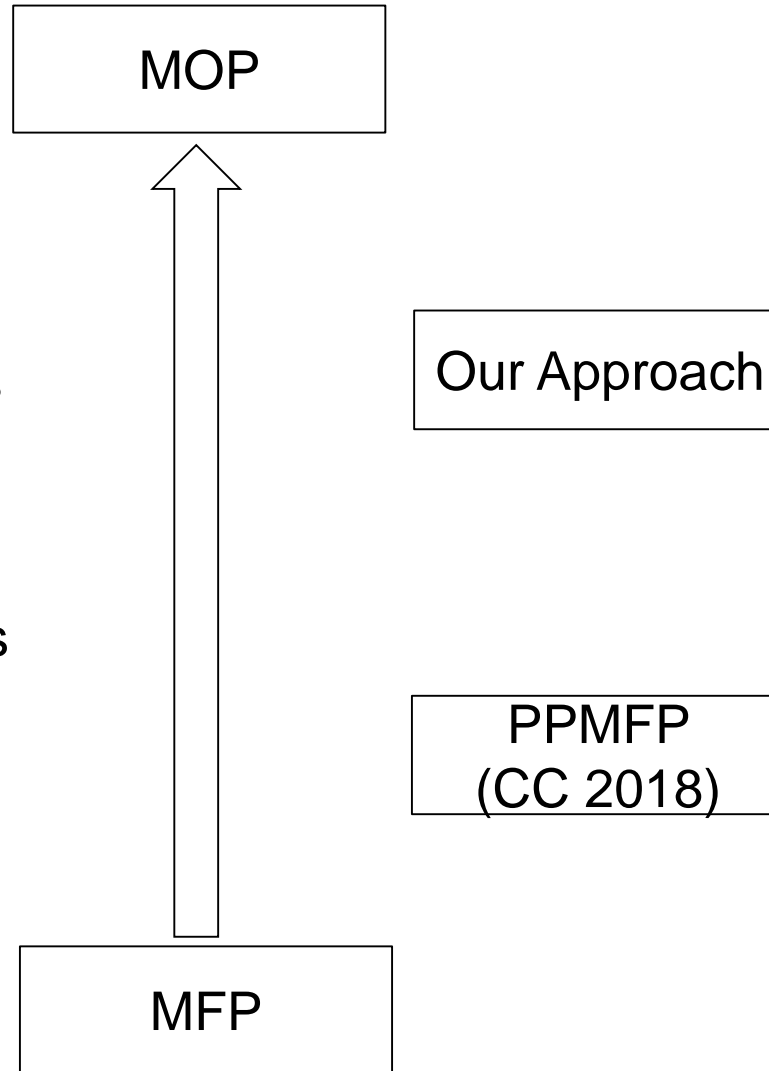
- Infeasibility condition: $a < 4 = \text{false}$, is same for blue and green path.

Value range of z from		
Node	Feasible Paths	Infeasible segment start Green
5		z=1 , 2]

- So one bucket is sufficient for blue and green paths

Related Work

- Number of values maintained increases
- Precision Increases
- Scalability Decreases



Benchmarks and Results

Benchmarks:

- Seven open source benchmarks: SPEC CPU 2006
- Three industry benchmarks

Results:

1. Improvement – up to 3 times improvement over PPMFP.
 - Up to 20% reduction in reaching definitions
 - Up to 10% reduction in uninitialized variables.
2. Analysis Time: Up to 300% more than PPMFP.

Future Work

- Detecting infeasible path segments in presence of Arrays and Pointers in condition expressions is an open problem.
- Improving scalability of the approach, currently scales to 75KLoc



Thank You