

# Spatio-temporal access methods

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- Indexing the Current
- Indexing the Future

# Indexing the past

Multi-dimensional structures

Tong Jia

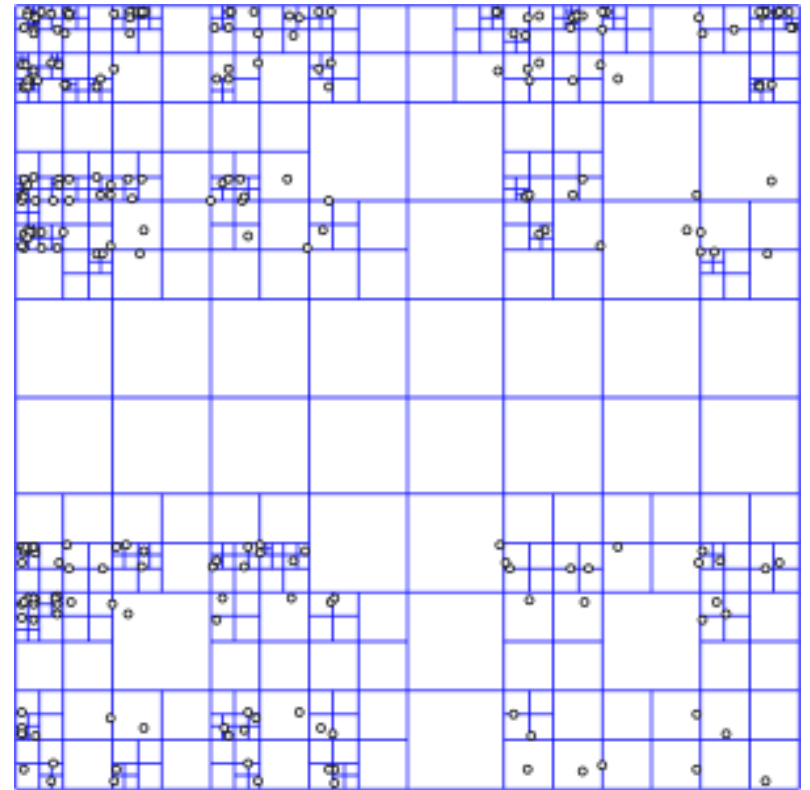
# PH-Tree

## (PATRICIA-hypercube-tree)

- A multi-dimensional data structure
- Extends both the Quad-tree and the PATRICIA-trie
- Optimize the search performance and the space utilization
- Indexing large amounts of multi-dimensional data.

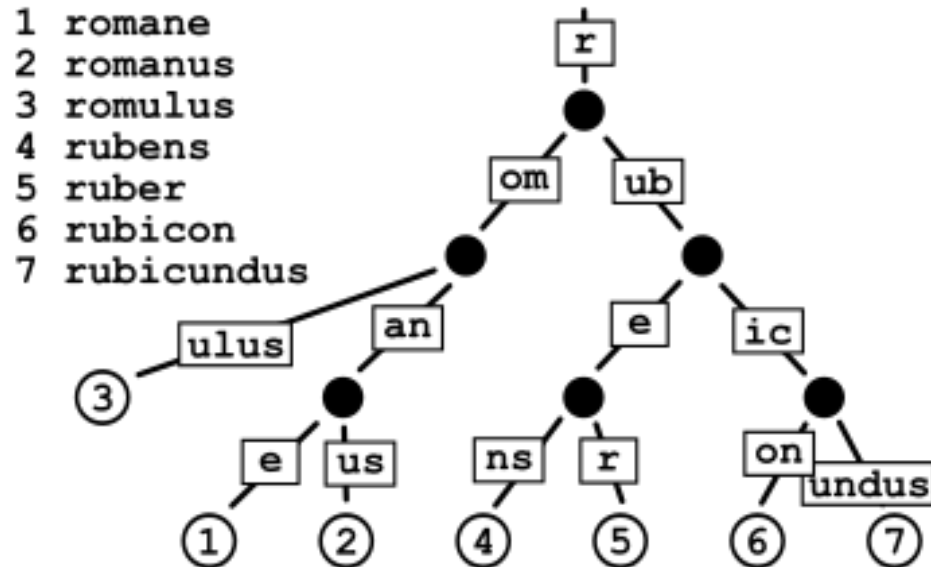
# Quad-tree

- Efficiently store data of points on a two-dimensional space.
- Each node has at most four children.
- Rarely used outside 2D or 3D problems



# PATRICIA-Trie (prefix tree)

Radix Trie



- Trie: strings are stored in a prefix-sharing method--Much more space efficient than storing each key individually.
- PATRICIA trees are radix trees with radix equals 2
- In general, any kind of data can be stored in such a tree by taking the bit representation of the data

# PH-Tree

- k-dimensional object
- Partitions the space across all dimensions at any given node.
- Serializes the attributes of the indexed objects using binary representation.
- Can be seen as a hyper-cube of size  $2^k$
- Is essentially a quadtree that uses hyper-cubes, prefix-sharing and bit-stream storage.

# Advantages

- Makes access virtually independent of the order.
- Reduce the number of nodes in the tree
- The maximum depth is independent of  $k$  and equal to the number of bits in the longest stored value.



# Advantages

- No need for rebalancing because it's ubalanced.
- Stable with respect to insert or delete operations.
- This is useful for concurrency when stored on disk--limits the number of pages that need to be rewritten.

