

# طراحی الگوریتم ها

## جلسه هجدهم: شاخه و حد

**سجاد شیرعلی شهرضا**

**بهار، 1402**

**یکشنبه، 24 اردیبهشت 1402**

## اطلاع رسانی

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# ریش شاخه و حد

## Situation

- Sometimes it is not easy to design a DP or greedy solution
- Checking all possible answers is not feasible either

## Situation -> Idea

- Sometimes it is not easy to design a DP or greedy solution
- Checking all possible answers is not feasible either
- Idea: stop exploring a path if we know it would not give us a better answer
  - Keep an estimate of how good the answer will be
  - Continue the path with the highest possible answer
  - Stop a path if it cannot provide a better solution

# 0/1 Knapsack

- n items
  - Each has a weight  $w_i$  and value  $v_i$
- A knapsack (i.e., bag) with capacity  $W$
- Goal: fill the bag such that
  - Total weight of items is less than or equal to  $W$ 
    - $\sum w_i \leq W$
  - The value of selected items is maximised
    - $\sum v_i$  is maximised



Capacity: **16**

Item:  
Weight:  
Value:



2

40



5

30



10

50



5





10

# Greedy Approach

- Sort items based on unit value
- Start with item with highest unit value
- Add item if it fits in the bag



Capacity: **16**





Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

## Greedy Approach - Not Working!

- Sort items based on unit value
- Start with item with highest unit value
- Add item if it fits in the bag
- Final answer is not necessarily the best one
  - Will select avocado, magnet, and quala with value 80
  - Best answer: select avocado and grape with value 90



Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2







# Branch and Bound Algorithm

- Start with an empty answer as partial answer
- Select the partial answer with highest bound
- Expand the partial answer by deciding whether to pick the next item
  - If selecting the item, update weight and value
- Calculate an upper bound for the answer
  - Fill the remaining capacity with highest remaining items in terms value/unit
- Continue while there is a partial answer that is not eliminated



Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2


# 0/1 Knapsack with Branch and Bound

- Start with an empty answer

weight = ?  
value = ?  
bound = ?



Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2


# 0/1 Knapsack with Branch and Bound

- Start with an empty answer
- Calculate upper bound for the value
  - $\text{bound} = 16 * 20 = 320$

```
weight = 0
value  = 0
bound  = 320
```



Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2


# 0/1 Knapsack with Branch and Bound

- Expand node with bound 320

weight = 0  
value = 0  
bound = 320

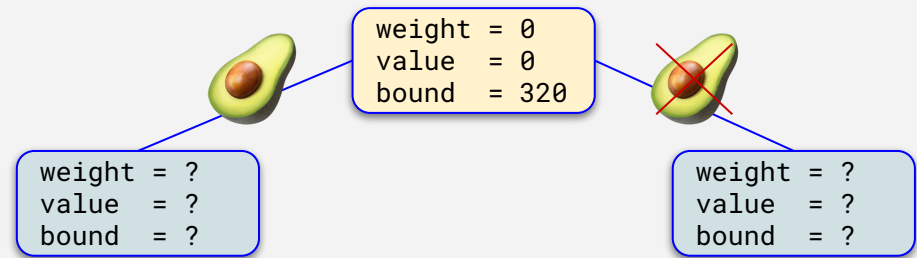


Capacity: **16**


Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand node with bound 320

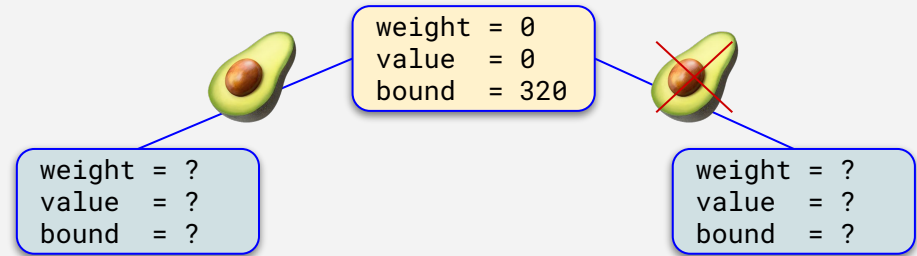


Capacity: **16**


Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Pick Avocado

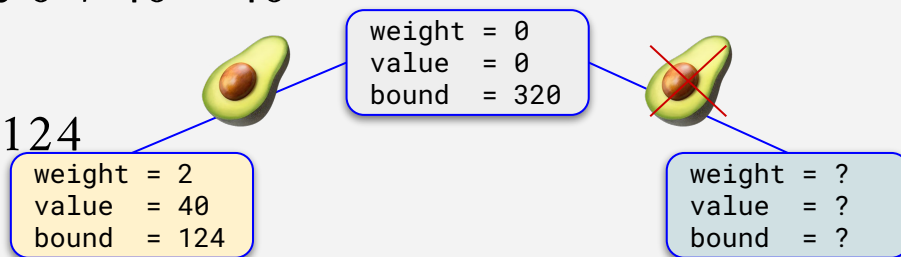


Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Pick Avocado
  - Found an answer with value  $0 + 40 = 40$
  - $\text{weight} = 0 + 2 = 2$
  - $\text{bound} = 40 + (16-2) * 6 = 124$

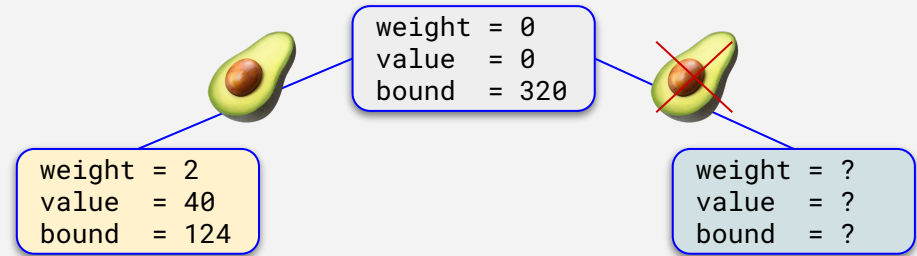


Capacity: **16**


Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Avocado



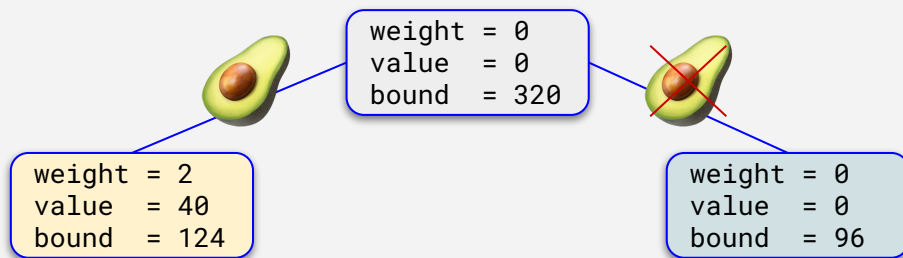
Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



# 0/1 Knapsack with Branch and Bound

- Do not pick Avocado
  - $\text{value} = 0 + 0 = 0$
  - $\text{weight} = 0 + 0 = 0$
  - $\text{bound} = 16 * 6 = 96$

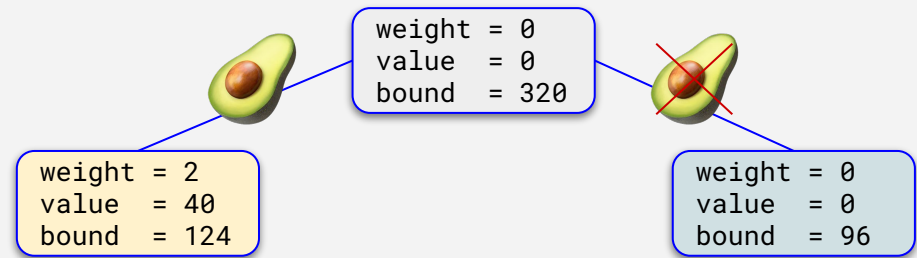


Capacity: **16**


Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand node with bound 124

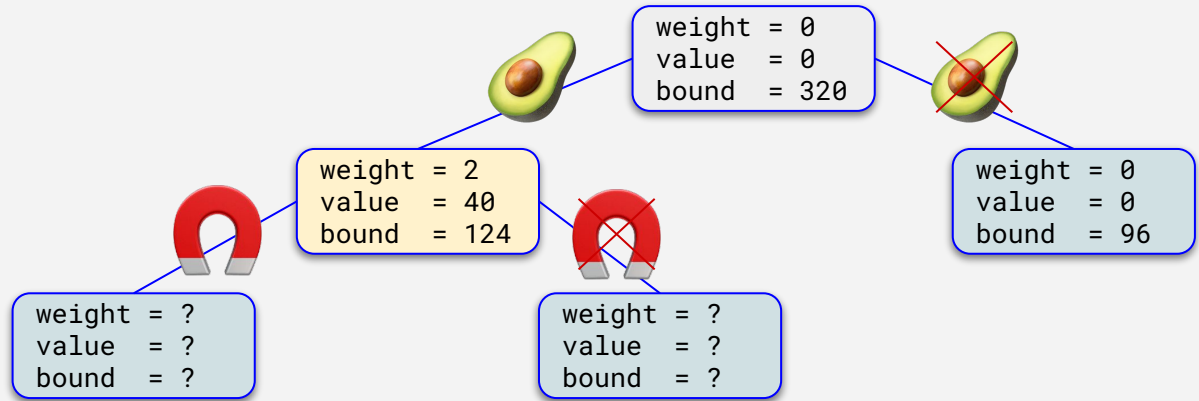


Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand node with bound 124

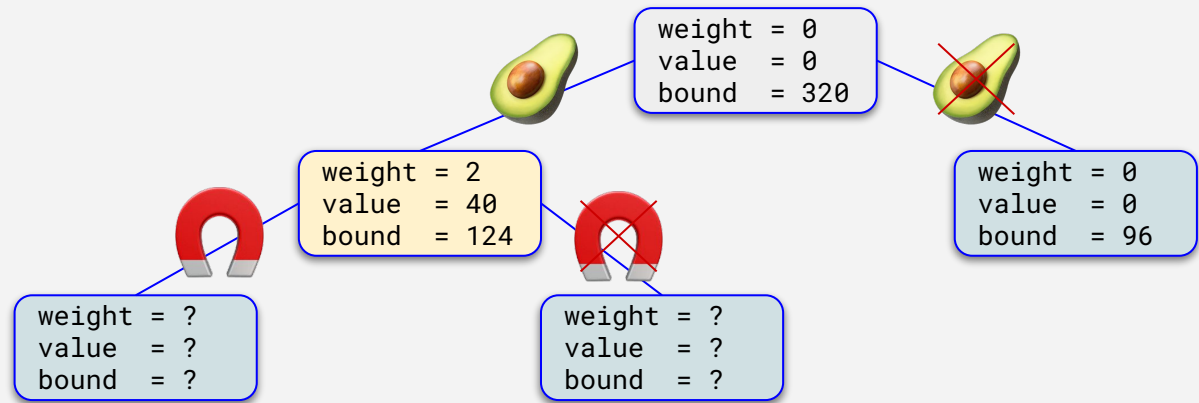


Capacity: **16**



Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Pick Magnet

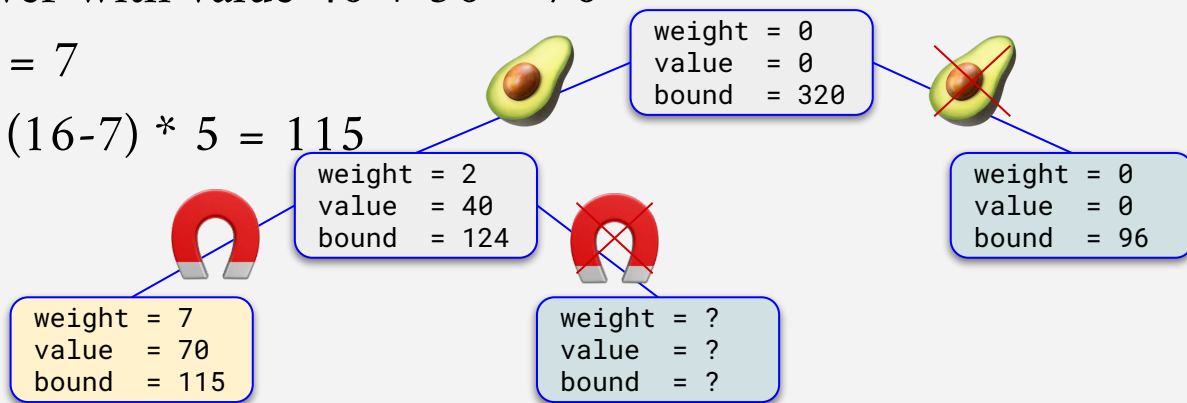


Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Pick Magnet
  - Found an answer with value  $40 + 30 = 70$
  - $\text{weight} = 2 + 5 = 7$
  - $\text{bound} = 70 + (16-7) * 5 = 115$

