

アルゴリズムの設計と解析

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Contents (L5 – Search trees)

- ◆ Searching problems
- ◆ AVL tree
- ◆ 2-3-4 trees (insertion)

Searching Problems

Problem: Given a (multi) set S of keys and a search key K , find an occurrence of K in S , if any

- ◆ Searching must be considered in the context of:
 - file size (internal vs. external)
 - dynamics of data (static vs. dynamic)
- ◆ Like Dictionary: Dictionary operations (dynamic data):
 - find (search)
 - insert
 - delete

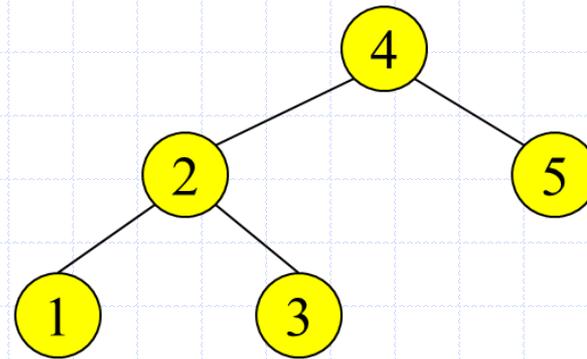
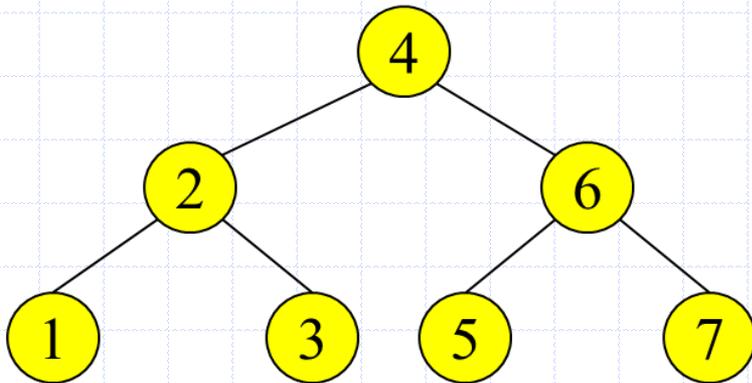
Taxonomy of Searching Algorithms

- ◆ List searching
 - sequential search
 - binary search
 - interpolation search
- ◆ Tree searching
 - binary search tree (pre-, post-, in- order search)
 - binary balanced trees: AVL trees, red-black trees
 - Multi-way balanced trees: 2-3 trees, 2-3-4 trees, B trees
- ◆ Hashing
 - open hashing (separate chaining)
 - closed hashing (open addressing)

AVL tree - Balanced binary search tree

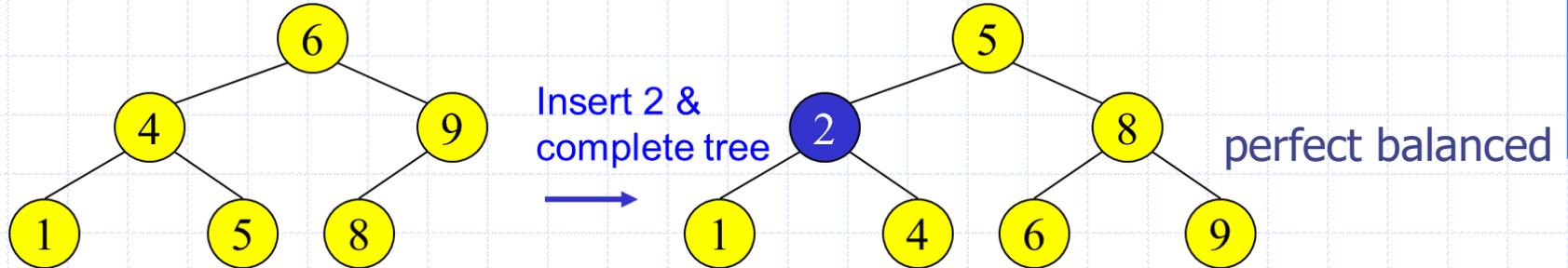
平衡2分探索木

◆特に木構造の一つ。AVL木平衡条件を満たす平衡2分探索木である。左右の部分木の高さの差を多くとも1にする。



balanced?

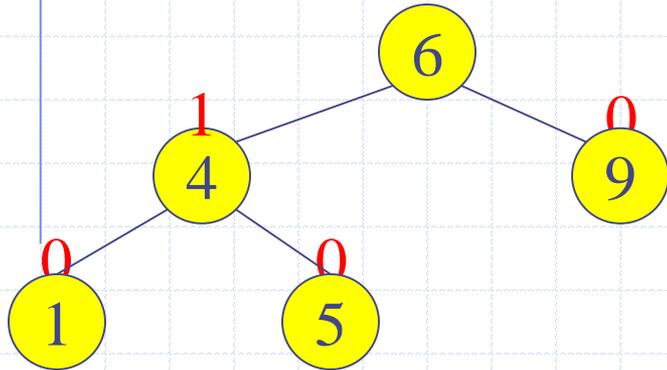
AVL - Good but not Perfect Balance



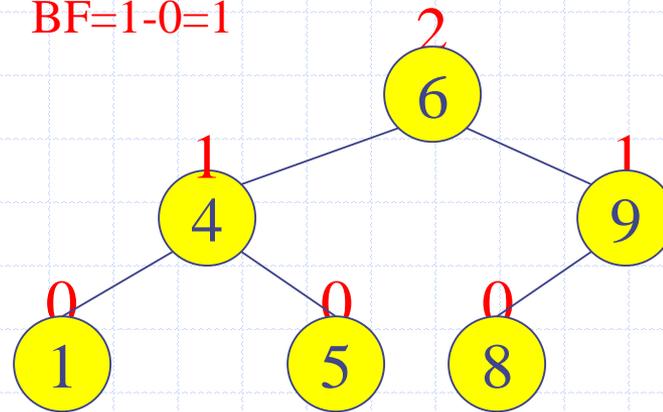
- AVL trees are height-balanced binary search trees
- **Balance factor** of a node
 - › $\text{height}(\text{left subtree}) - \text{height}(\text{right subtree})$
- An AVL tree has balance factor calculated at every node
 - › For every node, heights of left and right subtree can differ by no more than 1

Node Heights

Tree A (AVL)



Tree B (AVL)



height=2 BF=1-0=1

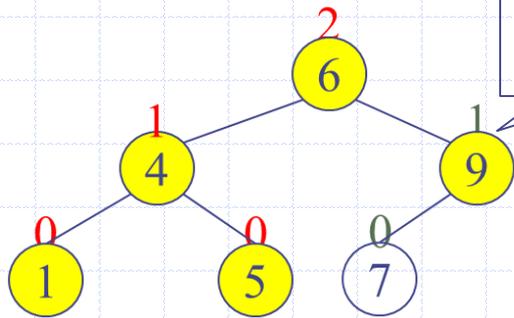
Count from leaf nodes

height of node = h

balance factor = $h_{\text{left}} - h_{\text{right}}$

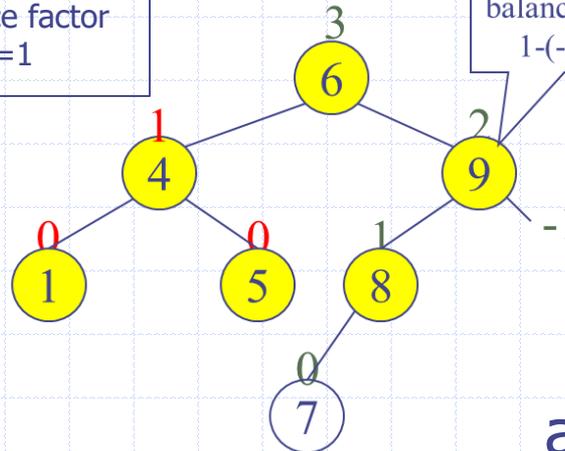
Node Heights after Insert 7

Tree A (AVL)



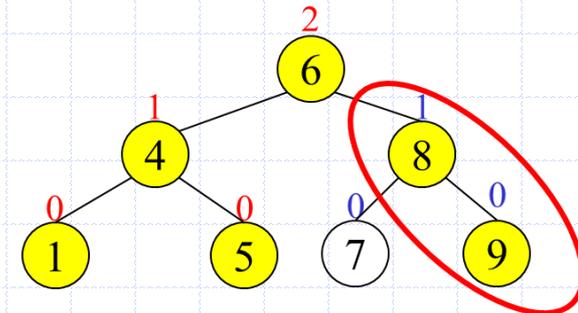
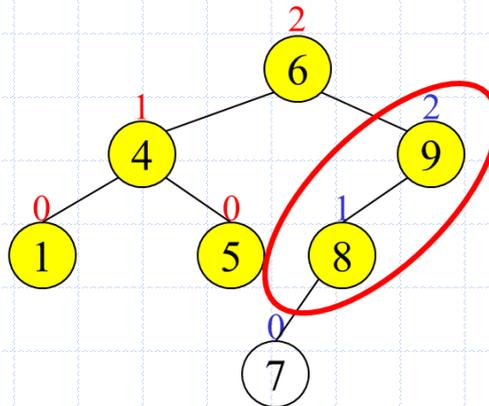
balance factor
 $0 - (-1) = 1$

Tree B (not AVL)



balance factor
 $1 - (-1) = 2$

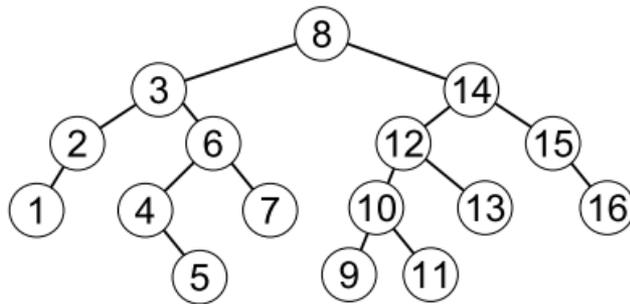
after single rotation



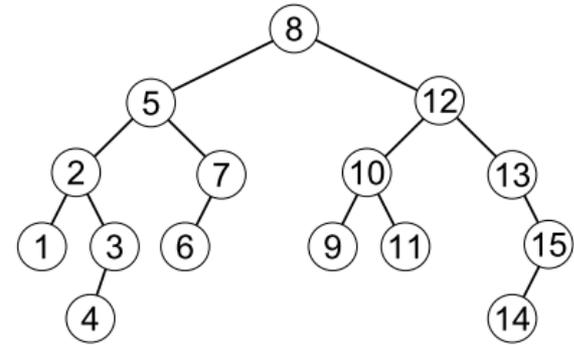
Work in class



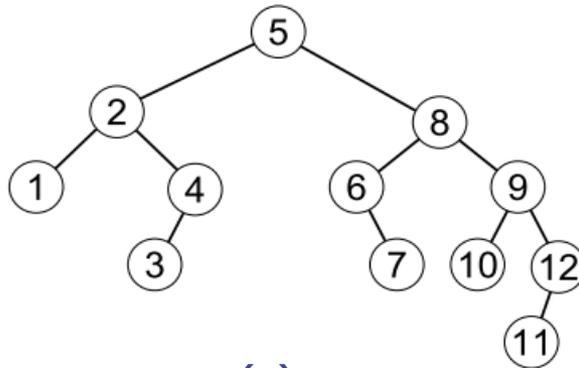
AVL木?