# 1D PH-Tree

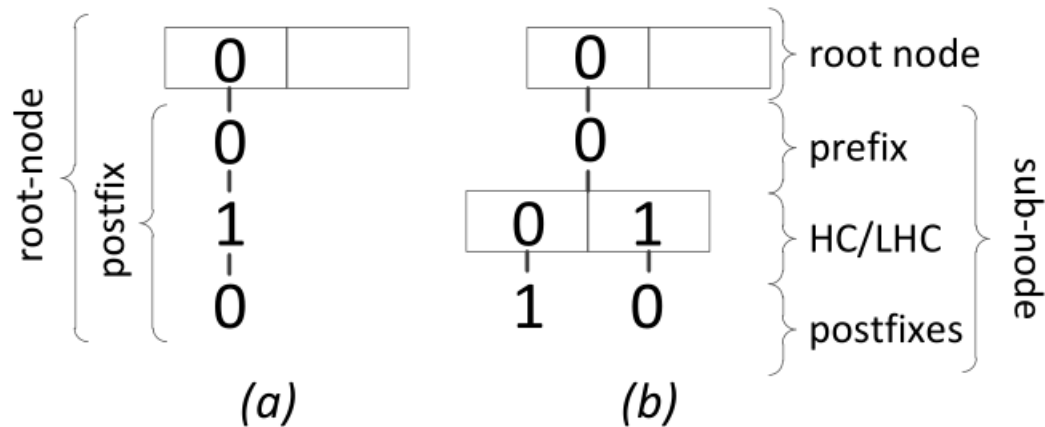


Figure 1: A sample 1D PH-tree with one 4-bit entry (a) and two 4-bit entries (b)

- resembles the binary PATRICIA trie.
- The value is stored in its binary representation as a bit-string.
- The first bit is stored in the root node.(In the 1D-case, all entries starting with a 0 can be found below the left box, all starting with a 1 can be found below the right box.)
- The depth of the trees is thus limited to 4.

# 1D PH-Tree

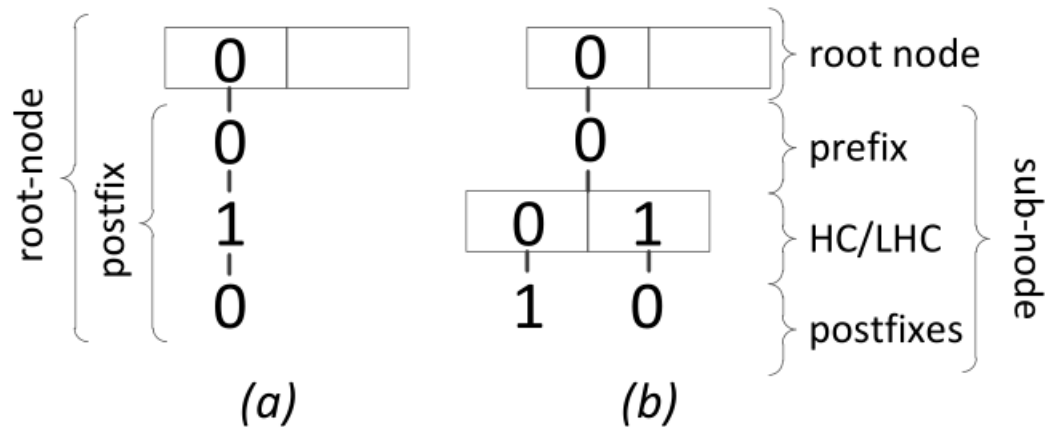


Figure 1: A sample 1D PH-tree with one 4-bit entry (a) and two 4-bit entries (b)

- Entries that are attached to an array field without further sub-nodes, such as the 010, are called a **postfix**.
- A second value 0001 has been **added** to the tree in Figure1b.

# 2D PH-tree

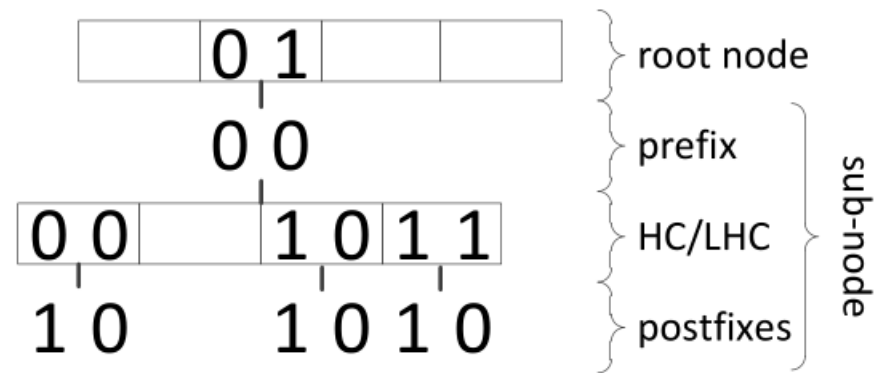


Figure 2: A sample 2D PH-tree with three 4-bit entries:  
(0001, 1000), (0011, 1000), (0011, 1010)