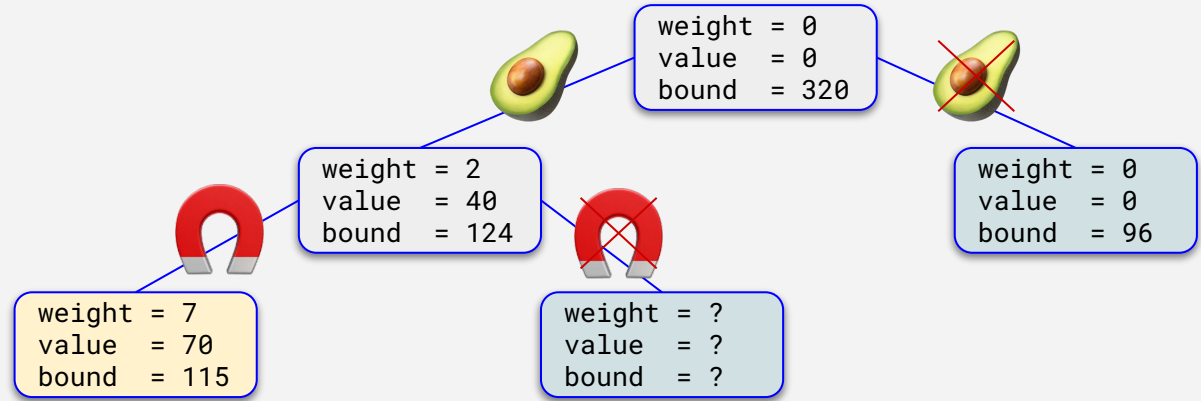


Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Magnet

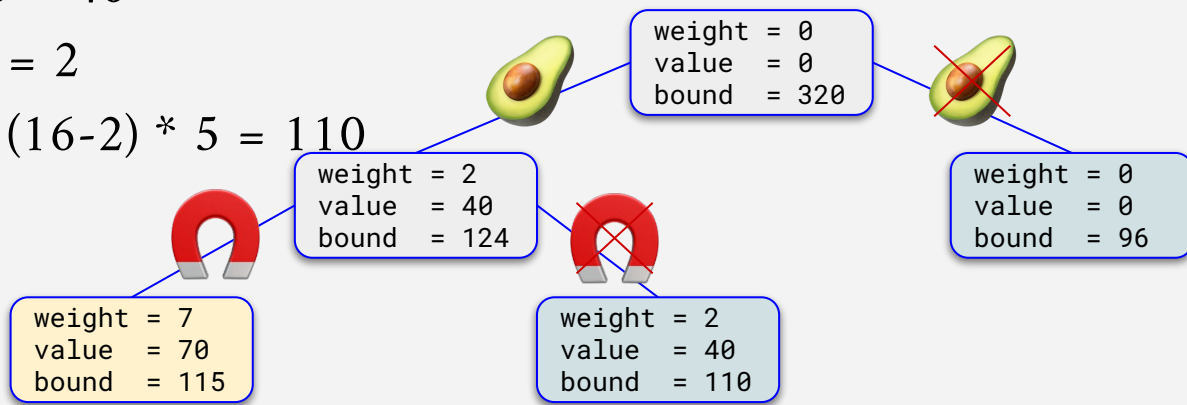


 Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Magnet
  - value =  $40 + 0 = 40$
  - wight =  $2 + 0 = 2$
  - bound =  $40 + (16-2) * 5 = 110$

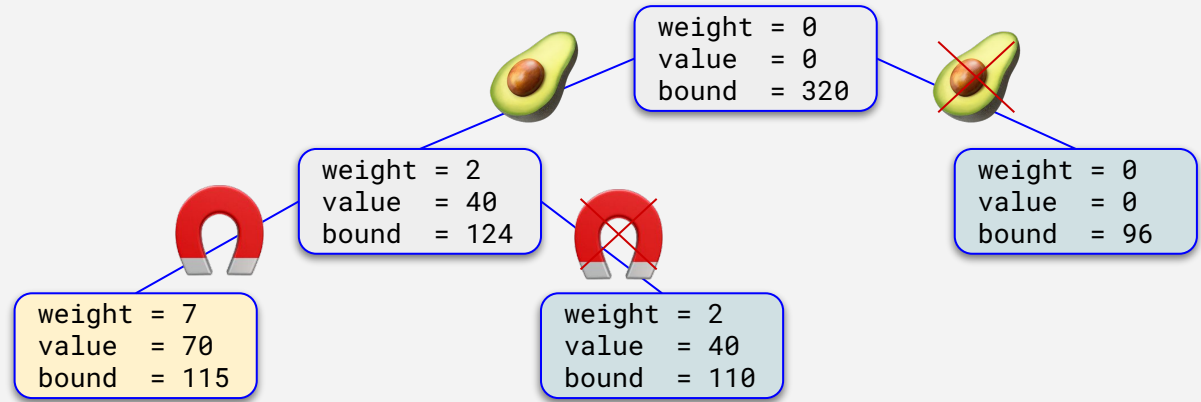


Capacity: **16**


Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand node with bound 115



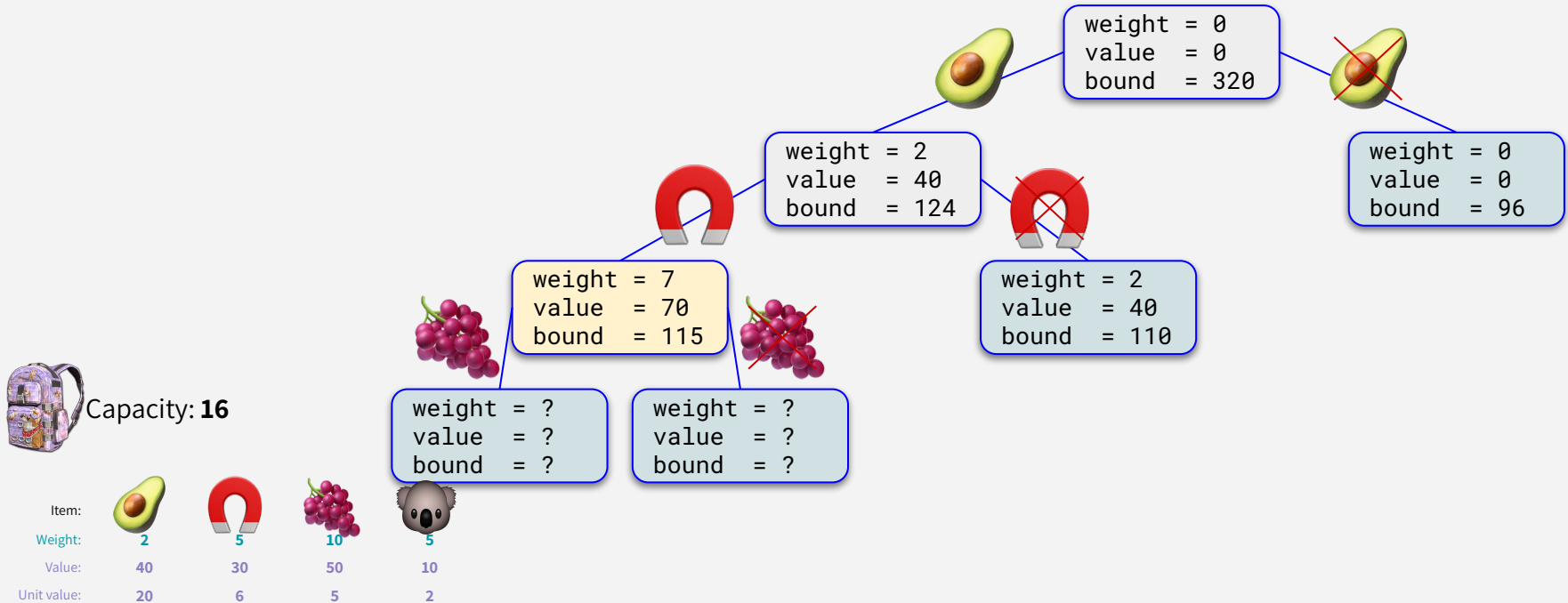
Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



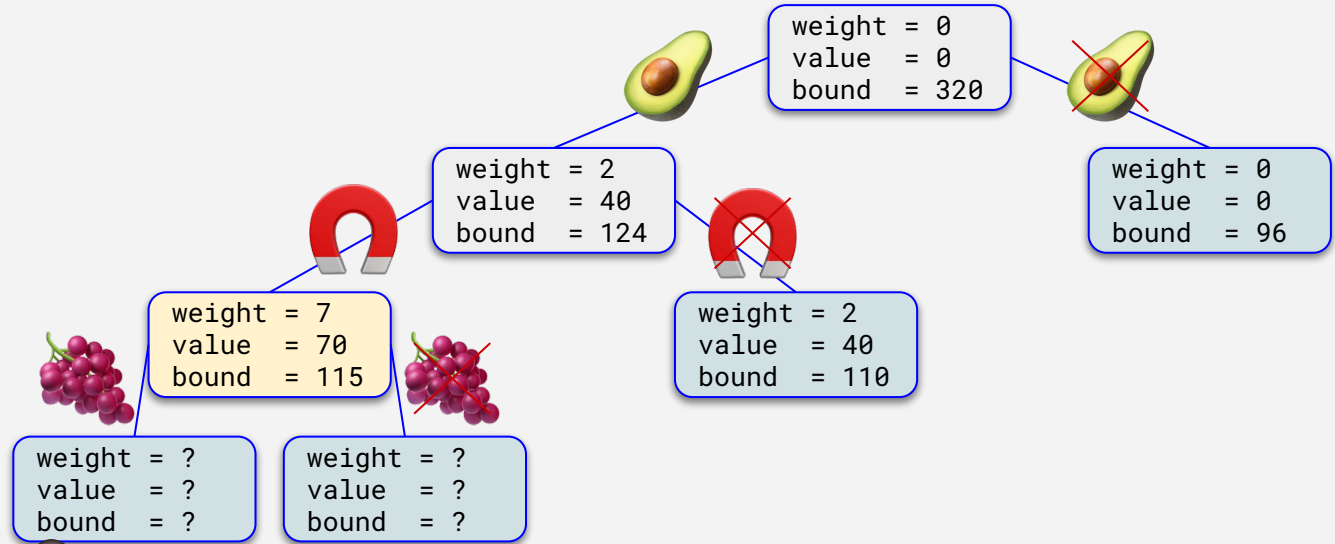
# 0/1 Knapsack with Branch and Bound

- Expand node with bound 115



# 0/1 Knapsack with Branch and Bound

- Pick Grape

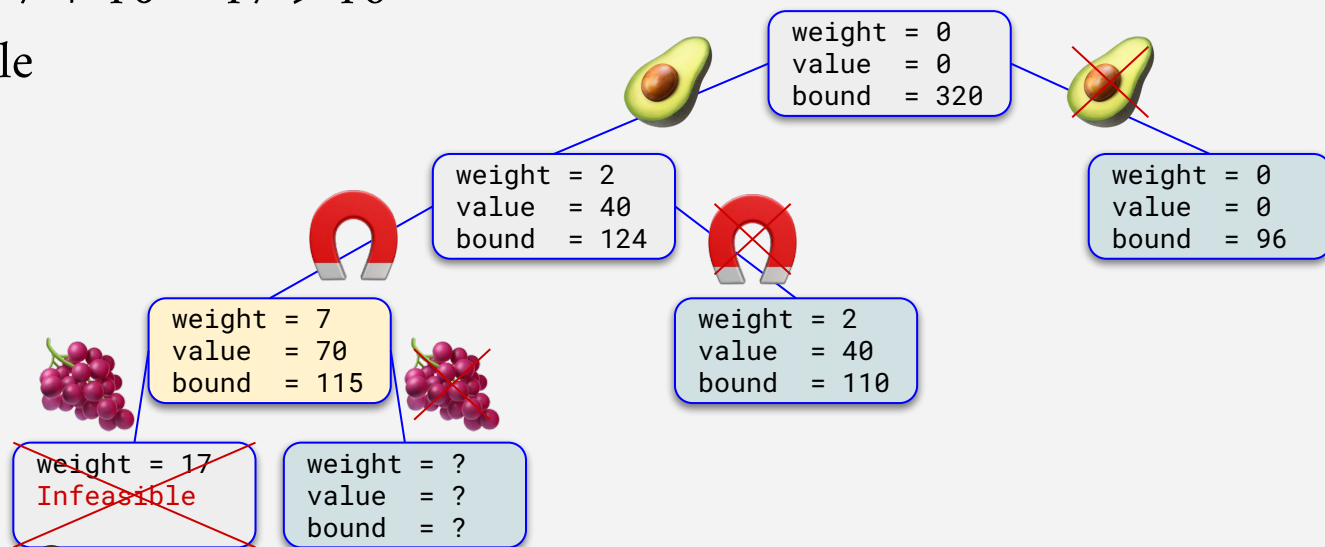


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Pick Grape
  - $wight = 7 + 10 = 17 > 16$
  - Infeasible