(a)



(b)

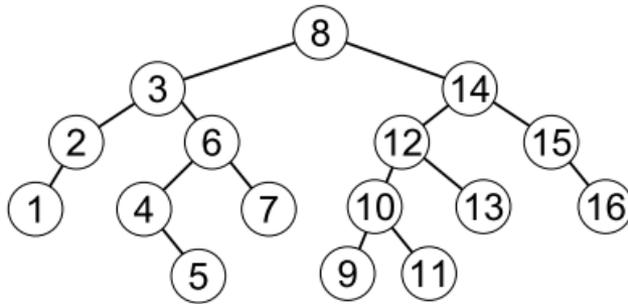


(c)

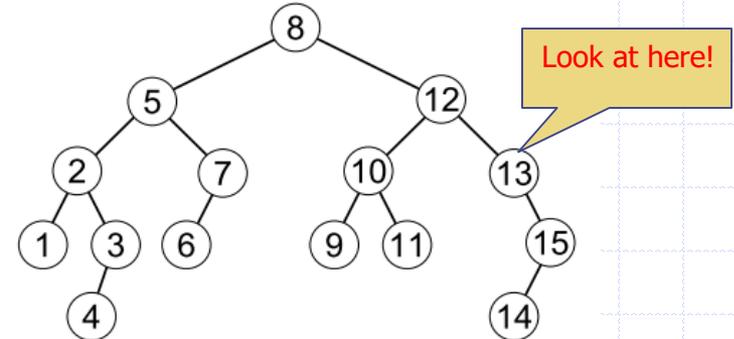
AVL木の部分木もAVL木

Work in class (answer)

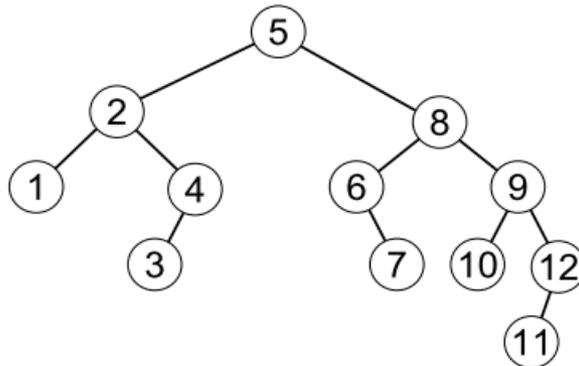
AVL 木?



(a) yes



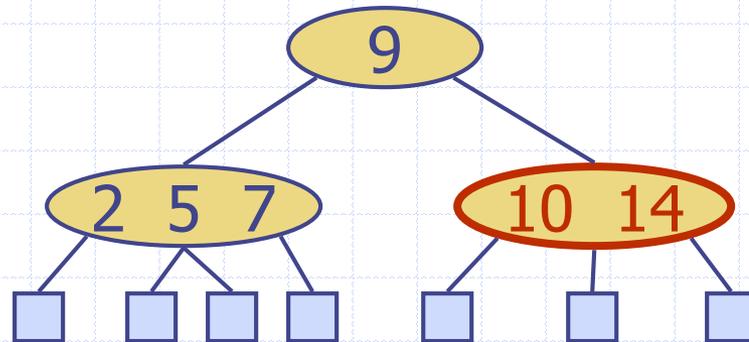
(b) no



(c) yes

(2,4) Trees

- B木は多分岐の平衡木(バランス木)である。1 ノードから最大 m 個の枝が出るとき、これをオーダー(order) m のB木という。
- B木の中でも特に、オーダー3のものを2-3木、オーダー4のものを2-3-4木 (2, 4) と呼ぶ。



Features of 2-3 Trees

- No 1-nodes
- 2-nodes can have 1 item and 2 children
- 3-nodes can have 2 items and 3 children
- Depending on the number of children, an internal node of a 2-3 tree is called a 2-node or a 3-node

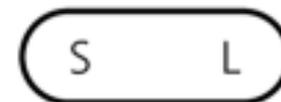
(a)



Search keys < S

Search keys > S

(b)



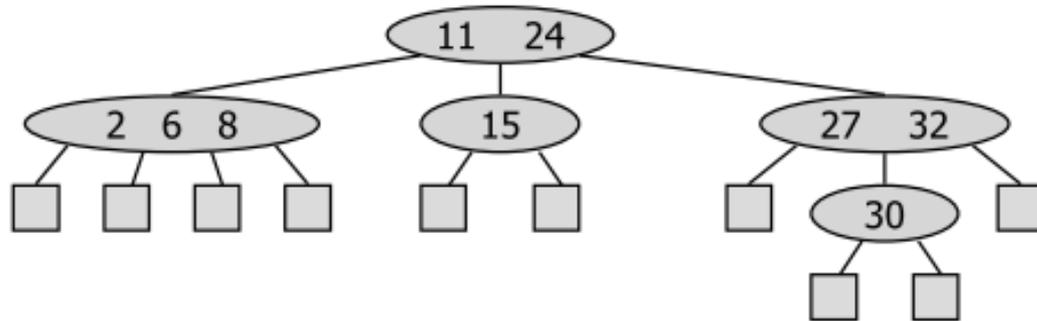
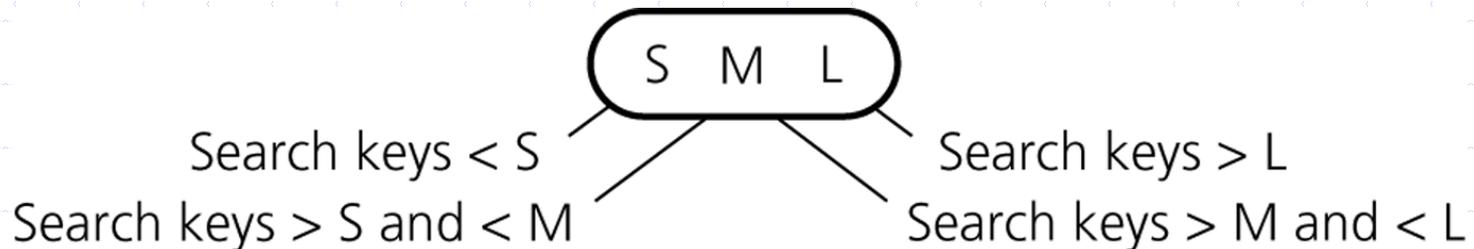
Search keys < S

Search keys > S
and < L

Search keys > L

Features of (2,4) Trees

- 4-nodes can have 3 items and 4 children
- Depending on the number of children, an internal node of a (2,4) tree is called a 2-node, 3-node or 4-node



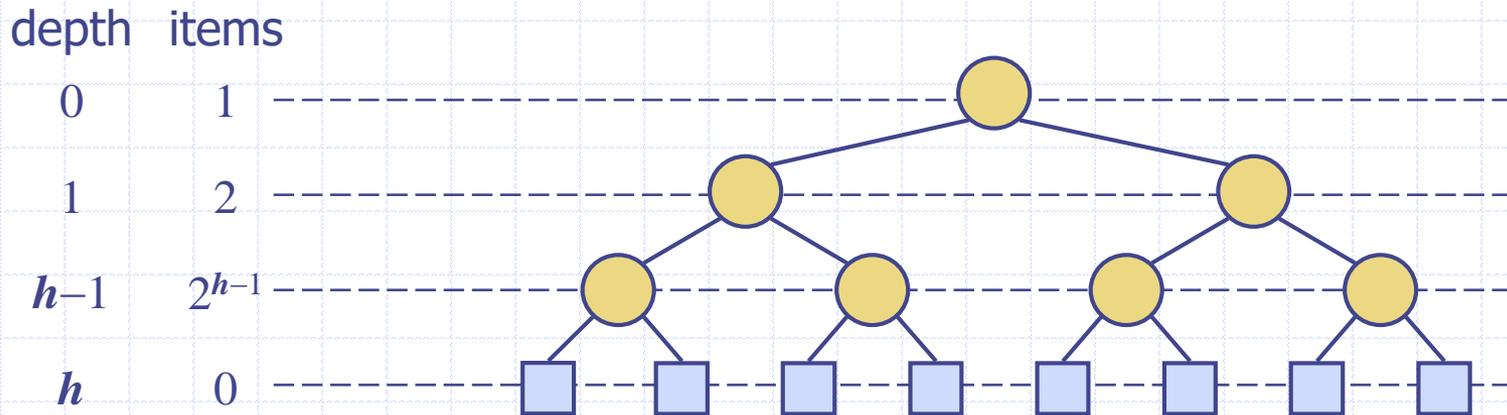
Height of a (2,4) Tree

(2,4)木の高さ

- ◆ **Theorem:** A (2,4) tree storing n items has height $O(\log n)$
- ◆ Searching in a (2,4) tree with n items takes $O(\log n)$ time