# Indexing the current

Xiangyu Li

# Challenges

- Frequent Updating

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- Frequent Updating

- Locating -> Top-down
- Deletion -> Merging
- Insertion -> Splitting

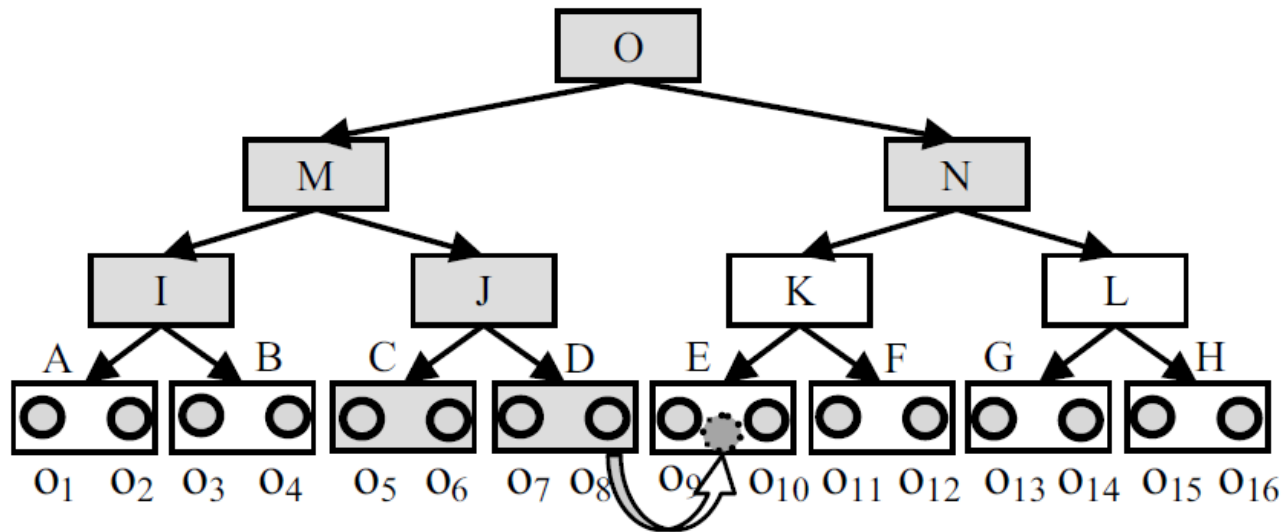


Fig. 1 An Example of Location Update

# Challenges

- Frequent Updating
  - Locating -> Top-down
  - Deletion -> Merging
  - Insertion -> Splitting
- Inefficient -> Real-time Response



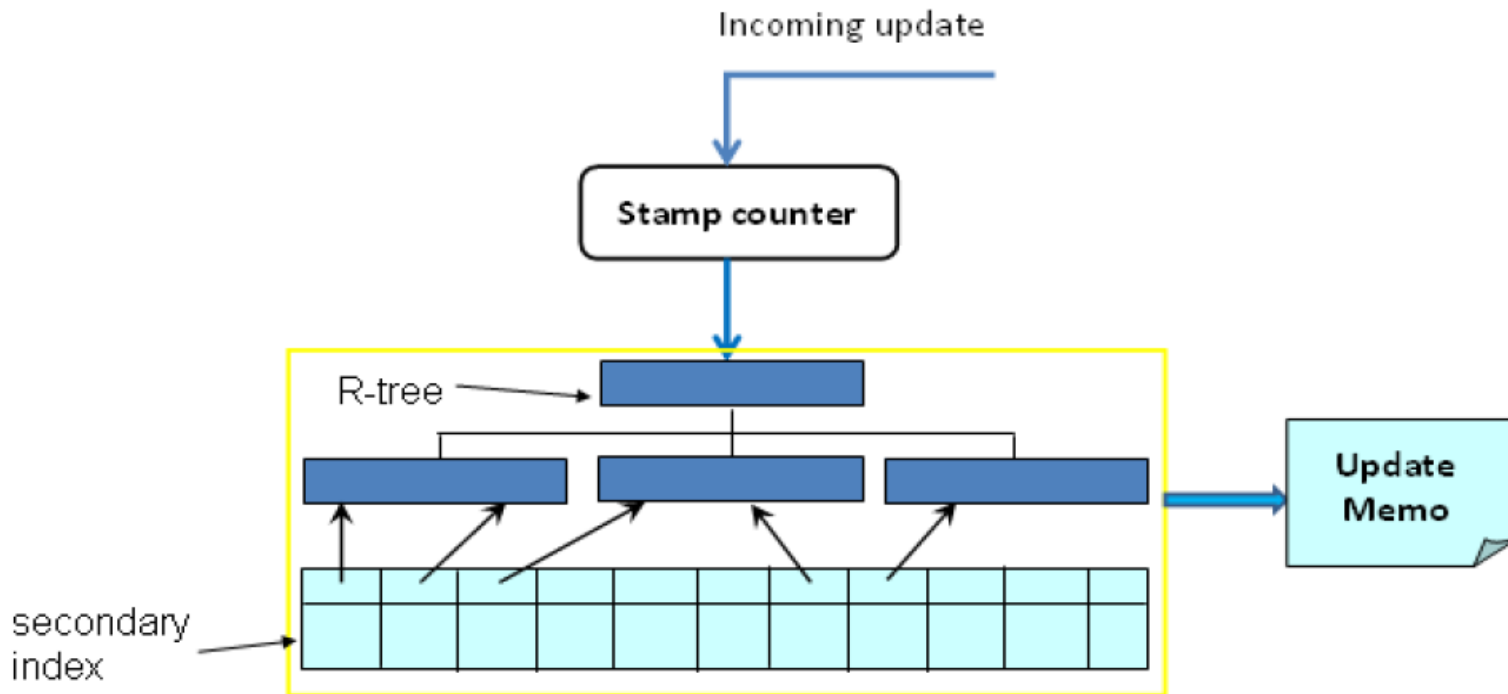
# Challenges

- Frequent Updating
  - Locating -> Top-down
  - Deletion -> Merging
  - Insertion -> Splitting
- Inefficient -> Real-time Response X
- Caching -> Reduce I/O cost -> Real-time Response

# Challenges

- Frequent Updating
  - Locating -> Top-down
  - Deletion -> Merging
  - Insertion -> Splitting
- Inefficient -> Real-time Response X
- Caching -> Reduce I/O cost -> Real-time Response
- 1. RUM+-tree(R-tree-based)
- 2. DIME(Disposable Index for Moving Objects)