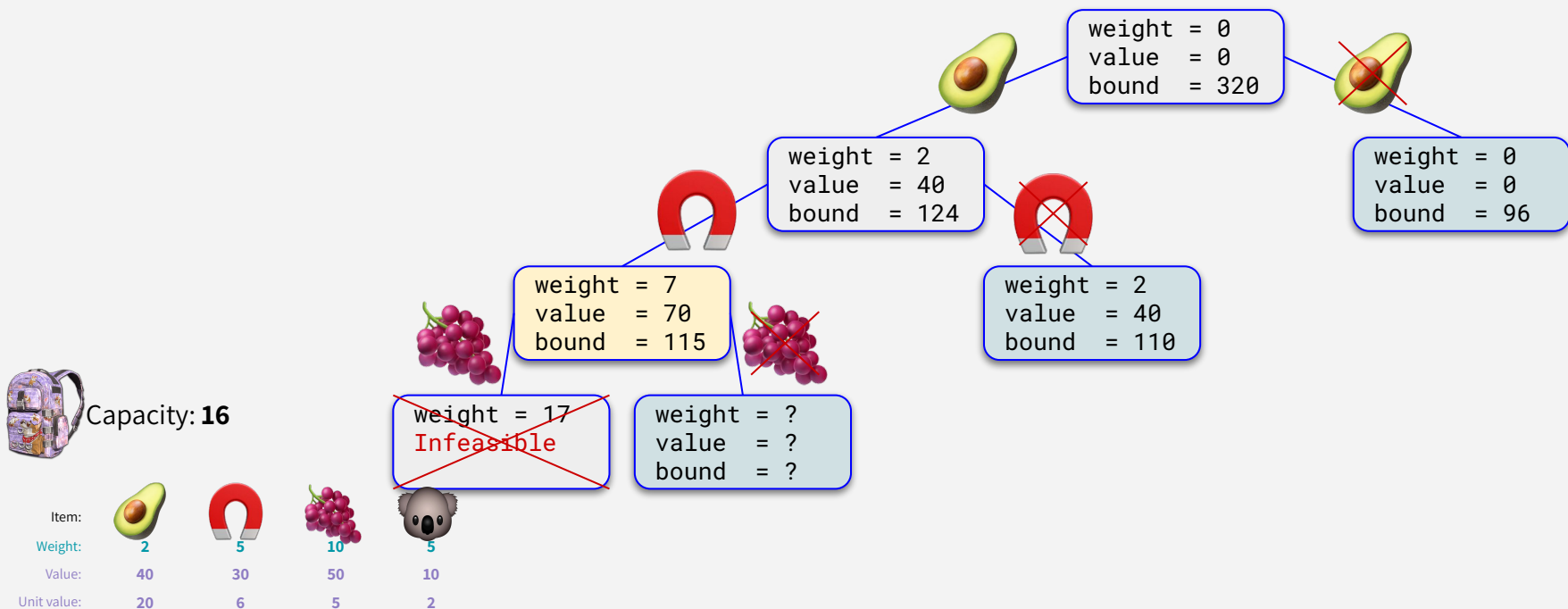


Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

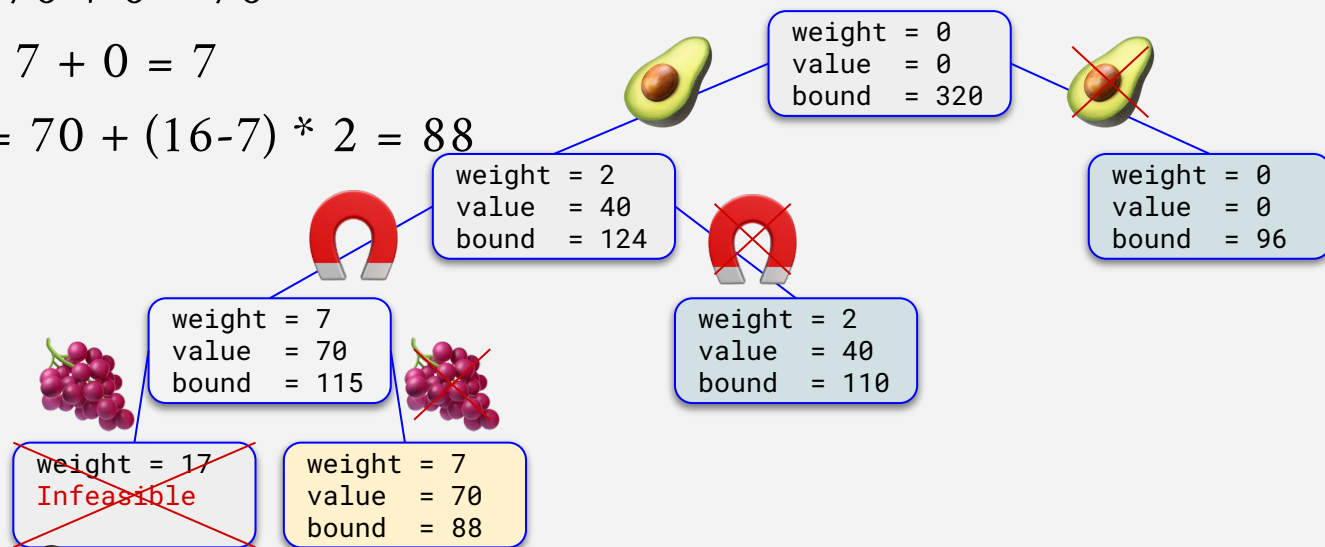
# 0/1 Knapsack with Branch and Bound

- Do not pick Grape



# 0/1 Knapsack with Branch and Bound

- Do not pick Grape
  - value = 70 + 0 = 70
  - wight = 7 + 0 = 7
  - bound = 70 + (16-7) \* 2 = 88