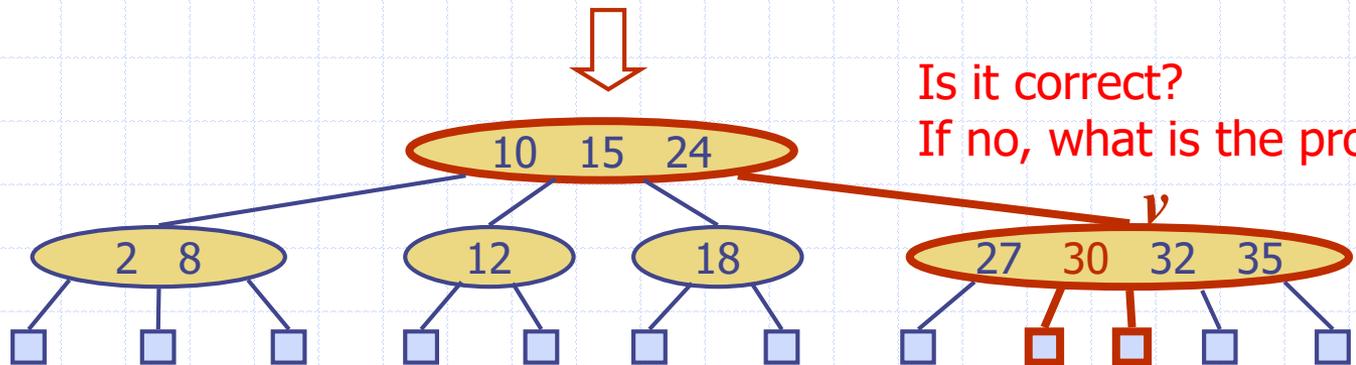
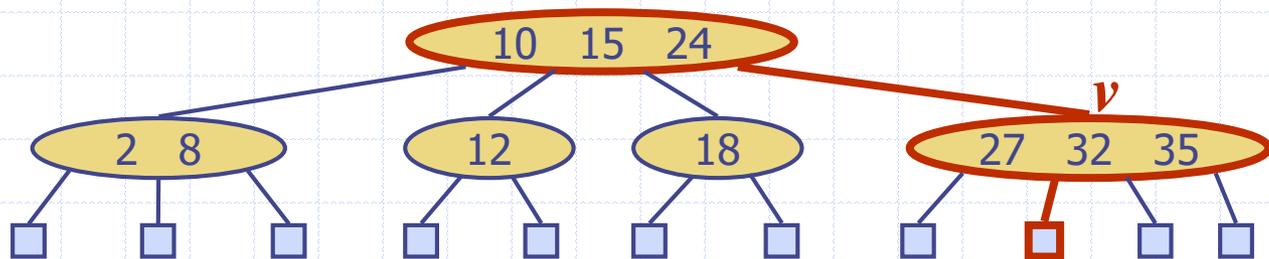
Work in Class

Hint: refer to the following binary tree,
proof this theorem



(2, 4) Tree: Insertion 挿入

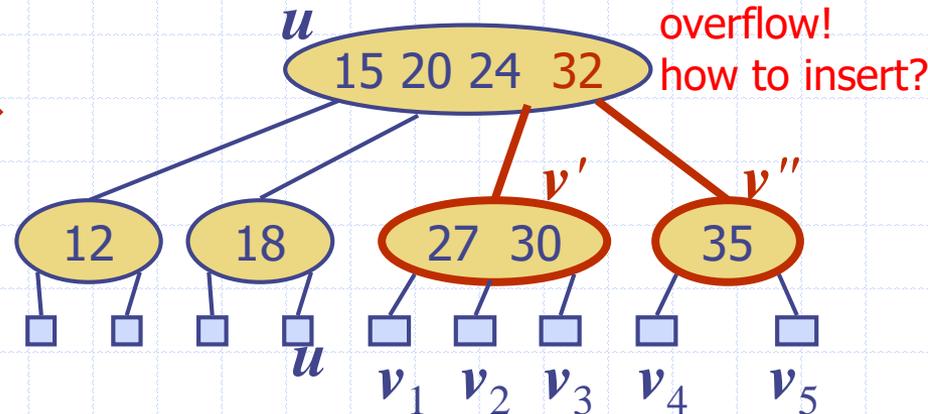
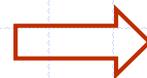
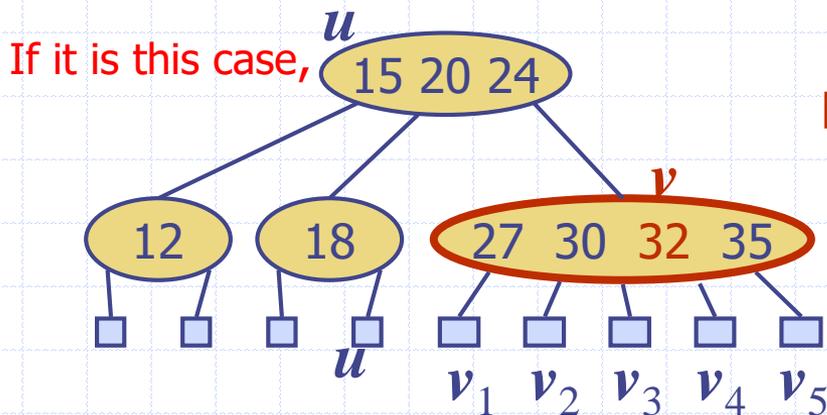
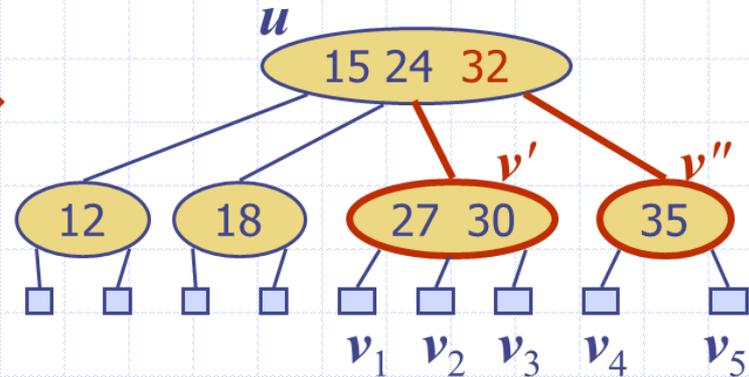
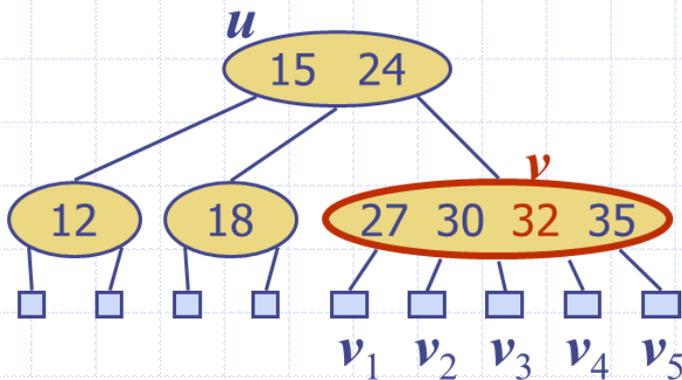
- ◆ We insert a new item at the parent v of the leaf reached by searching for k
 - We preserve the depth property but
 - We may cause an **overflow** (i.e., node v may become a 5-node)
ノード数が5になってしまいオーバーフロー
- ◆ Example: inserting key 30 causes an overflow



Overflow and Split

オーバーフローと分裂

- ◆ We handle an **overflow** at a 5-node v with a **split operation**:
オーバーフローを解決するために分裂を行う
- ◆ The overflow may propagate to the parent node u
親であるノード u によってオーバーフローが広まる

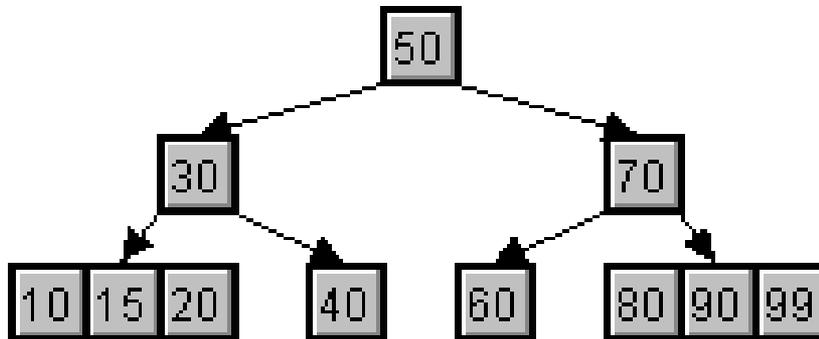


(2,4) Tree: Insertion

Inserting 60, 30, 10, 20, 50, 40, 70, 80, 15, 90, 99

2-3-4 tree insert

60	30	10	20	50	40	70	80	15	90	99
----	----	----	----	----	----	----	----	----	----	----



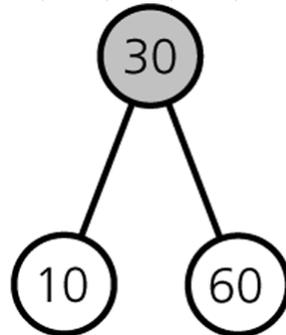
(2,4) Tree: Insertion

Inserting 60, 30, 10, 20 ...

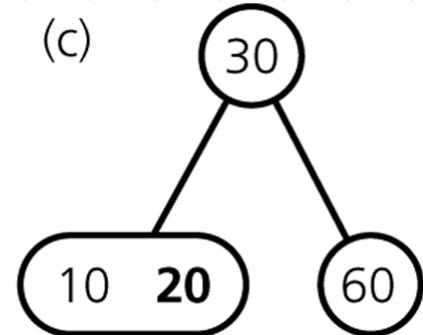
(a)



(b)



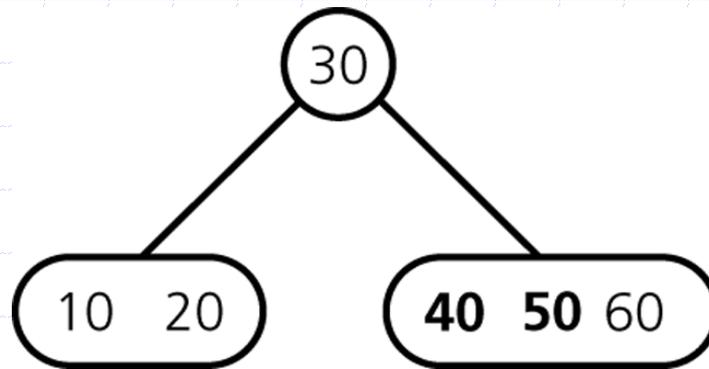
(c)



... 50, 40 ...