# RUM+-tree



**Fig. 2.** Structure of RUM+-tree

- Hash Table(with Obj ID) + Update Memo

# RUM+-tree

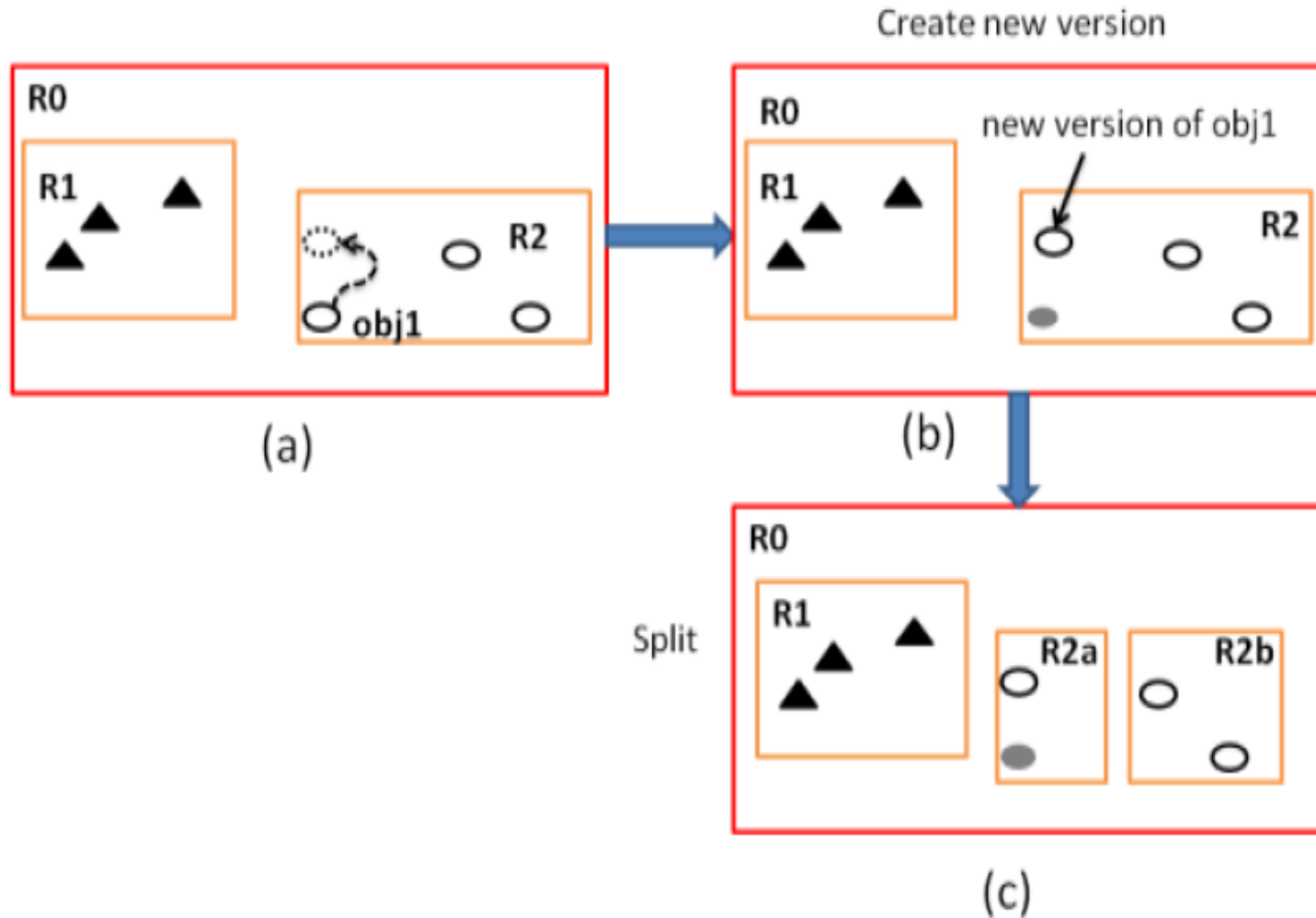
- Hash Table(with Obj ID)
- -> directly locate objects
  
- Update Memo
- -> cache the costly modification

# RUM+-tree

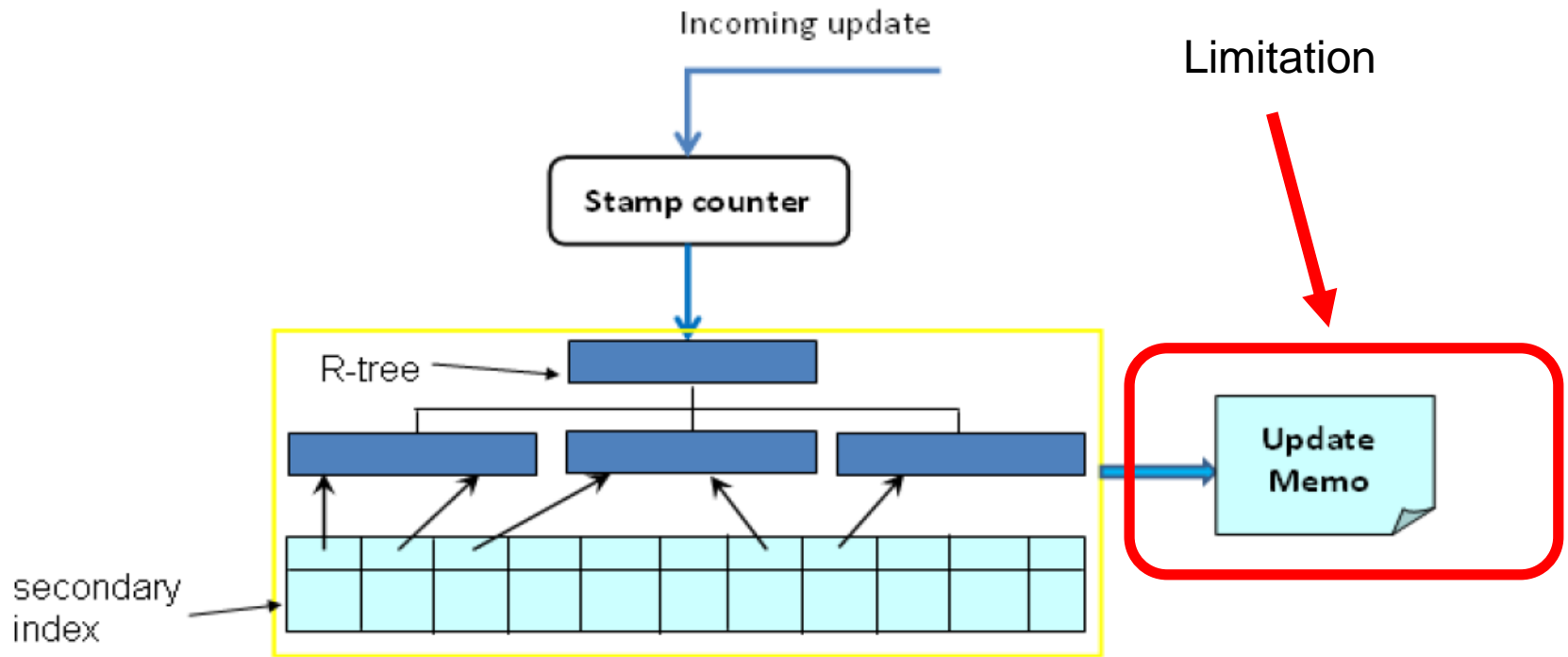
- With Update Memo
- Update:
  - Cheap one -> do
  - Costly -> cache