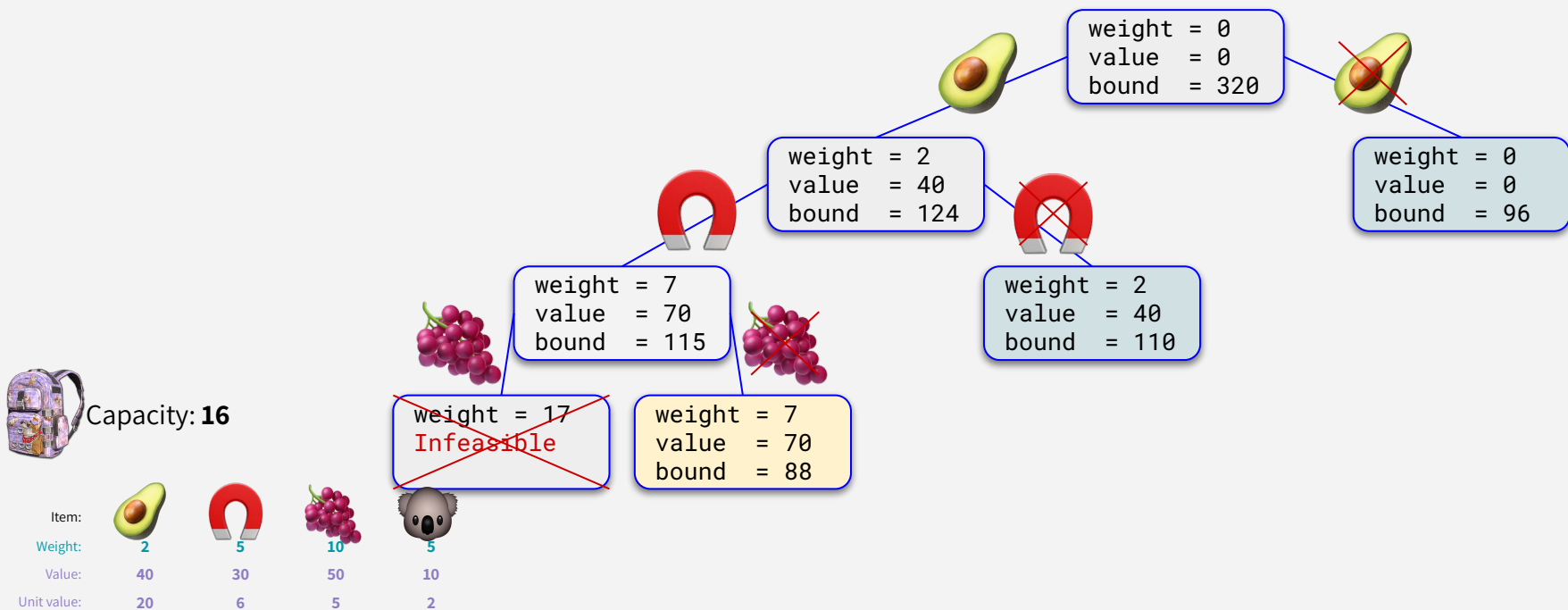


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

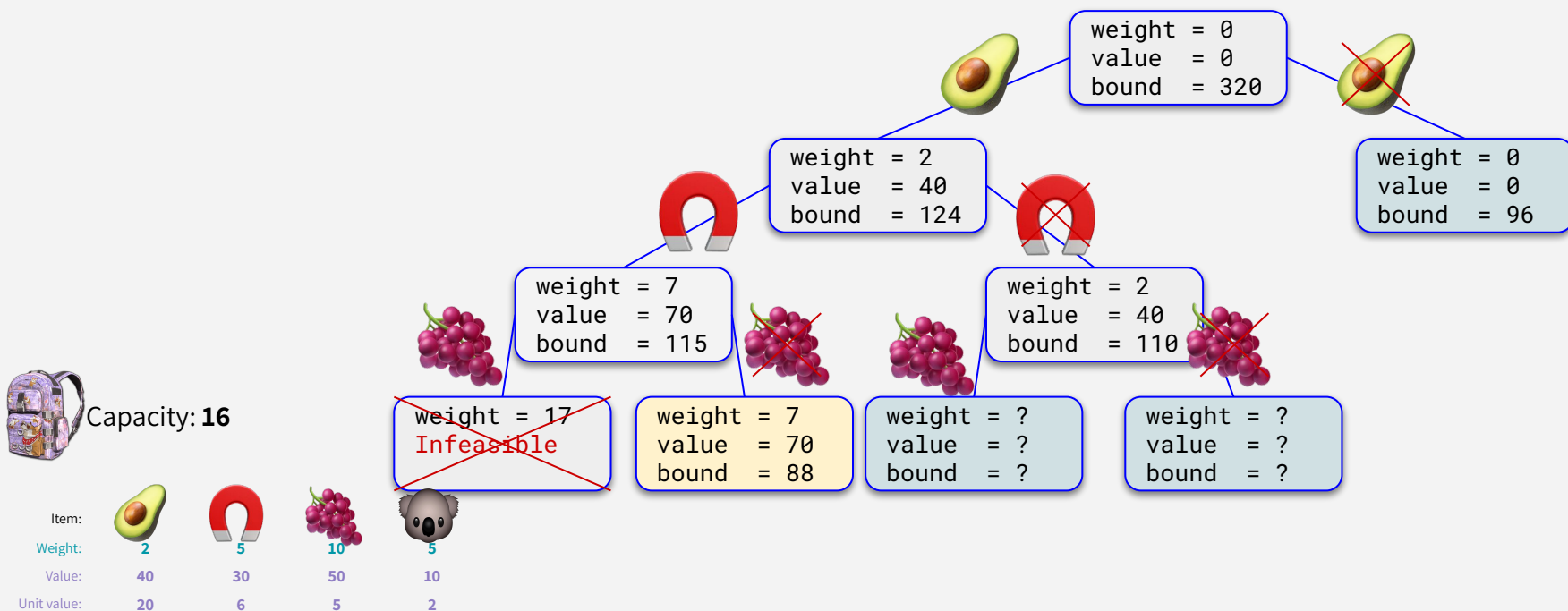
# 0/1 Knapsack with Branch and Bound

- Expand node with bound 110



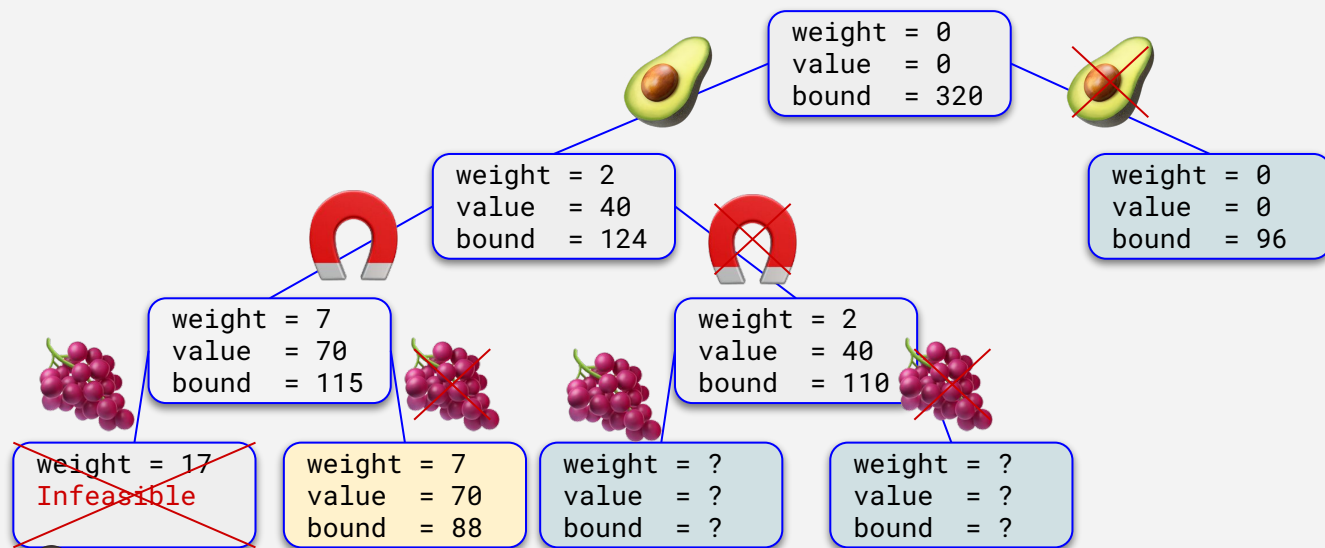
# 0/1 Knapsack with Branch and Bound

- Expand node with bound 110



# 0/1 Knapsack with Branch and Bound

- Pick Grape



Capacity: 16

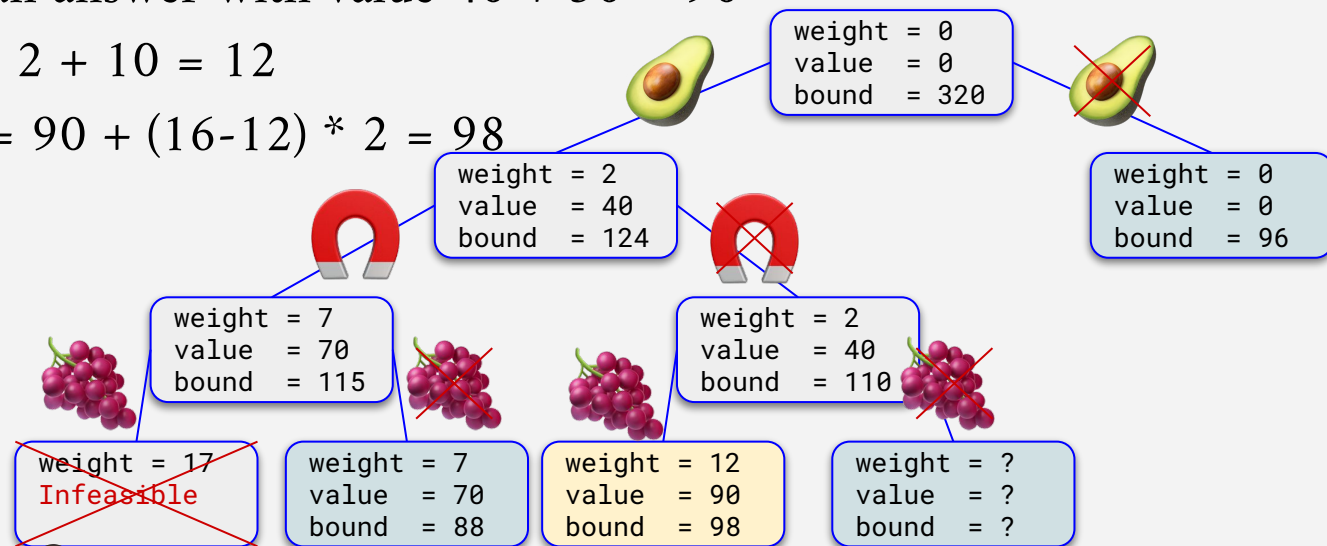
Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



# 0/1 Knapsack with Branch and Bound

- Pick Grape

- Found an answer with value  $40 + 50 = 90$
- $\text{weight} = 2 + 10 = 12$
- $\text{bound} = 90 + (16 - 12) * 2 = 98$



Capacity: 16




Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

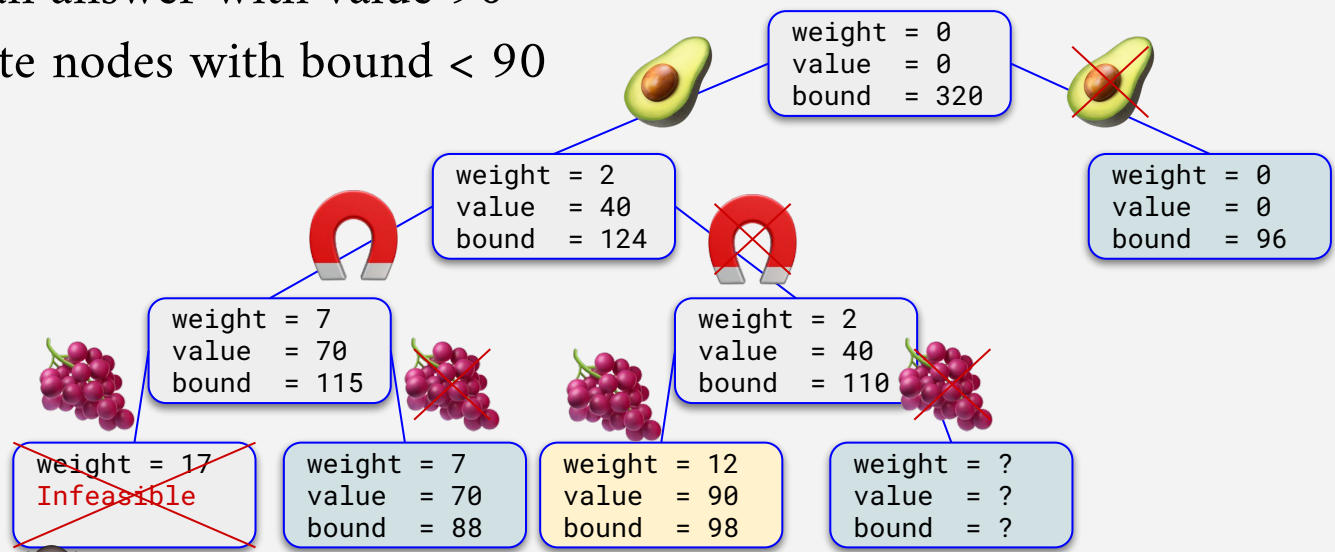
# 0/1 Knapsack with Branch and Bound

- Pick Grape
  - Found an answer with value 90
  - Eliminate nodes with bound < 90



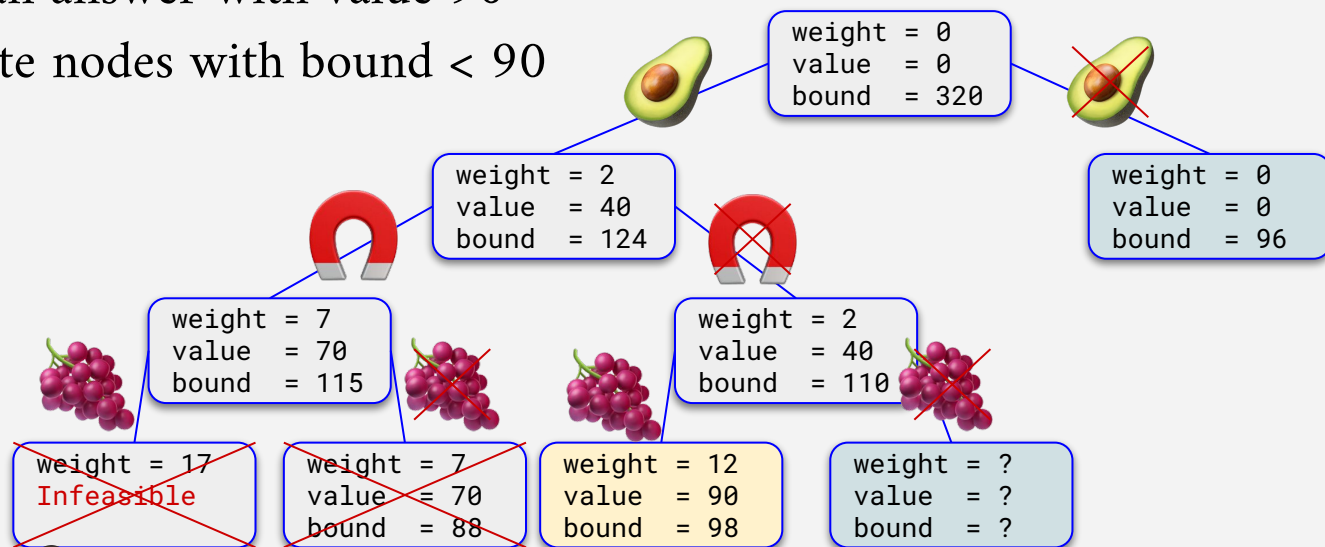
Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



# 0/1 Knapsack with Branch and Bound

- Pick Grape
  - Found an answer with value 90
  - Eliminate nodes with bound < 90

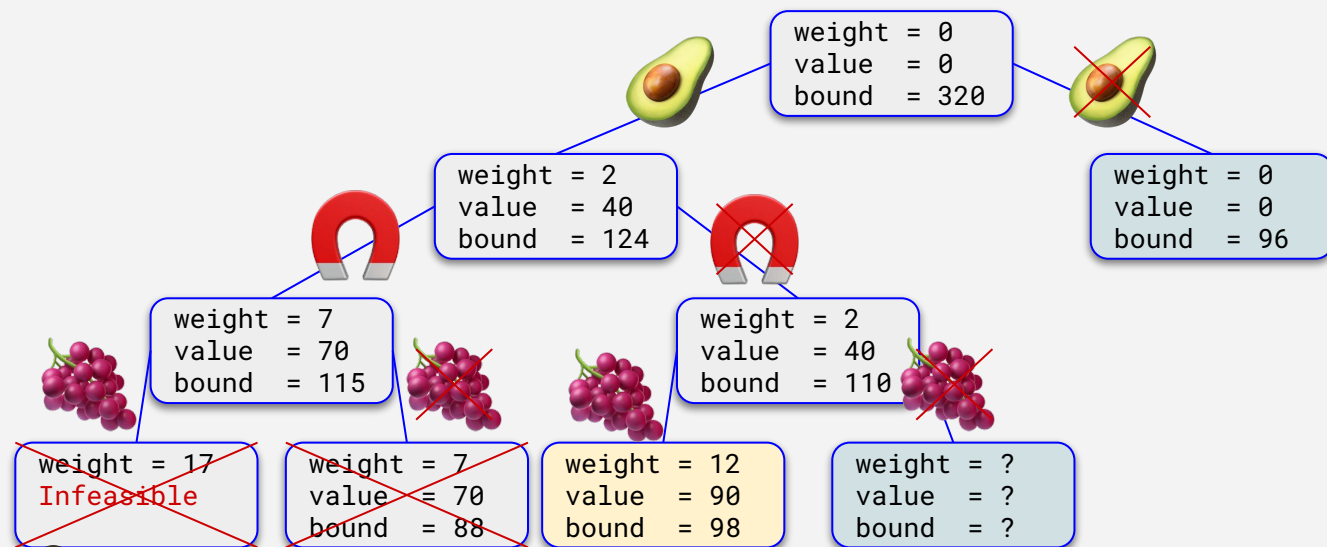


Capacity: 16





Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Grape

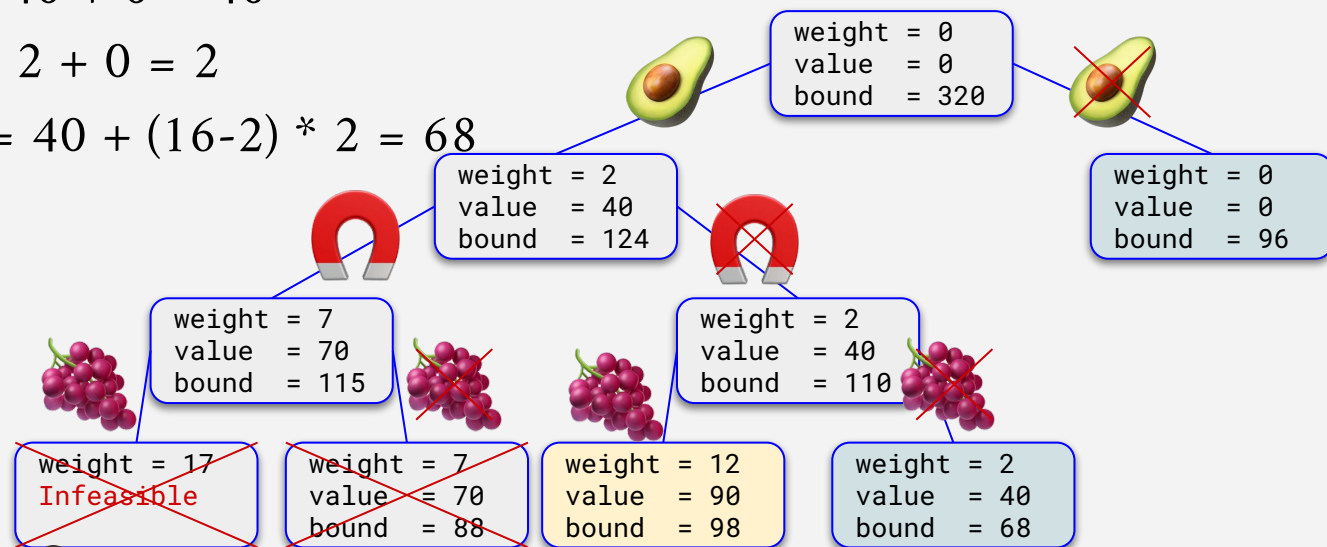


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Grape
  - value = 40 + 0 = 40
  - wight = 2 + 0 = 2
  - bound = 40 + (16-2) \* 2 = 68