(2,4) Tree: Insertion

Inserting 50, 40 ...



... 70, ...

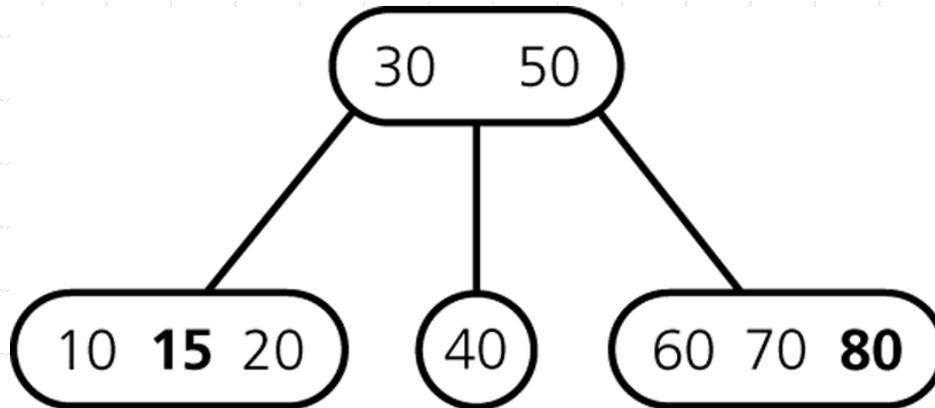
Work in class

Inserting 60, 30, 10, 20, 50, 40, 70, 80, 15, 90, 99

Insert 70, please draw (2,4) tree

(2,4) Tree: Insertion

Inserting 80, 15 ...



... 90 ...

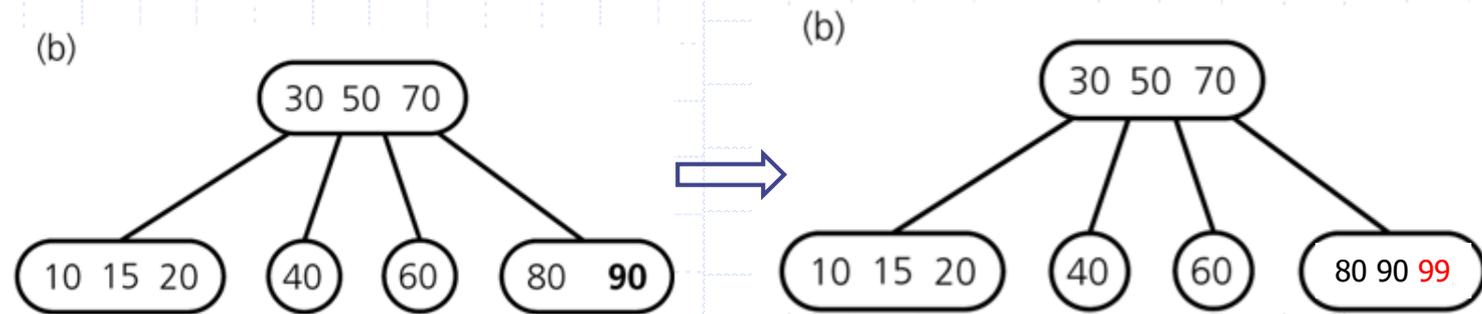
Work in class

Inserting 60, 30, 10, 20, 50, 40, 70, 80, 15, 90, 99

Insert 90, please draw (2,4) tree

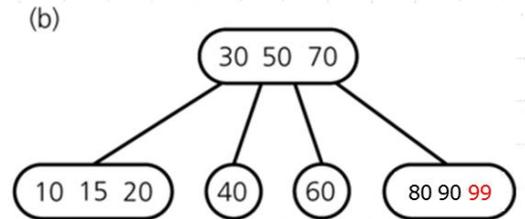
(2,4) Tree: Insertion

Inserting 99 ...

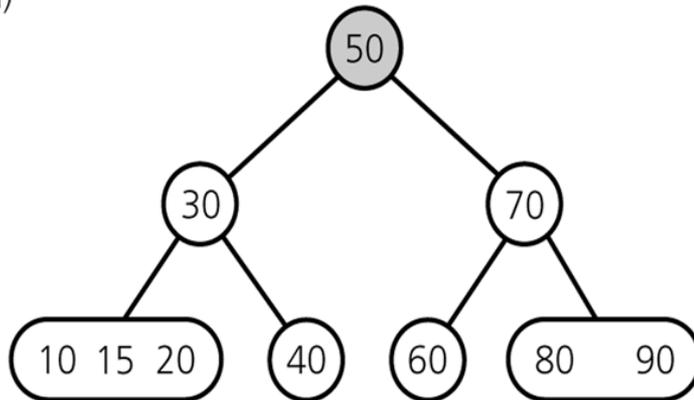


(2,4) Tree: Insertion

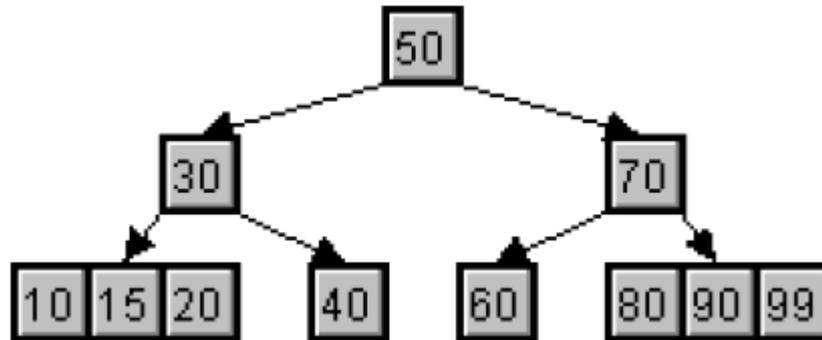
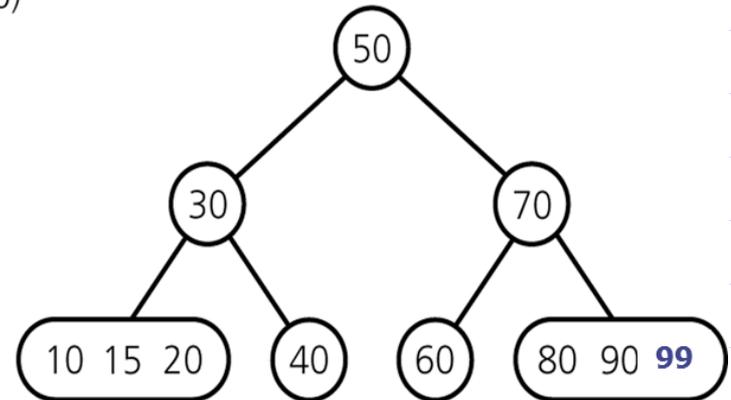
Inserting 99 ...



(a)



(b)



Insertion in 2-3-4 trees

Step 1 Search for the item to be inserted (same as in 2-3 trees).

Step 2 Insert at the leaf level. The following cases are possible:

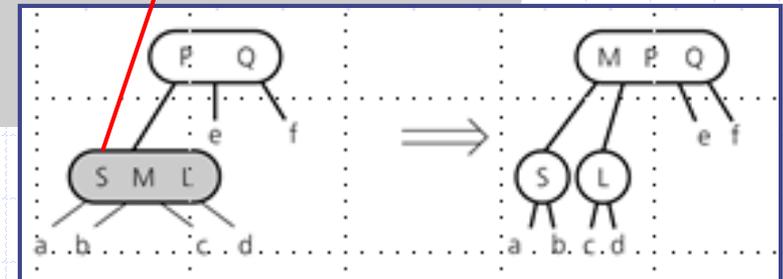
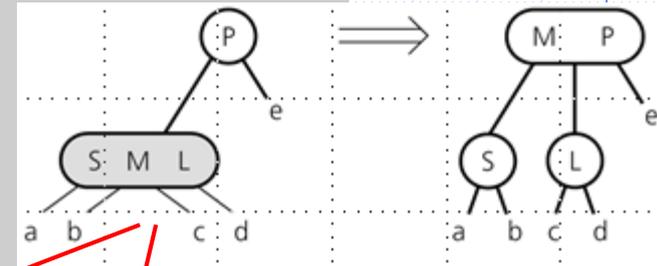
- The termination node is a 2-node. Then, make it a 3-node, and insert the new item appropriately.
- The termination node is a 3-node. Then, make it a 4-node, and insert the new item appropriately.
- The termination node is a 4 node. Split it, pass the middle to the parent, and insert the new item appropriately.

General rules for inserting new nodes in 2-3-4 trees:

Rule 1: During the search step, every time a 2-node connected to a 4-node is encountered, transform it into a 3-node connected to two 2-nodes.

Rule 2: During the search step, every time a 3-node connected to a 4-node is encountered, transform it into a 4-node connected to two 2-nodes.

Note that two 2-nodes resulting from these transformations have the same number of children as the original 4-node. This is why the split of a 4-node does not affect any nodes below the level where the split occurs.