Lazy Update + Batch -> Avoid Frequent split/merge

# RUM+-tree



# RUM+-tree



**Fig. 2.** Structure of RUM+-tree

# DIME: Disposable Index for Moving Objects

- Do not modify the index **at all!**



# DIME: Disposable Index for Moving Objects

- Do not modify the index **at all!**
- Modify the index ->
- Detach a whole chunk of the index

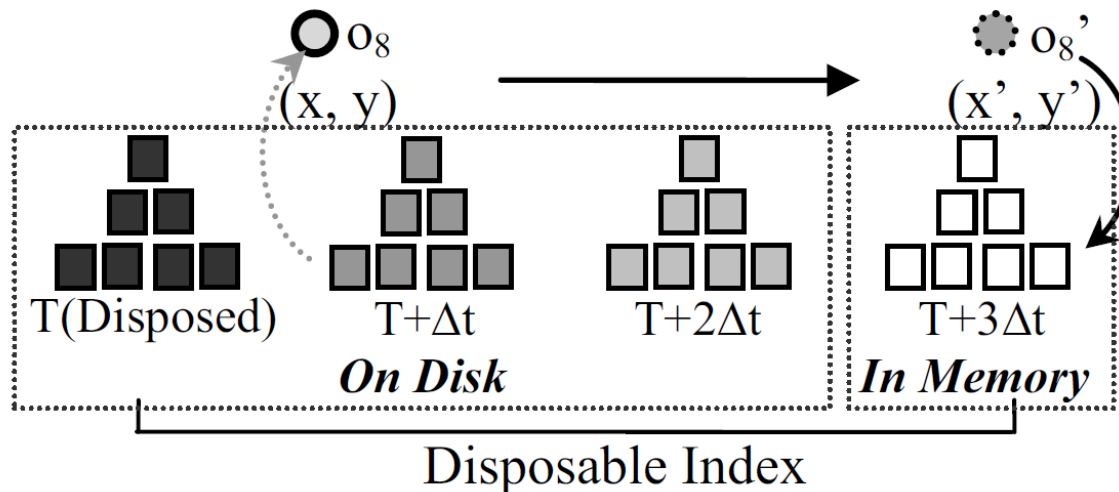


Fig. 2 Location Update on Disposable Index

# DIME

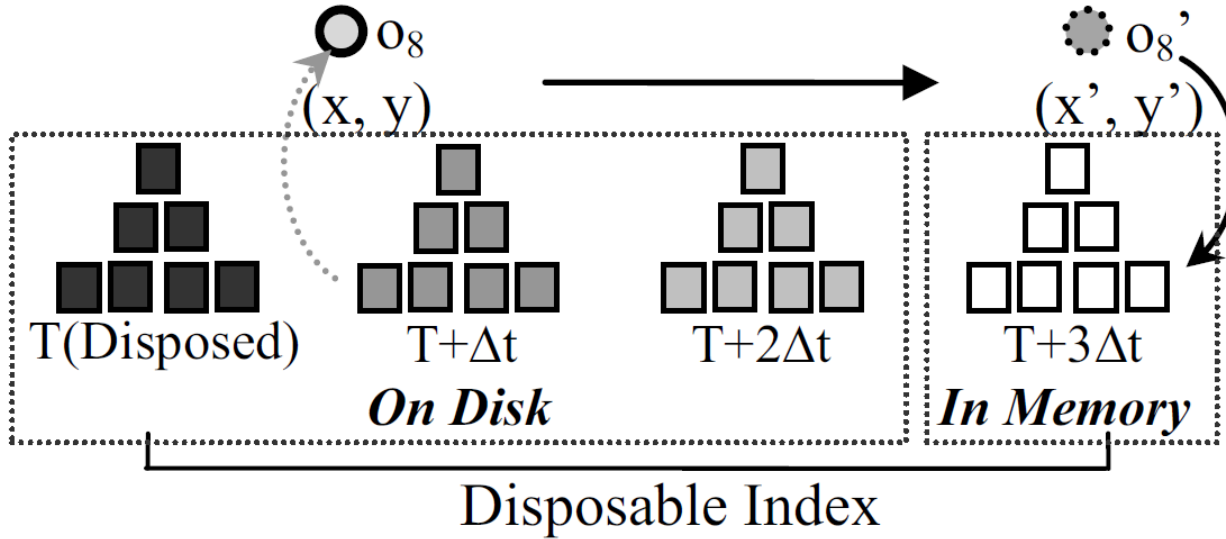


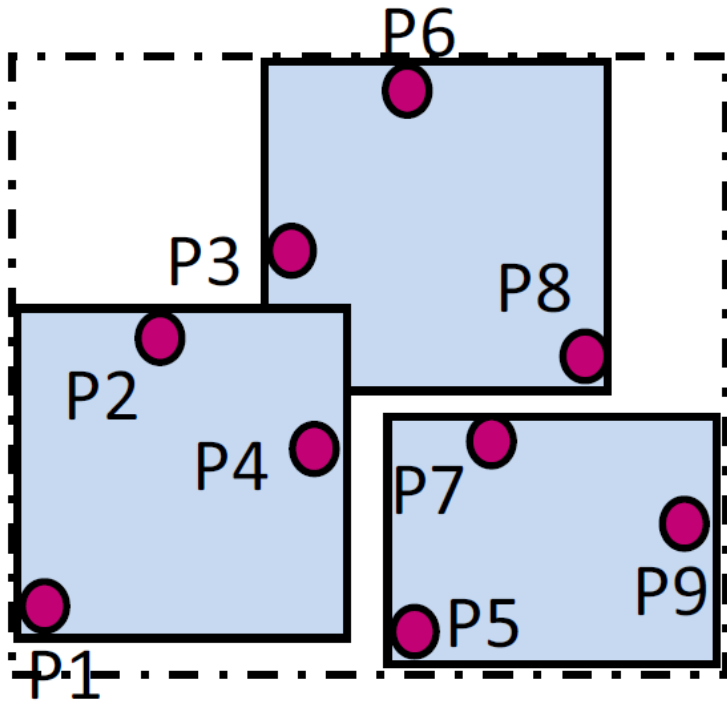