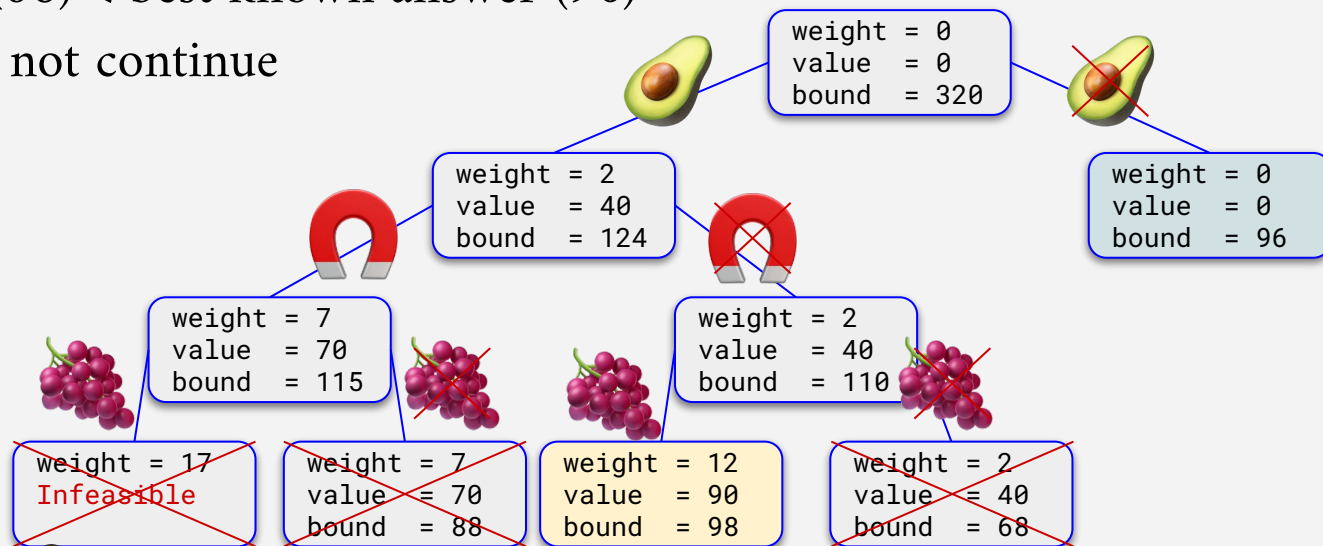


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Grape
  - Bound (68) < best known answer (90)
    - Do not continue