Understand it from the Python code

Step 2 Insert at the leaf level. The following cases are possible:

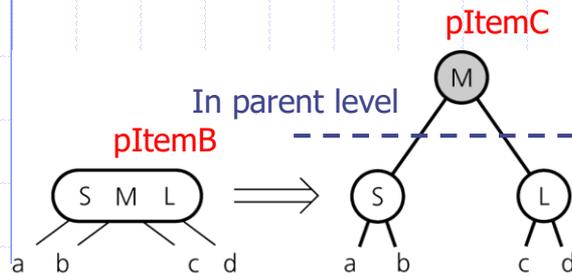
- The termination node is a 2-node. Then, make it a 3-node, and insert the new item appropriately.
- The termination node is a 3-node. Then, make it a 4-node, and insert the new item appropriately.
- The termination node is a 4 node. Split is, pass the middle to the parent, and insert the new item appropriately.

```
while True:
    if pCurNode.isFull(): #if node full,
        self.split(pCurNode) #split it
        pCurNode = pCurNode.getParent() #back up
        #search once
        pCurNode = self.getNextChild(pCurNode, dValue)
    #end if(node is full)

    elif pCurNode.isLeaf(): #if node is leaf,
        break #go insert
    #node is not full, not a leaf; so go to lower level
    else:
        pCurNode = self.getNextChild(pCurNode, dValue)
#end while
```

(2,4) Tree: Insertion Procedure

Splitting 4-nodes



```
def split(self, pThisNode):    #split the node
    #assumes node is full

    pItemC = pThisNode.removeItem() #remove items from
    pItemB = pThisNode.removeItem() #this node
    pChild2 = pThisNode.disconnectChild(2) #remove children
    pChild3 = pThisNode.disconnectChild(3) #from this node

    pNewRight = Node()        #make new node

    if pThisNode == self._pRoot:    #if this is the root,
        self._pRoot = Node()        #make new root
        pParent = self._pRoot        #root is our parent
        self._pRoot.connectChild(0, pThisNode) #connect to parent
    else:    #this node not the root
        pParent = pThisNode.getParent() #get parent

    #deal with parent
    itemIndex = pParent.insertItem(pItemB) #item B to parent
    n = pParent.getNumItems()            #total items?

    j = n-1 #move parent's
    while j > itemIndex:    #connections
        pTemp = pParent.disconnectChild(j)    #one child
        pParent.connectChild(j+1, pTemp)      #to the right
        j -= 1

    #connect newRight to parent
    pParent.connectChild(itemIndex+1, pNewRight)

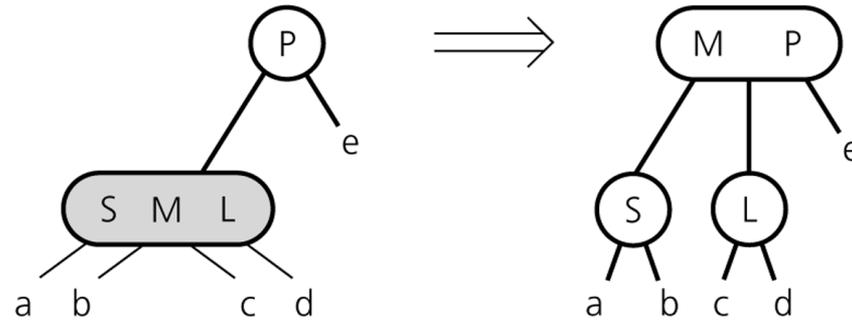
    #deal with newRight
    pNewRight.insertItem(pItemC)    #item C to newRight
    pNewRight.connectChild(0, pChild2) #connect to 0 and 1
    pNewRight.connectChild(1, pChild3) #on newRight

#end split()
```

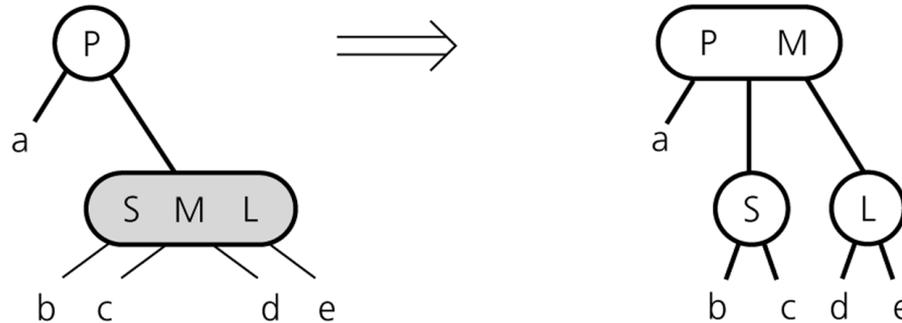
(2,4) Tree: Insertion Procedure

Splitting a 4-node whose parent is a 2-node during insertion

(a)

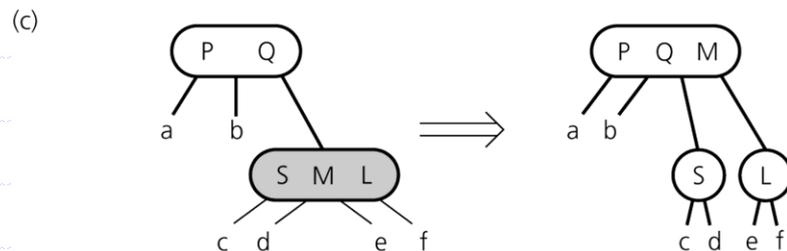
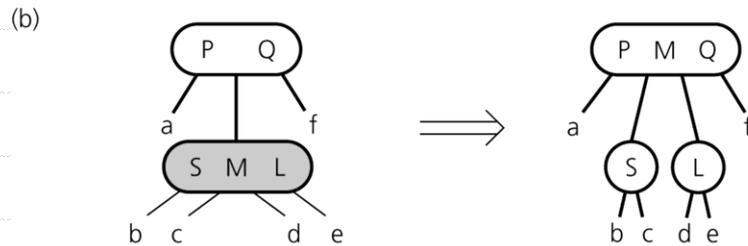
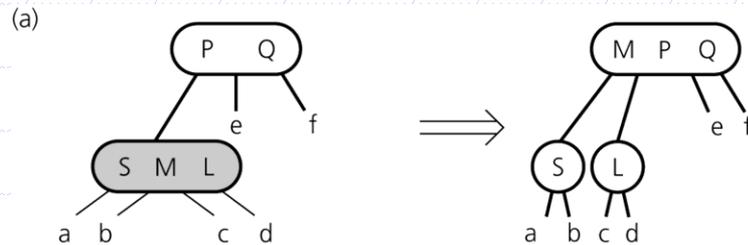


(b)



(2,4) Tree: Insertion Procedure

Splitting a 4-node whose parent is a 3-node during insertion



Analysis of Insertion

挿入の分析

Algorithm *insertItem(k, o)*

1. We search for key k to locate the insertion node v
2. We add the new item (k, o) at node v
3. **while** *overflow*(v)
 if *isRoot*(v)
 create a new empty root above v
 $v \leftarrow$ *split*(v)

- ◆ Let T be a (2,4) tree with n items
 n 個の値を持つ2-4木、 T で考察。
 - Tree T has $O(\log n)$ height
 - Step 1 takes $O(\log n)$ time because we visit $O(\log n)$ nodes
 - Step 2 takes $O(1)$ time
 - Step 3 takes $O(\log n)$ time because each split takes $O(1)$ time and we perform $O(\log n)$ splits
- ◆ Thus, an insertion in a (2,4) tree takes $O(\log n)$ time

2-3-4 Tree

- Insertion process implementation in python

```
class DataItem:
    def __init__(self, dd): #special method to create objects
        #with instances customized to a specific initial state
        self.dData = dd #one piece of data

    def displayItem(self): #format "/27"
        print '/', self.dData,
#end class DataItem
```

```

class Node:
    #as private instance variables don't exist in Python,
    #hence using a convention: name prefixed with an underscore, to treat them as non-public part
    _ORDER = 4
    def __init__(self):
        self._numItems = 0
        self._pParent = None
        self._childArray = [] #array of nodes
        self._itemArray = [] #array of data
        for j in xrange(self._ORDER): #initialize arrays
            self._childArray.append(None)
        for k in xrange(self._ORDER - 1):
            self._itemArray.append(None)

        #connect child to this node
    def connectChild(self, childNum, pChild):
        self._childArray[childNum] = pChild
        if pChild:
            pChild._pParent = self

        #disconnect child from this node, return it
    def disconnectChild(self, childNum):
        pTempNode = self._childArray[childNum]
        self._childArray[childNum] = None
        return pTempNode

    def getChild(self, childNum):
        return self._childArray[childNum]

    def getParent(self):
        return self._pParent

    def isLeaf(self):
        return not self._childArray[0]

    def getNumItems(self):
        return self._numItems

    def getItem(self, index): #get DataItem at index
        return self._itemArray[index]

    def isFull(self):
        return self._numItems==self._ORDER - 1

```

```

def findItem(self, key):          #return index of
    for j in xrange(self._ORDER-1): #item (within node)
        if not self._itemArray[j]:    #if found,
            break #otherwise,
        elif self._itemArray[j].dData == key: #return -1
            return j

    return -1
#end findItem

def insertItem(self, pNewItem):
    #assumes node is not full
    self._numItems += 1 #will add new item
    newKey = pNewItem.dData #key of new item

    for j in reversed(xrange(self._ORDER-1)): #start on right, #examine items
        if self._itemArray[j] == None: #if item null,
            pass #go left one cell
        else: #not null,
            itsKey = self._itemArray[j].dData #get its key
            if newKey < itsKey: #if it's bigger
                self._itemArray[j+1] = self._itemArray[j] #shift it right
            else:
                self._itemArray[j+1] = pNewItem #insert new item
                return j+1 #return index to new item
    #end else (not null)
#end for #shifted all items,
self._itemArray[0] = pNewItem #insert new item
return 0
#end insertItem()

```

```

def removeItem(self):  #remove largest item
    #assumes node not empty
    pTemp = self._itemArray[self._numItems-1]      #save item
    self._itemArray[self._numItems-1] = None      #disconnect it
    self._numItems -= 1 #one less item
    return pTemp #return item

def displayNode(self): #format "/24/56/74"
    for j in xrange(self._numItems):
        self._itemArray[j].displayItem()          #format "/56"
    print '/' #final "/"

#end class Node

```

```

class Tree234:
    #as private instance variables don't exist in Python,
    #hence using a convention: name prefixed with an underscore, to treat them as non-public part
    def __init__(self):
        self._pRoot = Node()    #root node

    def find(self, key):
        pCurNode = self._pRoot    #start at root
        while True:
            childNumber=pCurNode.findItem(key)
            if childNumber != -1:
                return childNumber    #found it
            elif pCurNode.isLeaf():
                return -1#can't find it
            else:    #search deeper
                pCurNode = self.getNextChild(pCurNode, key)

        #end while

    def insert(self, dValue):    #insert a DataItem
        pCurNode = self._pRoot
        pTempItem = DataItem(dValue)

        while True:
            if pCurNode.isFull():    #if node full,
                self.split(pCurNode)    #split it
                pCurNode = pCurNode.getParent()    #back up
                #search once
                pCurNode = self.getNextChild(pCurNode, dValue)
            #end if(node is full)

            elif pCurNode.isLeaf():    #if node is leaf,
                break    #go insert
            #node is not full, not a leaf; so go to lower level
            else:
                pCurNode = self.getNextChild(pCurNode, dValue)

        #end while
        pCurNode.insertItem(pTempItem)    #insert new item
    #end insert()