Fig. 2 Location Update on Disposable Index

TABLE I. TERMS AND NOTATIONS

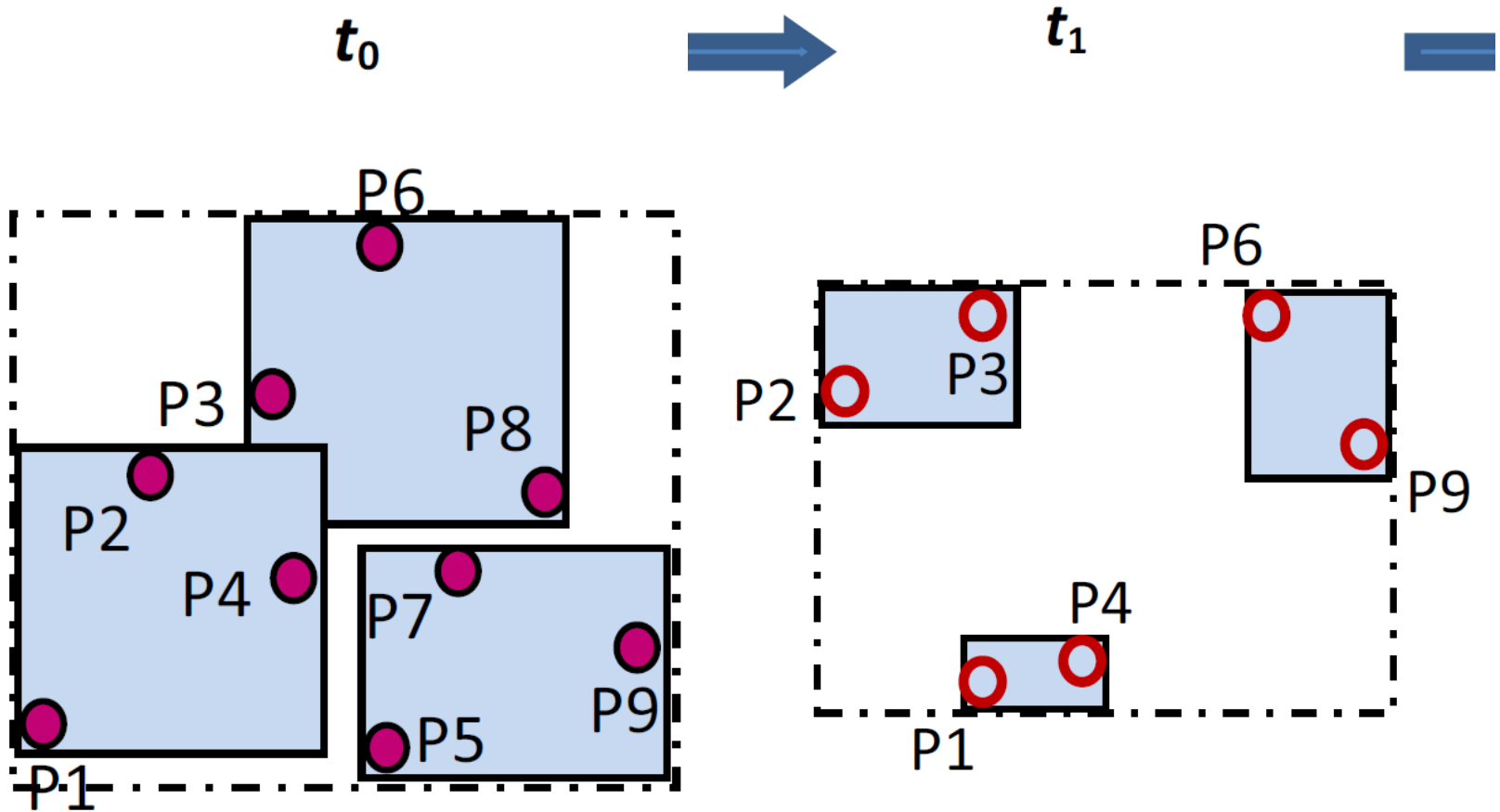
Concept	Expression	Description
Maximum time interval	$\Delta t_{mn}$	Maximum time interval for moving objects to update locations
Phase	$\Delta t = \Delta t_{mn}/n$	Time interval to construct an indexing component
Component	$C_t$	Indexing component constructed by timestamp $t$
Lifetime	$Lt = (n+1)*\Delta t$	Time period from constructing an indexing component to disposing it