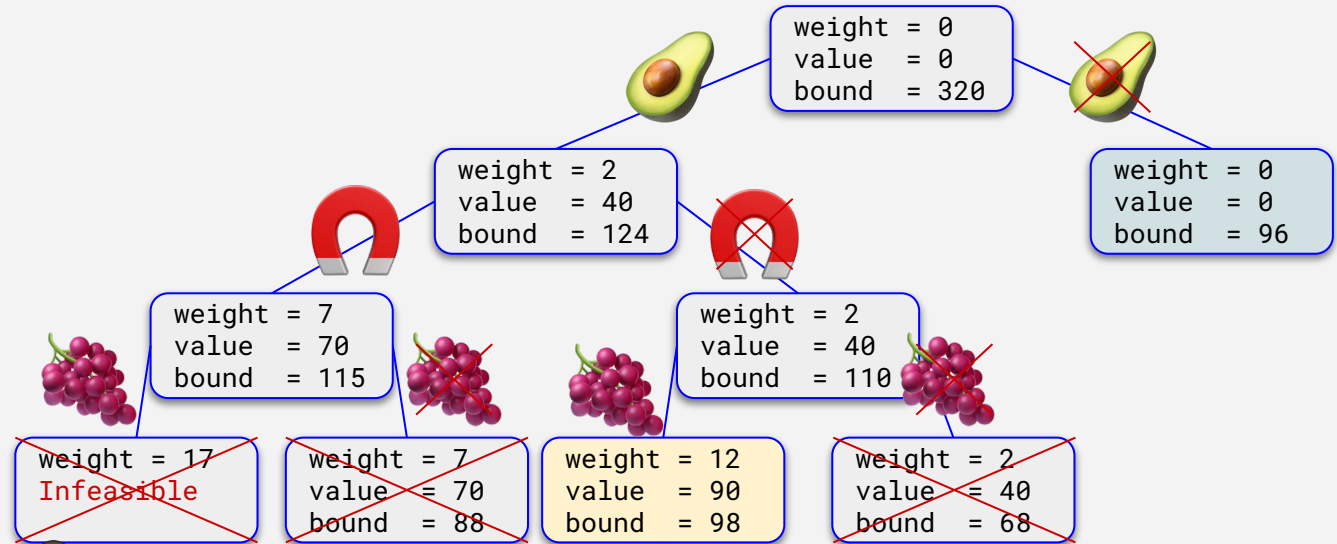


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand the node with bound 98

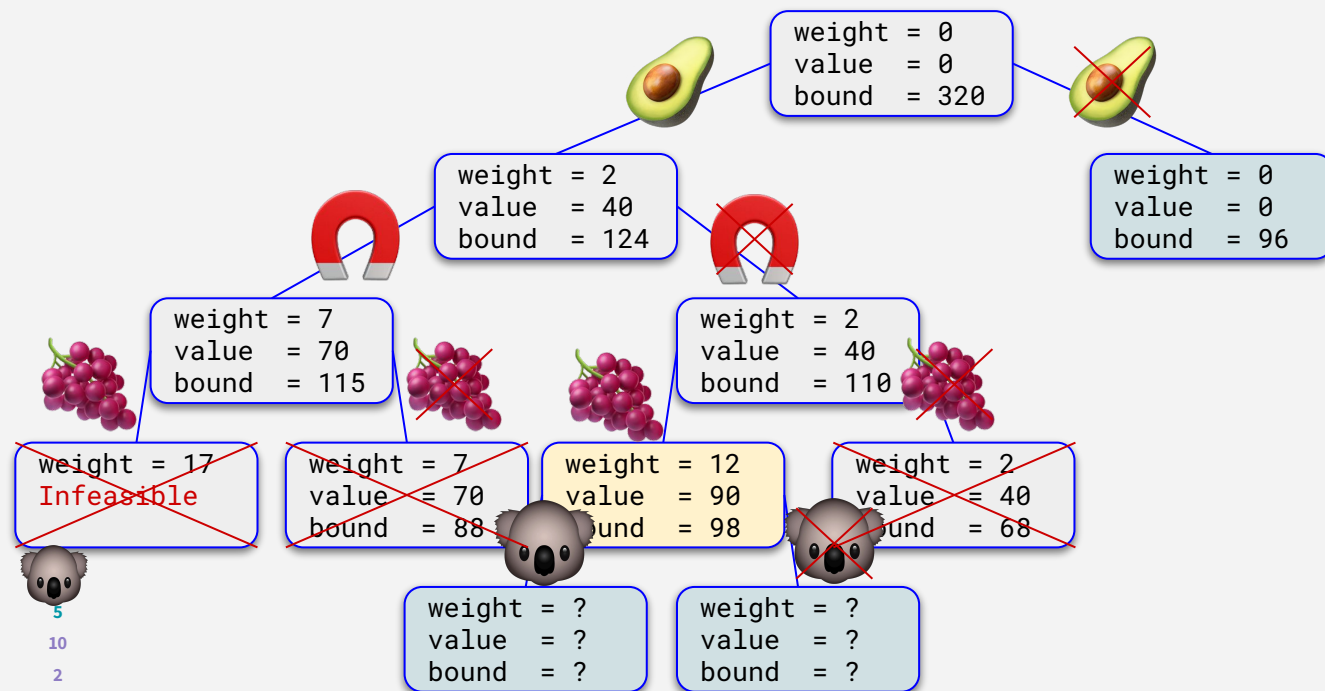


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

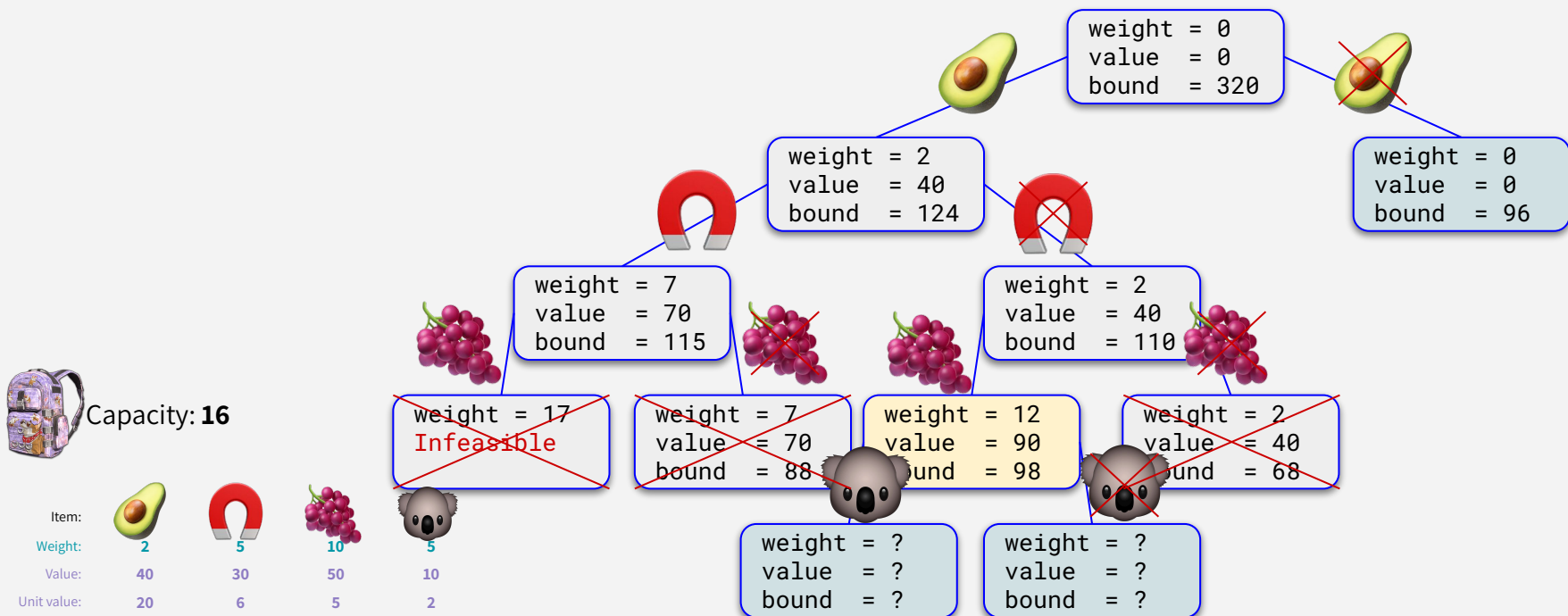
- Expand the node with bound 98





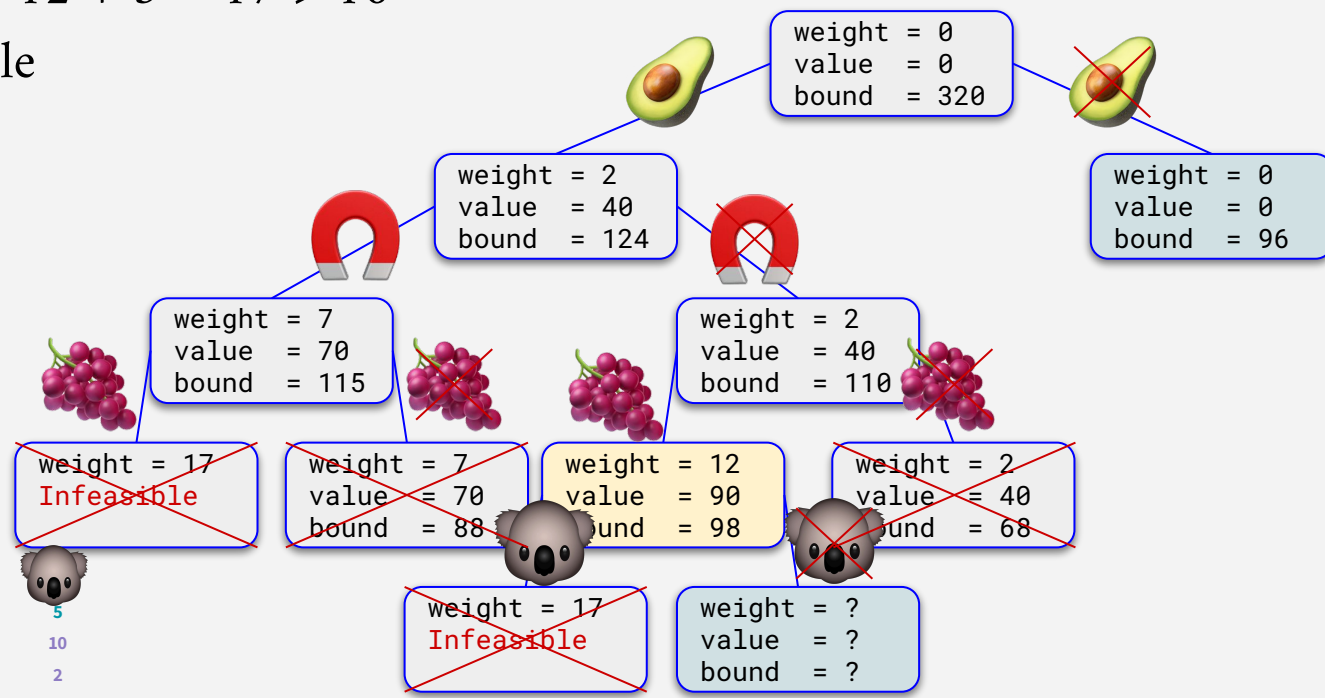
# 0/1 Knapsack with Branch and Bound

- Pick Quala



# 0/1 Knapsack with Branch and Bound

- Pick Quala
  - $wight = 12 + 5 = 17 > 16$
  - Infeasible

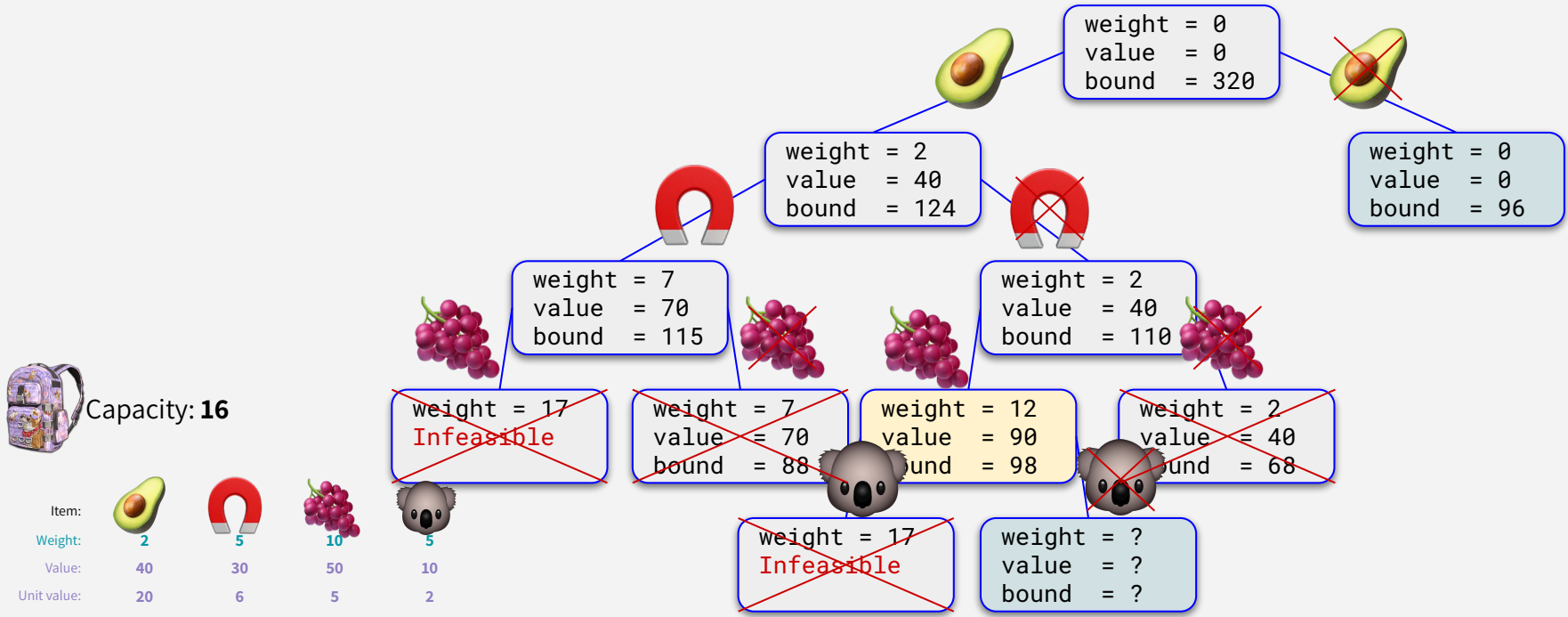


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

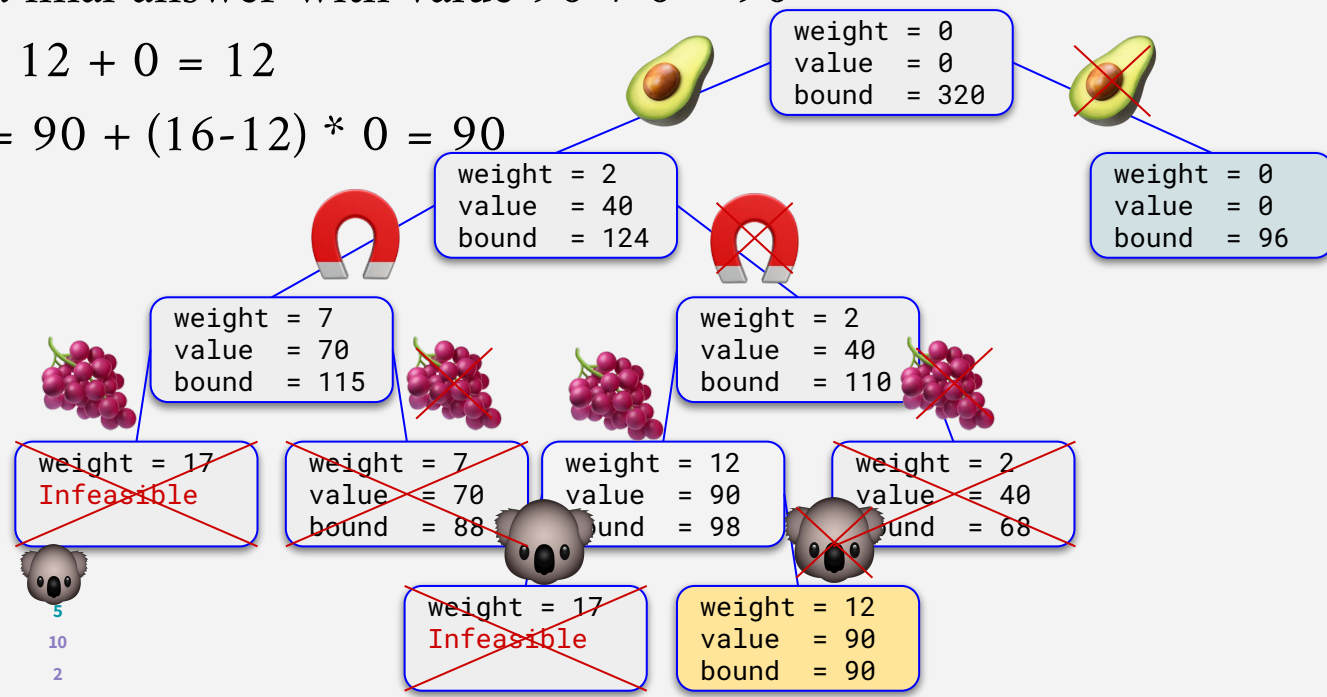
# 0/1 Knapsack with Branch and Bound

- Do not pick Quala



# 0/1 Knapsack with Branch and Bound

- Do not pick Quala
  - Found a final answer with value  $90 + 0 = 90$
  - weight =  $12 + 0 = 12$
  - bound =  $90 + (16-12) * 0 = 90$