```

```

def split(self, pThisNode):      #split the node
    #assumes node is full

    pItemC = pThisNode.removeItem() #remove items from
    pItemB = pThisNode.removeItem() #this node
    pChild2 = pThisNode.disconnectChild(2) #remove children
    pChild3 = pThisNode.disconnectChild(3) #from this node

    pNewRight = Node()          #make new node

    if pThisNode == self._pRoot: #if this is the root,
        self._pRoot = Node()     #make new root
        pParent = self._pRoot    #root is our parent
        self._pRoot.connectChild(0, pThisNode) #connect to parent
    else: #this node not the root
        pParent = pThisNode.getParent() #get parent

    #deal with parent
    itemIndex = pParent.insertItem(pItemB) #item B to parent
    n = pParent.getNumItems()           #total items?

    j = n-1 #move parent's
    while j > itemIndex: #connections
        pTemp = pParent.disconnectChild(j) #one child
        pParent.connectChild(j+1, pTemp)  #to the right
        j -= 1

        #connect newRight to parent
    pParent.connectChild(itemIndex+1, pNewRight)

    #deal with newRight
    pNewRight.insertItem(pItemC) #item C to newRight
    pNewRight.connectChild(0, pChild2) #connect to 0 and 1
    pNewRight.connectChild(1, pChild3) #on newRight

#end split()

```

```

#gets appropriate child of node during search of value
def getNextChild(self, pNode, theValue):
    #assumes node is not empty, not full, not a leaf
    numItems = pNode.getNumItems()

    for j in xrange(numItems):      #for each item in node
        if theValue < pNode.getItem(j).dData:  #are we less?
            return pNode.getChild(j)          #return left child
    else:  #end for      #we're greater, so
        return pNode.getChild(j + 1)        #return right child

def displayTree(self):
    self.recDisplayTree(self._pRoot, 0, 0)

def recDisplayTree(self, pThisNode, level, childNumber):
    print 'level=', level, 'child=', childNumber,
    pThisNode.displayNode() #display this node

    #call ourselves for each child of this node
    numItems = pThisNode.getNumItems()
    for j in xrange(numItems+1):
        pNextNode = pThisNode.getChild(j)
        if pNextNode:
            self.recDisplayTree(pNextNode, level+1, j)
        else:
            return
    #end recDisplayTree()
#end class Tree234

```

```
pTree = Tree234()
pTree.insert(50)
pTree.insert(40)
pTree.insert(60)
pTree.insert(30)
pTree.insert(70)

#as Python doesn't support switch, simulating the same with dictionary and functions
def show():
    pTree.displayTree()

def insert():
    value = int(raw_input('Enter value to insert: '))
    pTree.insert(value)

def find():
    value = int(raw_input('Enter value to find: '))
    found = pTree.find(value)
    if found != -1:
        print 'Found', value
    else:
        print 'Could not find', value

case = { 's' : show,
        'i' : insert,
        'f' : find}
#switch simulation completed

while True:
    print
    choice = raw_input('Enter first letter of show, insert, or find: ')
    if case.get(choice, None):
        case[choice]()
    else:
        print 'Invalid entry'

#end while
del pTree
#end
```

2-3-4 tree demo

<http://www.cs.unm.edu/~rlpm/499/tft.html>

[2-3-4-tree.jar](#)

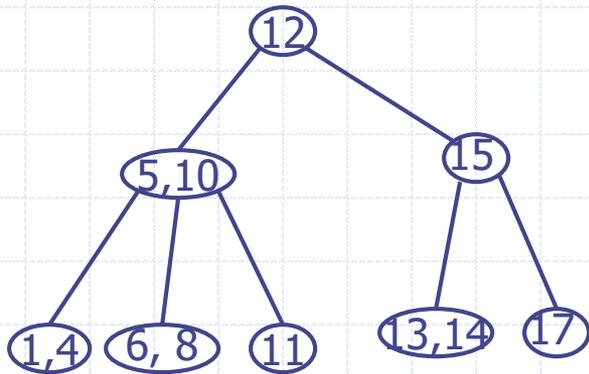
<http://stackoverflow.com/questions/15047935/234-tree-python>

<http://www.clear.rice.edu/comp212/01-fall/lectures/33/>

https://tbc-python.fossee.in/convert-notebook/Sams_Teach_Yourself_Data_Structures_and_Algorithms_Analysis_in_24_Hours/chapter20_1.ipynb

Exercise 5-1

Consider the following sequence of keys: (2,3,7,9). Insert the items with this set of keys in the order given into the (2,4) tree below. Draw the tree after each removal.

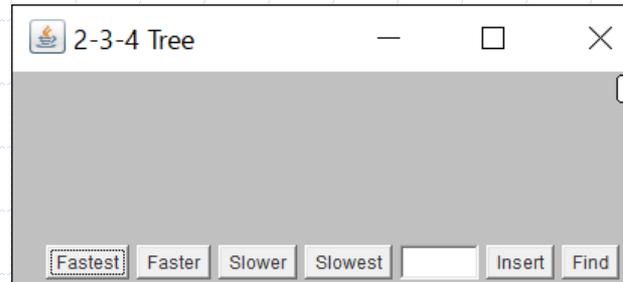


キー配列について考える: (2,3,7,9)。
このキーのセットを図の(2,4)木に挿入しなさい。
それぞれの挿入後の(2,4)木を描きなさい。

Exercise 5-2

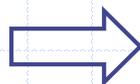
- 3.3.1 Understand 2-3-4 tree and run the example implementation in Python (given in this slide)
- 3.3.2 (optional) Improve the program so that it have GUI for insertion

```
pTree.insert(50)  
pTree.insert(40)  
pTree.insert(60)  
pTree.insert(30)  
pTree.insert(70)
```



and can display 2-3-4 tree.

```
Enter first letter of show, insert, or find: s  
level= 0 child= 0 / 50 /  
level= 1 child= 0 / 30 / 40 /  
level= 1 child= 1 / 60 / 70 /
```

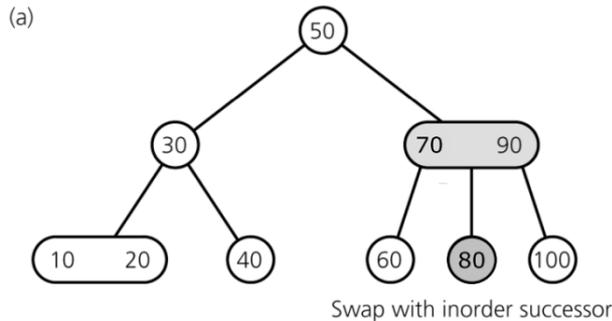


2-3-4 Tree: Deletion

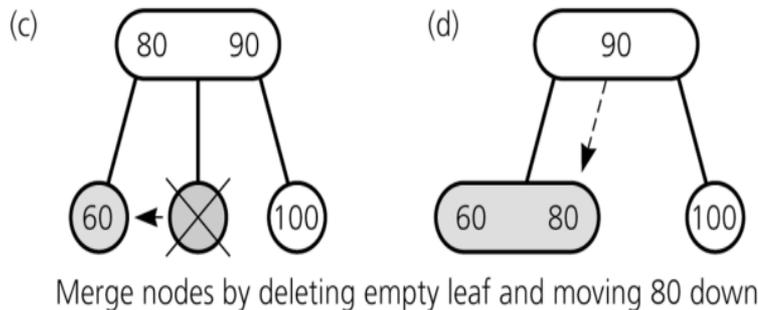
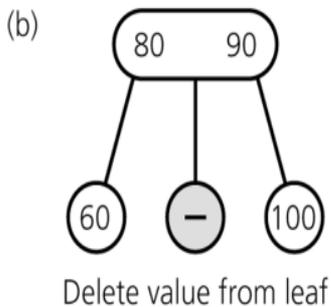
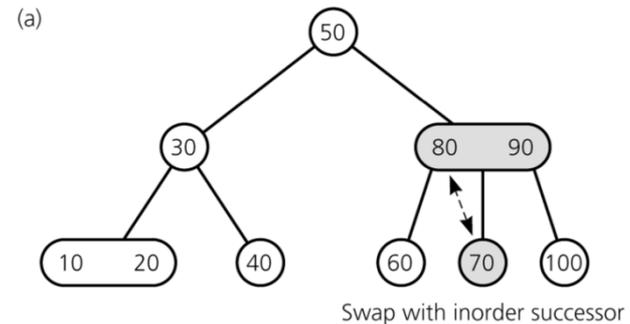
Deletion procedure:

- items are deleted at the leafs
 → **swap item** of internal node with inorder successor

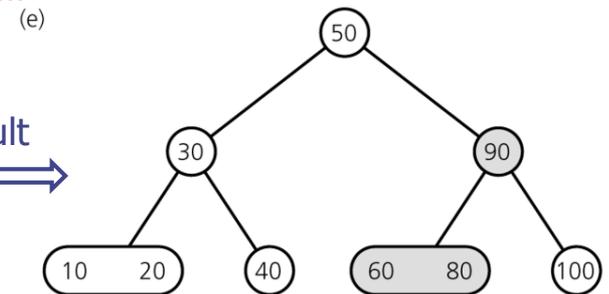
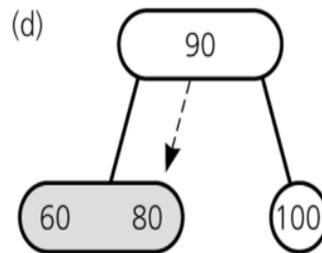
Delete 70



Deleting 70: swap 70 with inorder successor (80)