# DIME

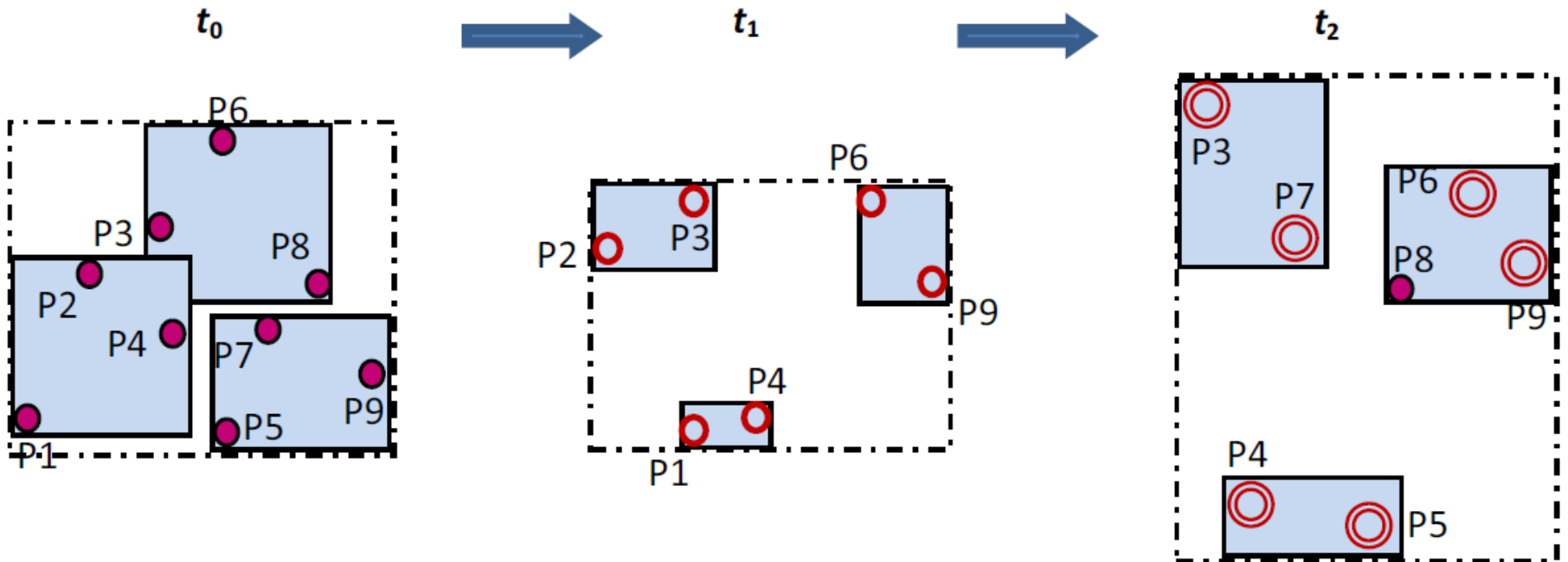
$t_0$



# DIME



# DIME



- $n$  equals to 2.
- At  $t_2$ , the components of  $t_0$  need to be disposed

# Indexing the Future

Yongyi Liu

# Indexing the Future Based on Underlying Road-Network

## “Predictive Tree: An Efficient Index for Predictive Queries on Road Networks”



## Store Finders

*Why People Still Need Locator Links*

[nngroup.com](http://nngroup.com)

NN/g



# Challenges

-functional limitations

1.distance measure

2.training data

3.flexibility



-performance deficiencies



# The implementation system

## -iRoad Sytem Architecture

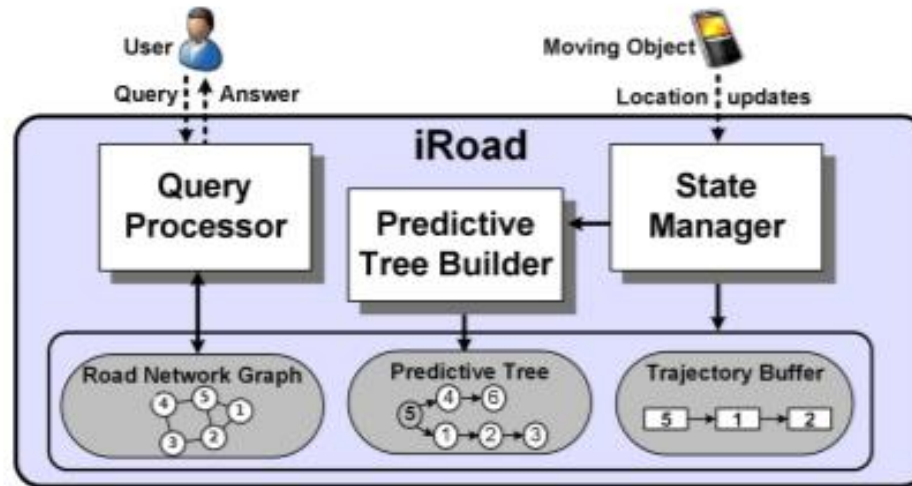
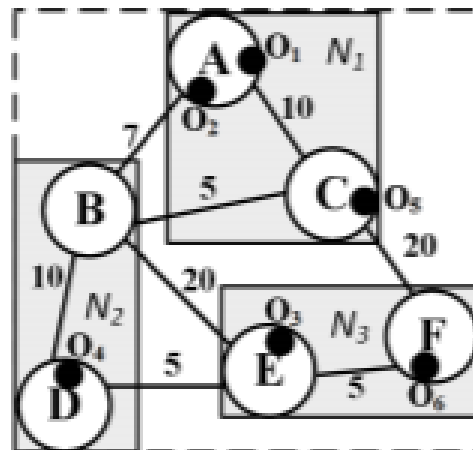