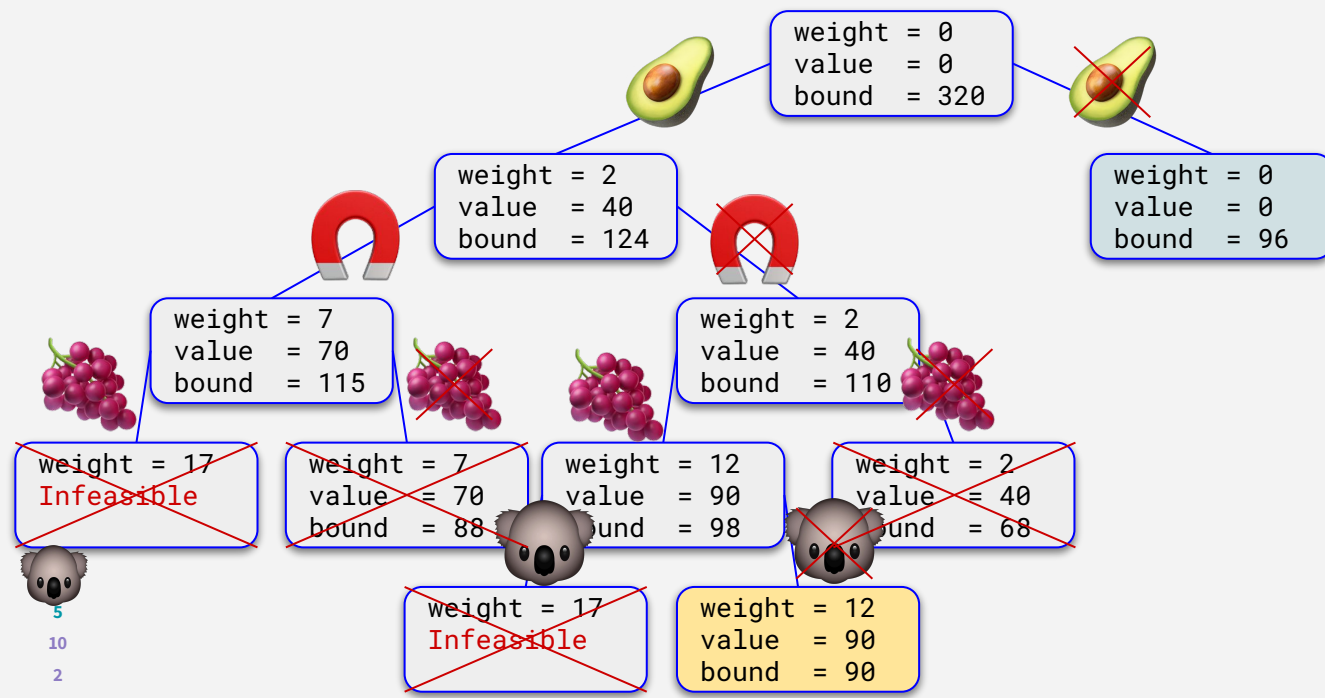


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand node with bound 96

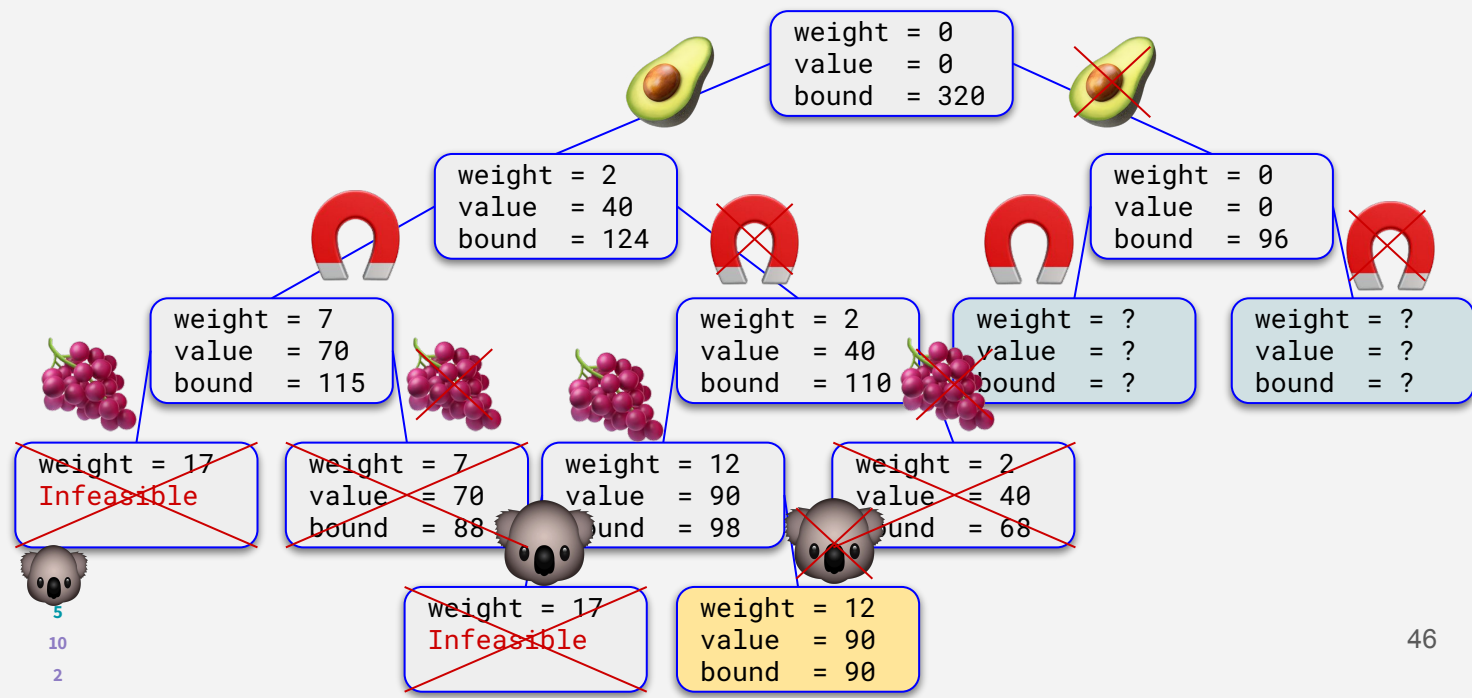


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Expand node with bound 96

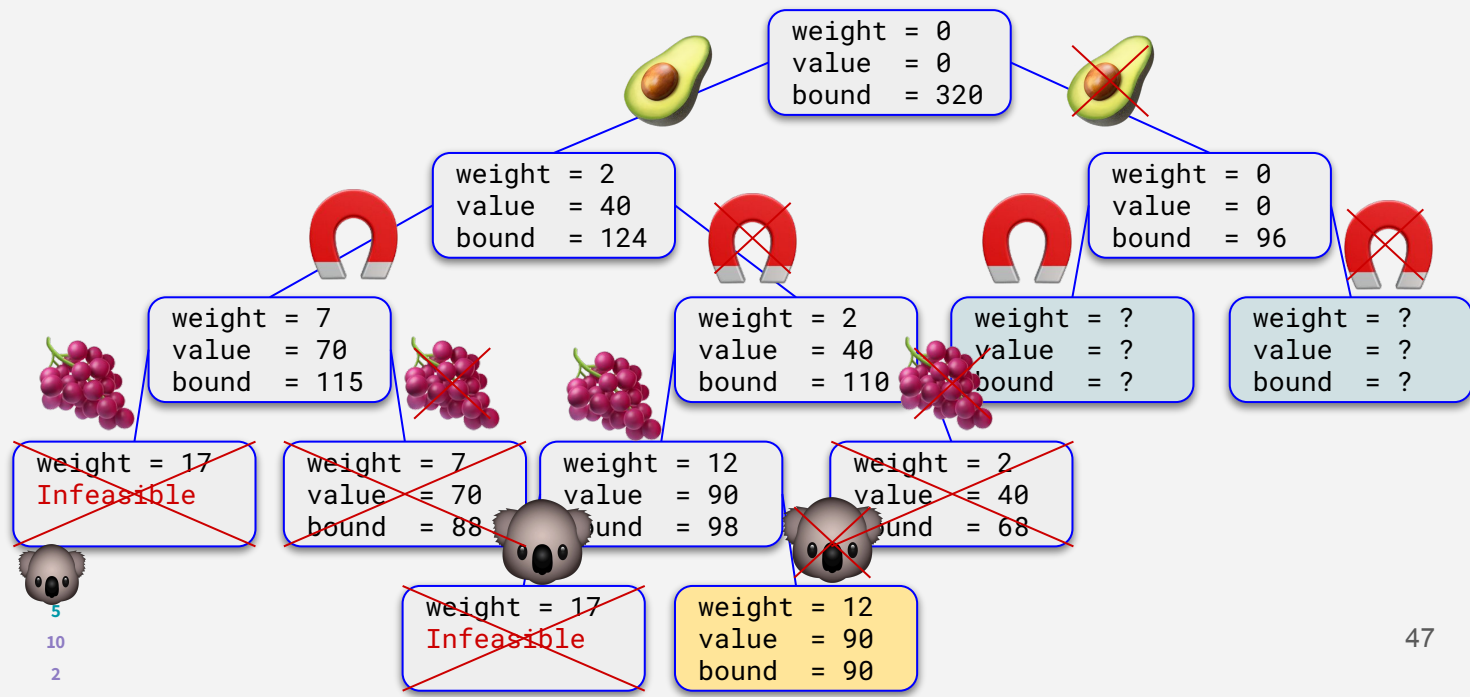


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Pick Magnet



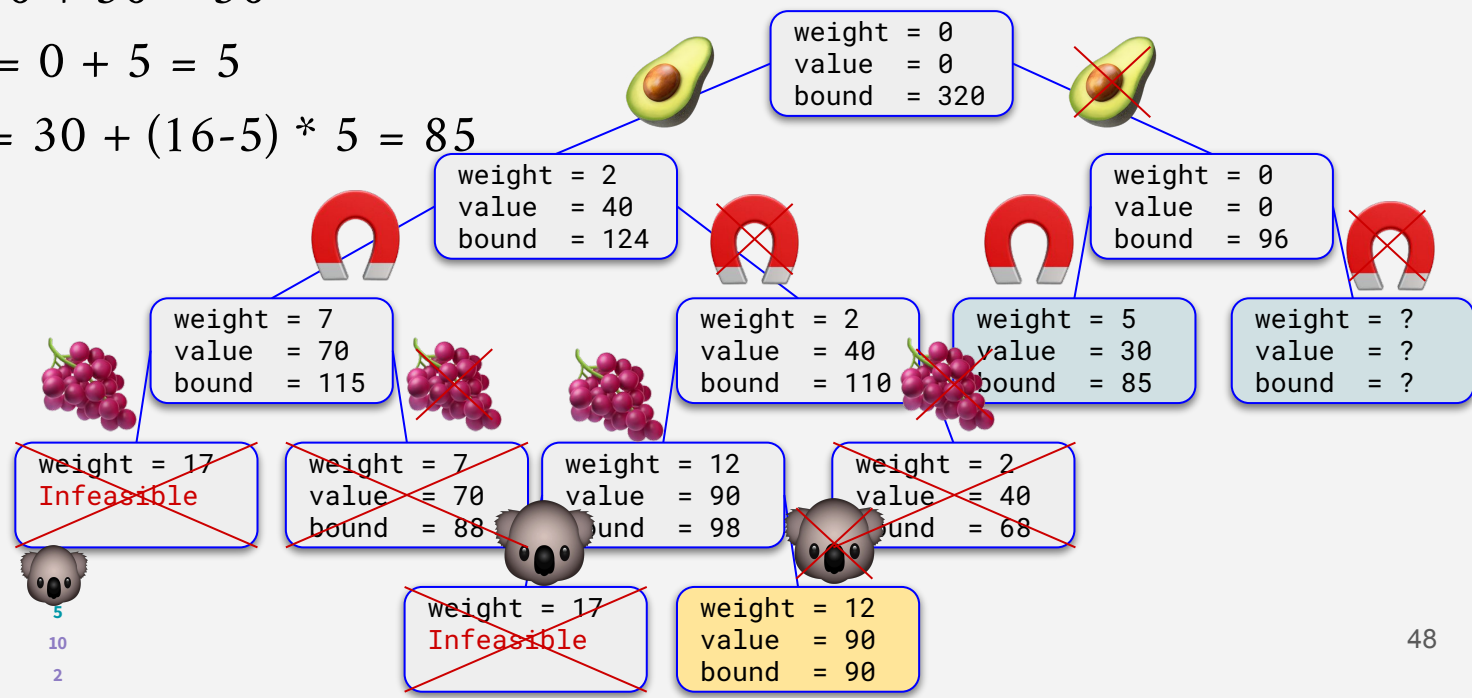
Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



# 0/1 Knapsack with Branch and Bound

- Pick Magnet

- $\text{value} = 0 + 30 = 30$
- $\text{weight} = 0 + 5 = 5$
- $\text{bound} = 30 + (16-5) * 5 = 85$



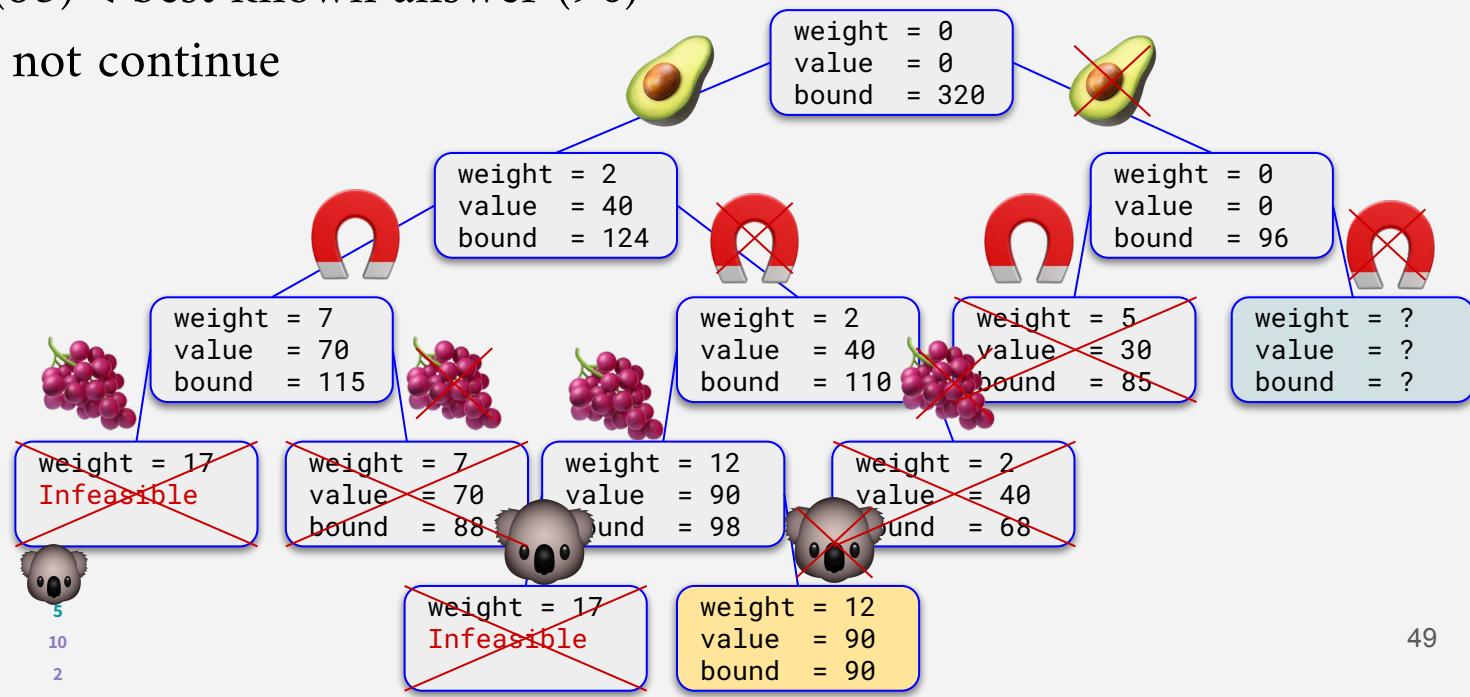
Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