Delete, then handle problem

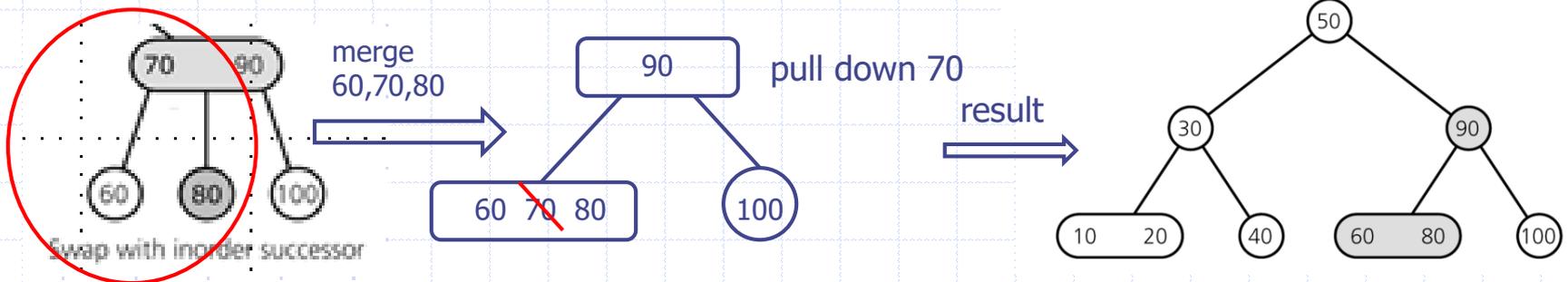
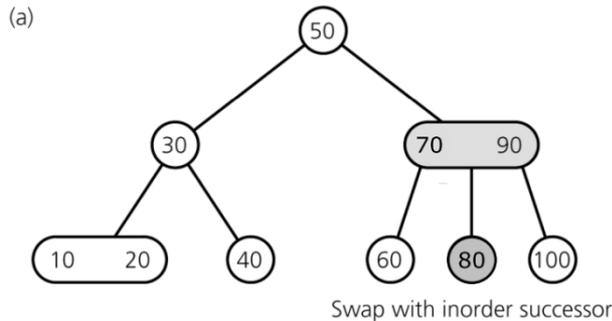


2-3-4 Tree: Deletion

Deletion procedure:

- items are deleted at the leafs
→ **swap item** of internal node with inorder successor

Delete 70



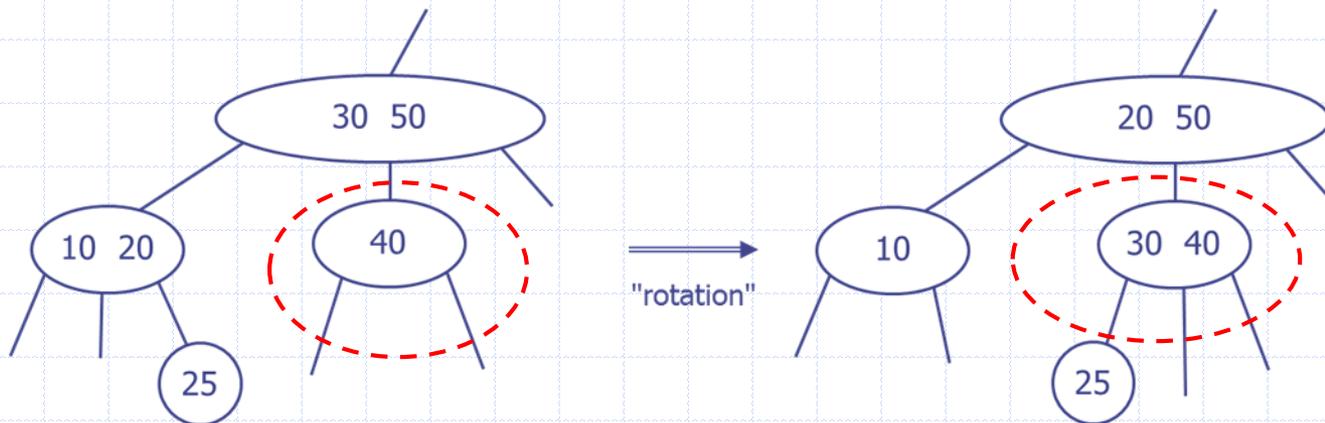
Prevent problem, then delete

2-3-4 Tree: Deletion

Note: a 2-node leaf creates a problem (1-node, **underflow**)
Solution: on the way from the root down to the leaf
- **turn 2-nodes (except root) into 3-nodes**

Case 1: an adjacent sibling has 2 or 3 items

→ "steal" item from sibling by rotating items and moving subtree

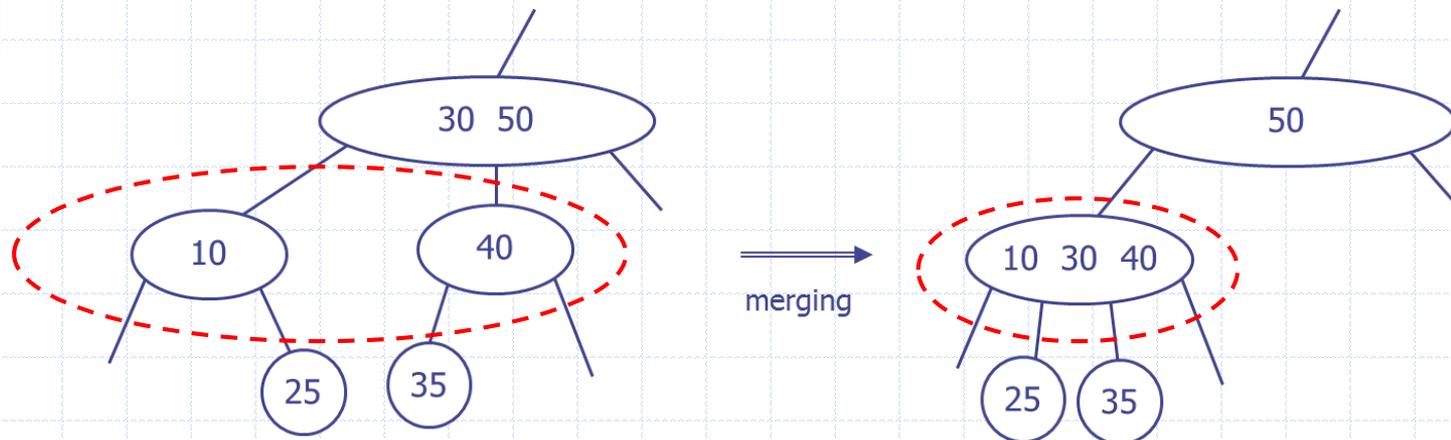


2-3-4 Tree: Deletion

Turning a 2-node into a 4-node ...

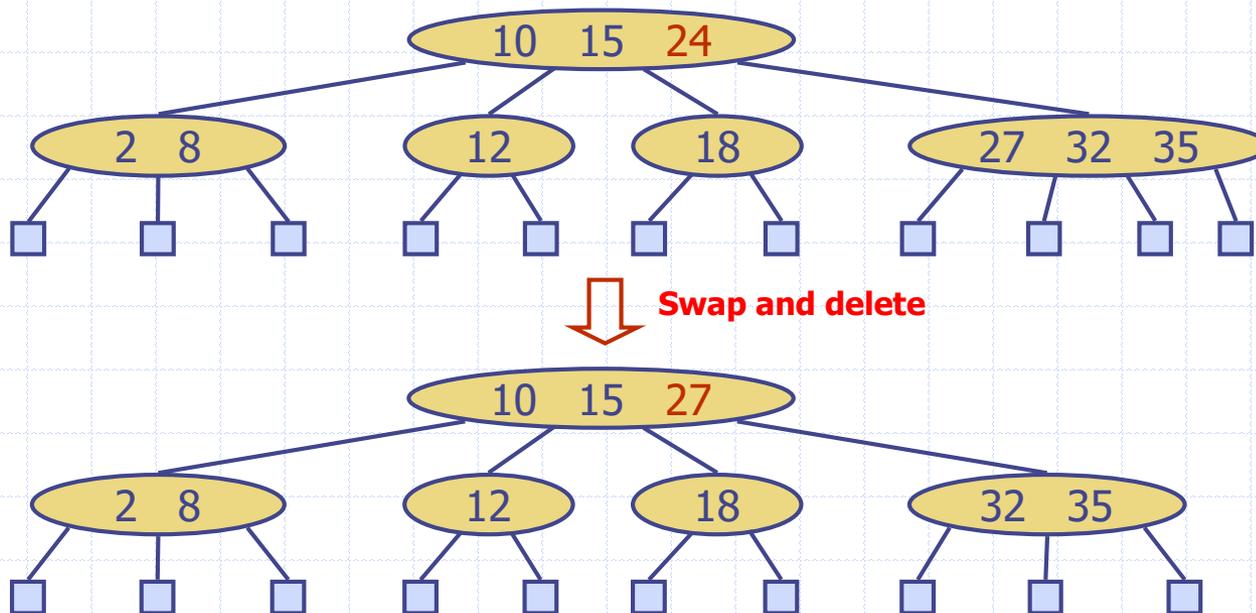
Case 2: each adjacent sibling has only one item

→ "steal" item from parent and merge node with sibling
(note: parent has at least two items, unless it is the root)