Fig. 1. iRoad System Architecture

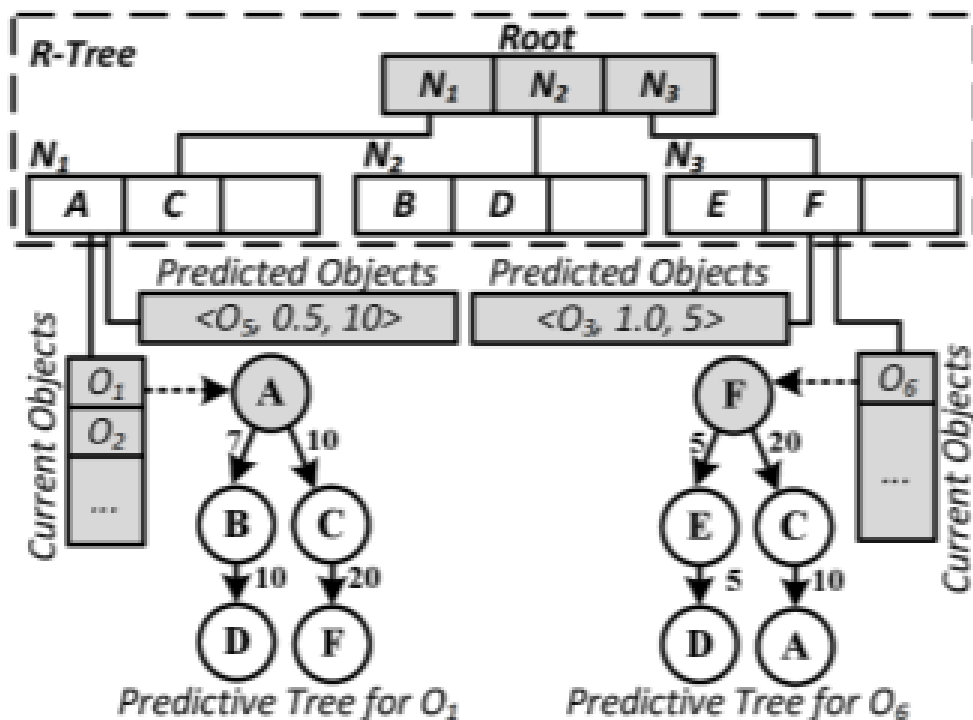
**State Manager:** R-tree , trajectory buffer , predictive tree

**Predictive Tree builder:**the moving object's trajectory buffer, the moving object's current predictive tree, the tunable parameters

**Query processor**



(a) Network & Objects



(b) Predictive Trees Integrated With R-Tree

Fig. 2. Example Of The Proposed Index Structure

# Predictive Tree Construction

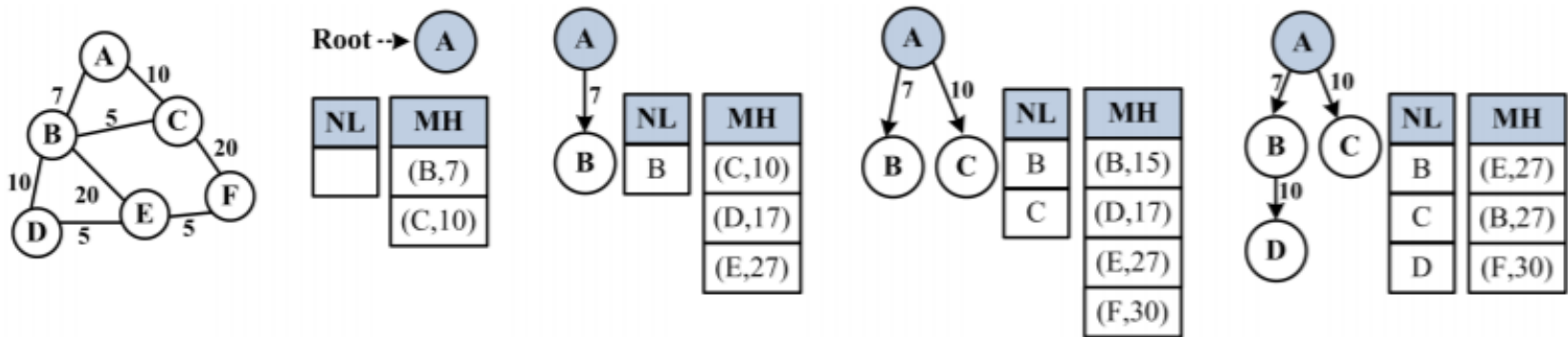
- **Initialization**

**visited nodes list:** record nodes processed so far

**min-heap:** order the nodes based on distance to  
the root

- **Expansion**

continuously pop the root from the min-heap and  
expand the predictive tree



(a) Road Network

(b) Initialize Tree

(c) Expand B

(d) Expand C

(e) Expand D

Fig. 4. Example of Constructing And Expanding The Predictive Tree Started At Node A.

Initialization

Expansion

# Predictive Tree Maintenance

## Main Idea:

update the root and prune the unnecessary part

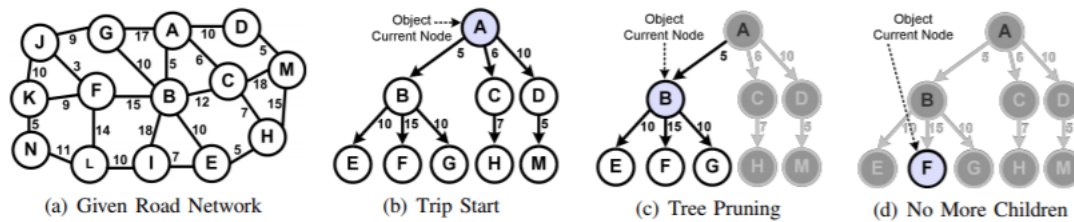


Fig. 5. Demonstration Example For An Object Trip And Predictive Tree Maintenance

# basic query and extensions

- predictive point query
  - to find out the moving objects with their corresponding probabilities that are expected to be around a specified query node in the road network within a future time period

extension to range queries, aggregate queries,  
KNN