# 0/1 Knapsack with Branch and Bound

- Pick Magnet
  - Bound (85) < best known answer (90)
    - Do not continue

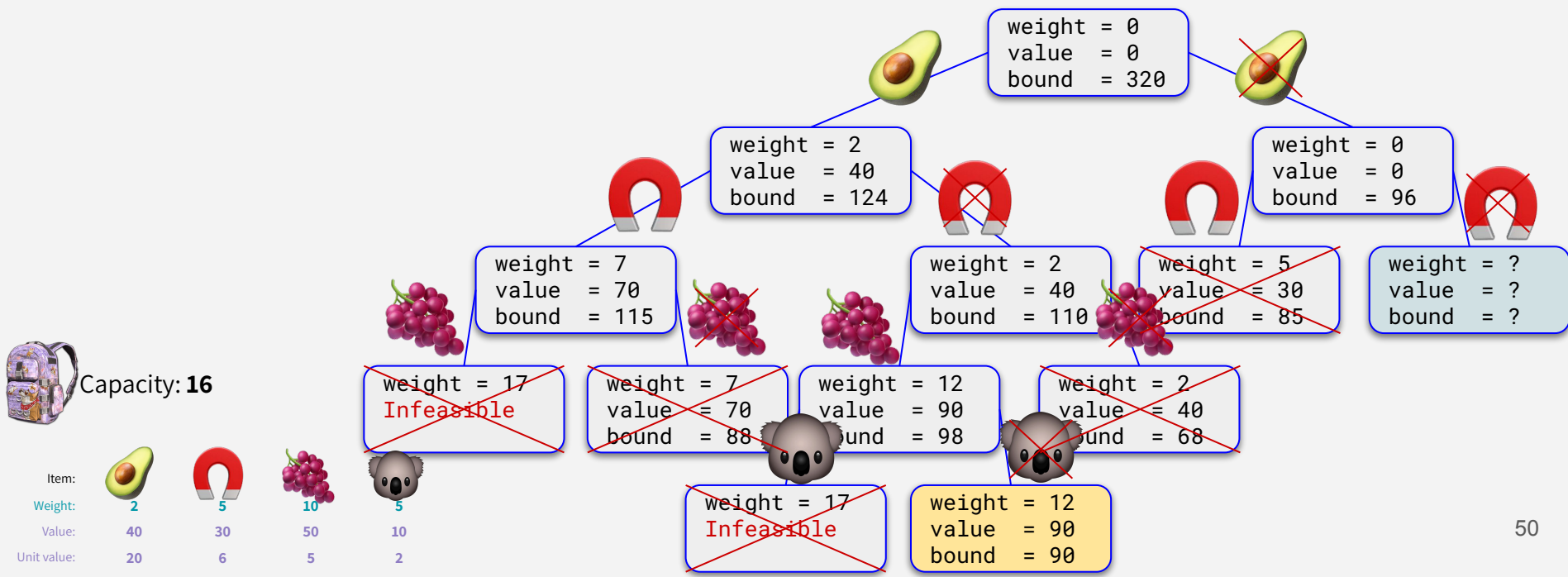


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

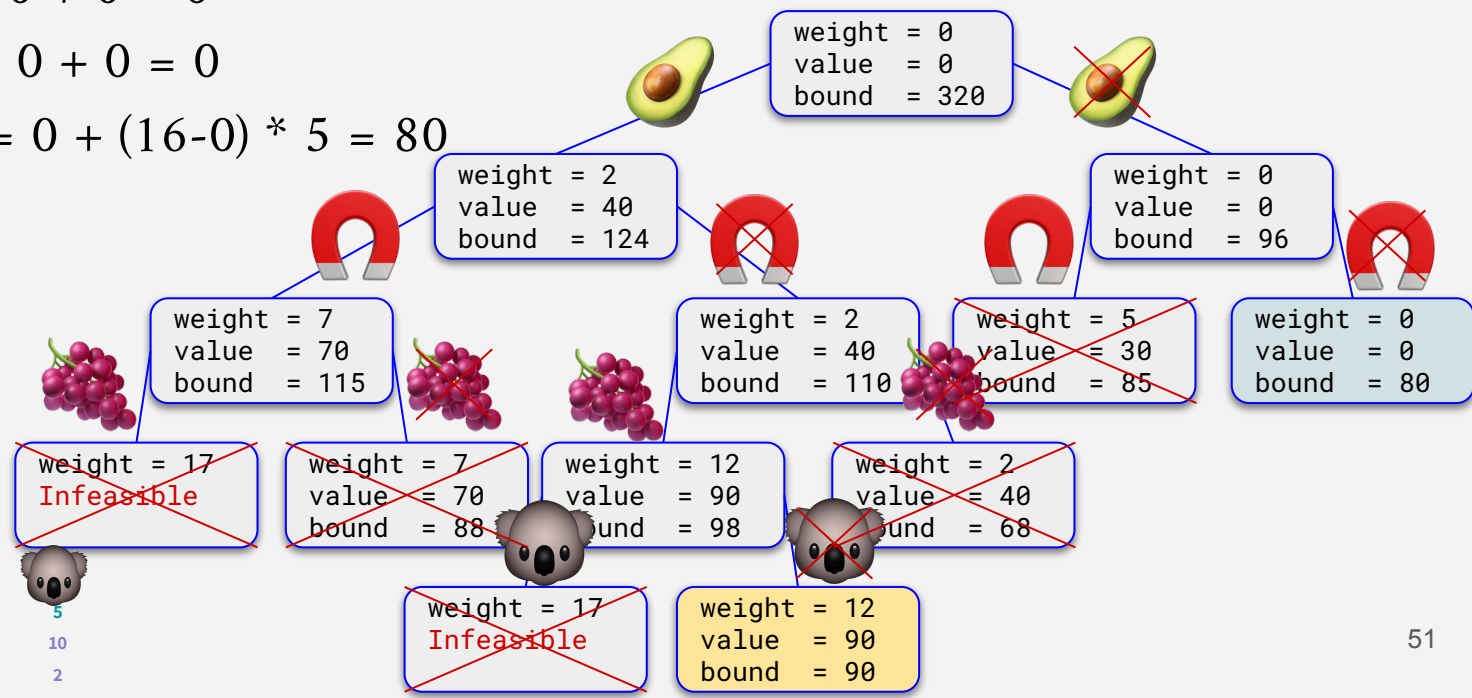
# 0/1 Knapsack with Branch and Bound

- Do not pick Magnet



# 0/1 Knapsack with Branch and Bound

- Do not pick Magnet
  - value =  $0 + 0 = 0$
  - wight =  $0 + 0 = 0$
  - bound =  $0 + (16-0) * 5 = 80$

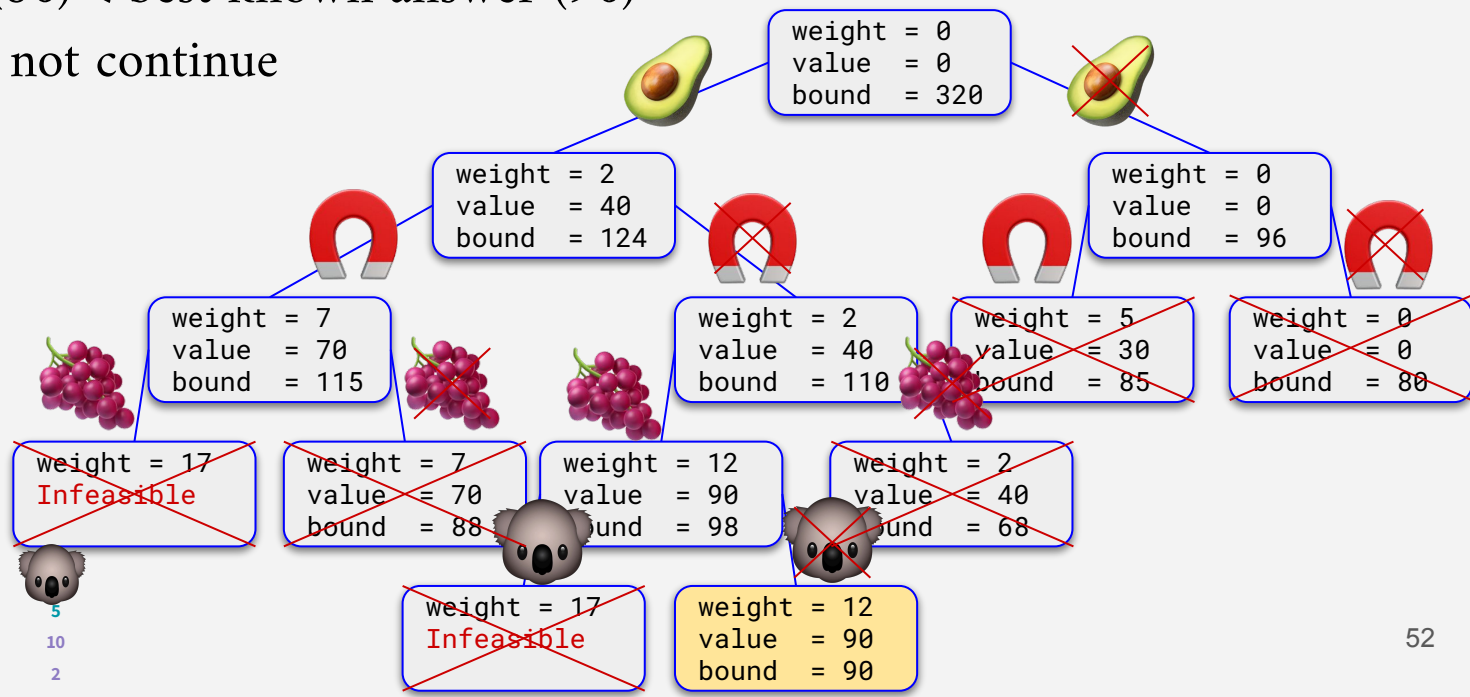


Capacity: **16**

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- Do not pick Magnet
  - Bound (80) < best known answer (90)
    - Do not continue

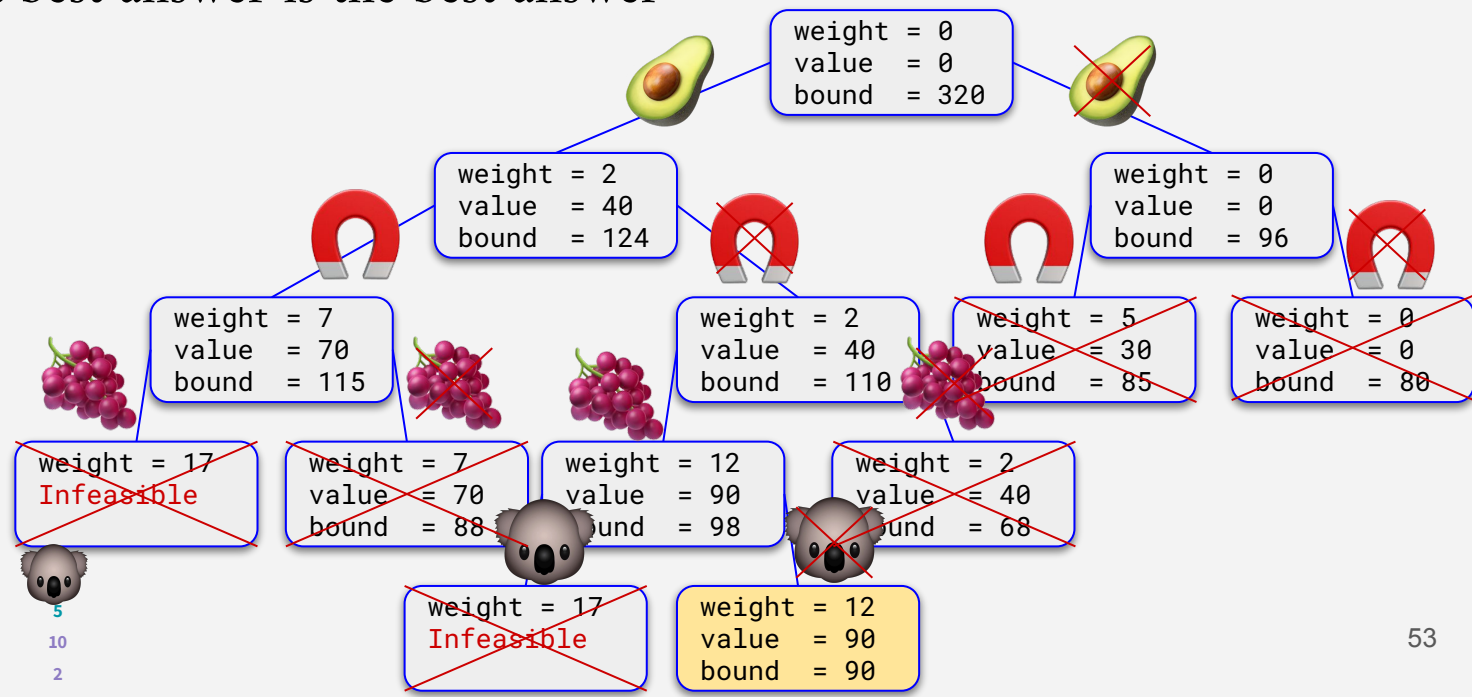


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- No more partial answer to expand
  - Current best answer is the best answer

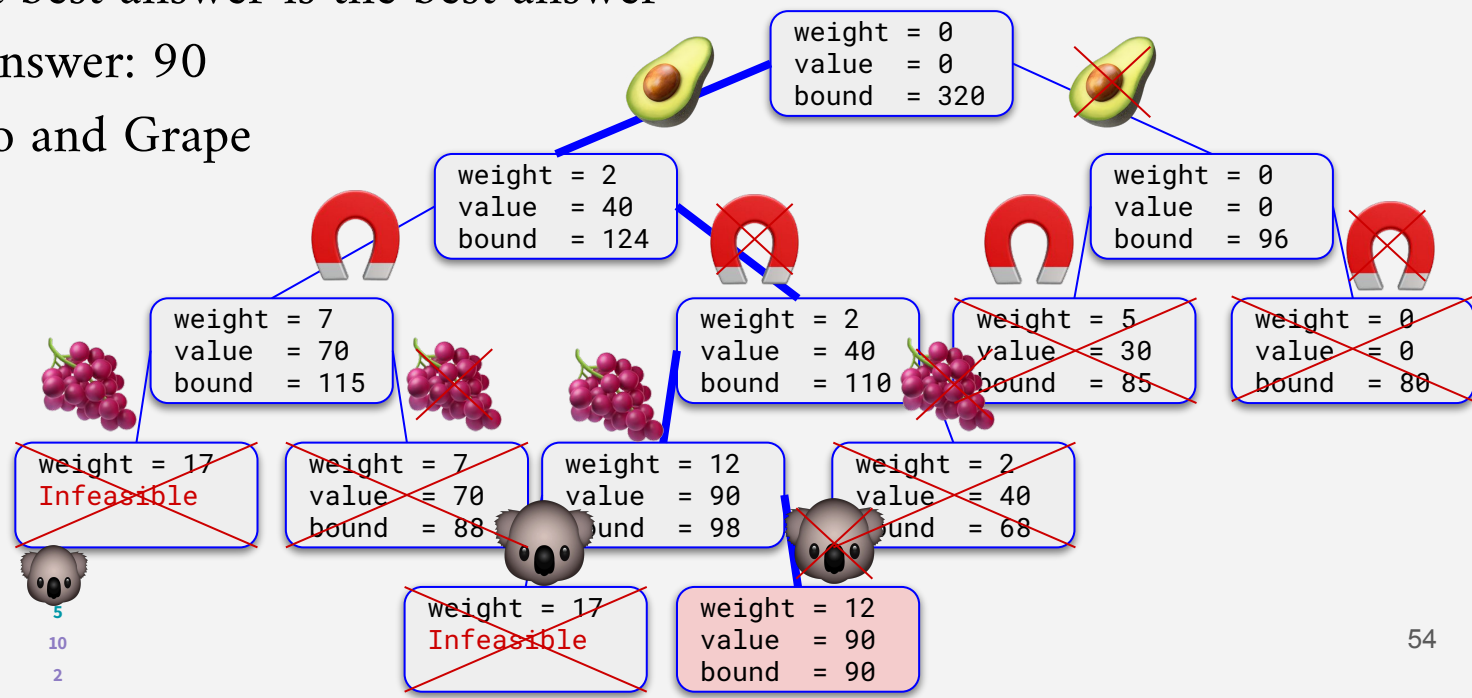


Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2

# 0/1 Knapsack with Branch and Bound

- No more partial answer to expand
  - Current best answer is the best answer
- Best Final Answer: 90
  - Avocado and Grape



Capacity: 16

Item:				
Weight:	2	5	10	5
Value:	40	30	50	10
Unit value:	20	6	5	2



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