Deletion - more example

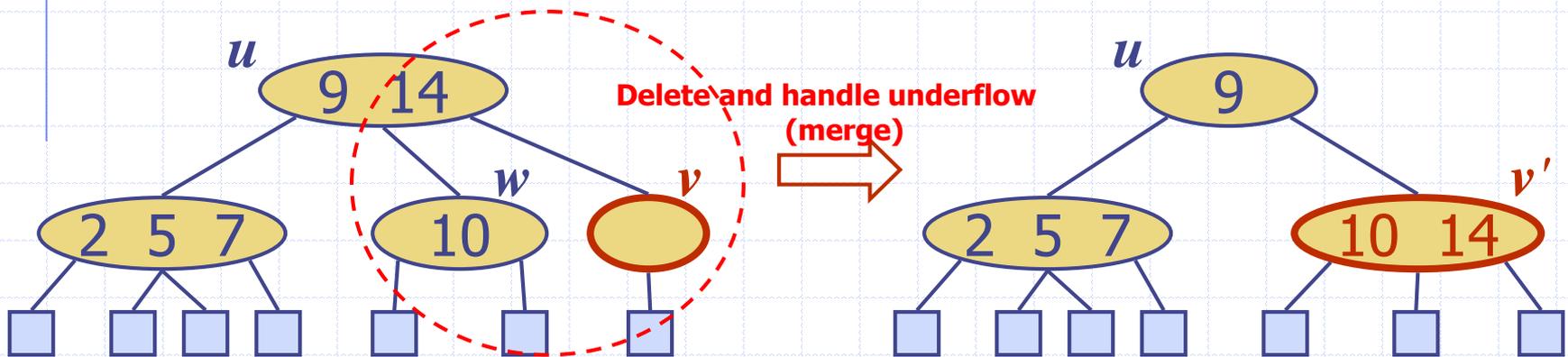
- ◆ Example: to delete key 24, we replace it with 27 (inorder successor)



Deletion - more example

the adjacent siblings of v are 2-nodes

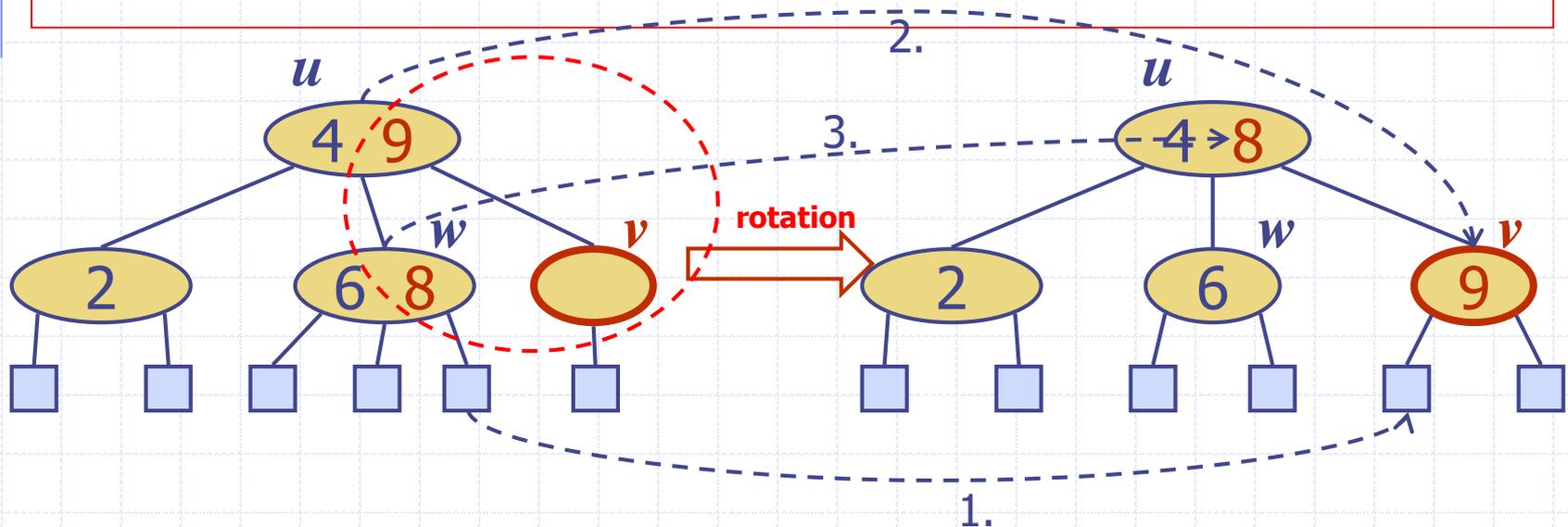
- merge v with an adjacent sibling w and move an item from u to the merged node v'
- After merging, the underflow may propagate to the parent u



Deletion - more example

an adjacent sibling w of v is a 3-node or a 4-node

- **Transfer operation:**
 1. we move a child of w to v
 2. we move an item from u to v
 3. we move an item from w to u
- After a transfer, no underflow occurs



Analysis of Deletion

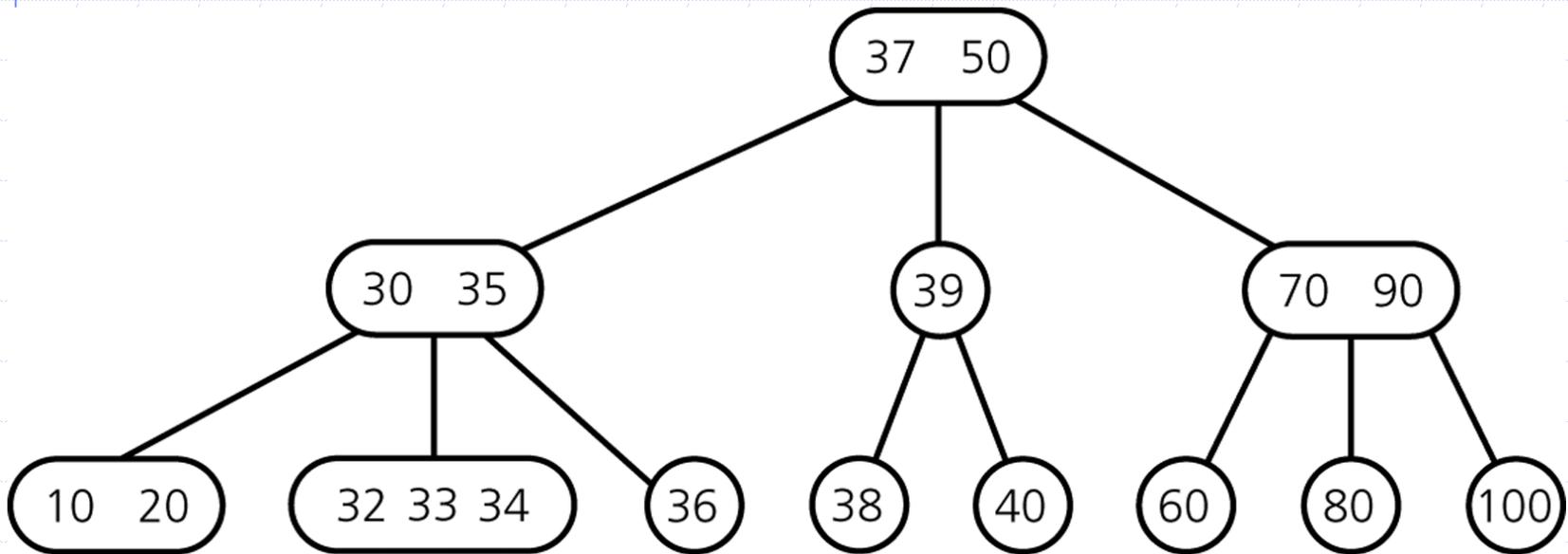
削除の分析

- ◆ Let T be a $(2,4)$ tree with n items
 - Tree T has $O(\log n)$ height
木 T の高さは $O(\log n)$
- ◆ In a deletion operation
 - We visit $O(\log n)$ nodes to locate the node from which to delete the item
削除するために $O(\log n)$ のノードを訪れる
 - We handle an underflow with a series of $O(\log n)$ fusions, followed by at most one transfer
 - Each fusion and transfer takes $O(1)$ time
合体と移動: $O(1)$

Thus, deleting an item from a $(2,4)$ tree takes $O(\log n)$ time
(2,4)木での削除の時間: $O(\log n)$

2-3-4 Tree: Deletion Practice

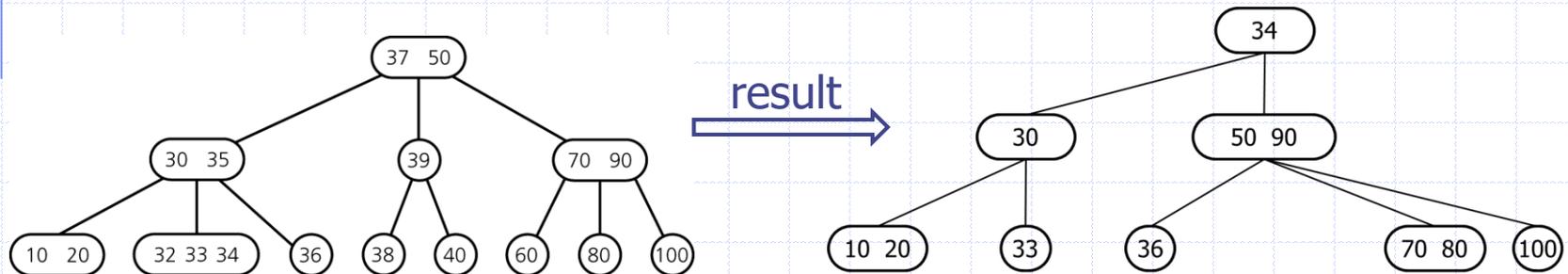
Delete 32, 35, 40, 38, 39, 37, 60



2-3-4 Tree: Deletion Practice

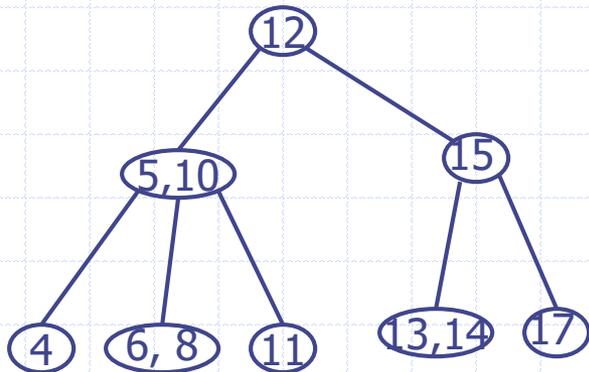
(solution)

Delete 32, 35, 40, 38, 39, 37, 60



Exercise 5-3 (move to L6)

Consider the following sequence of keys: (4, 12, 13, 14). Remove the items with this set of keys in the order given from the (2,4) tree below. Draw the tree after each removal.



キー配列について考える: (4, 12, 13, 14)。
このキーのセットを図の(2,4)木に削除しなさい。
それぞれの削除後の(2,4)木を描きなさい。