

# Re-CoSKQ: Towards POIs Recommendation Using Collective Spatial Keyword Queries

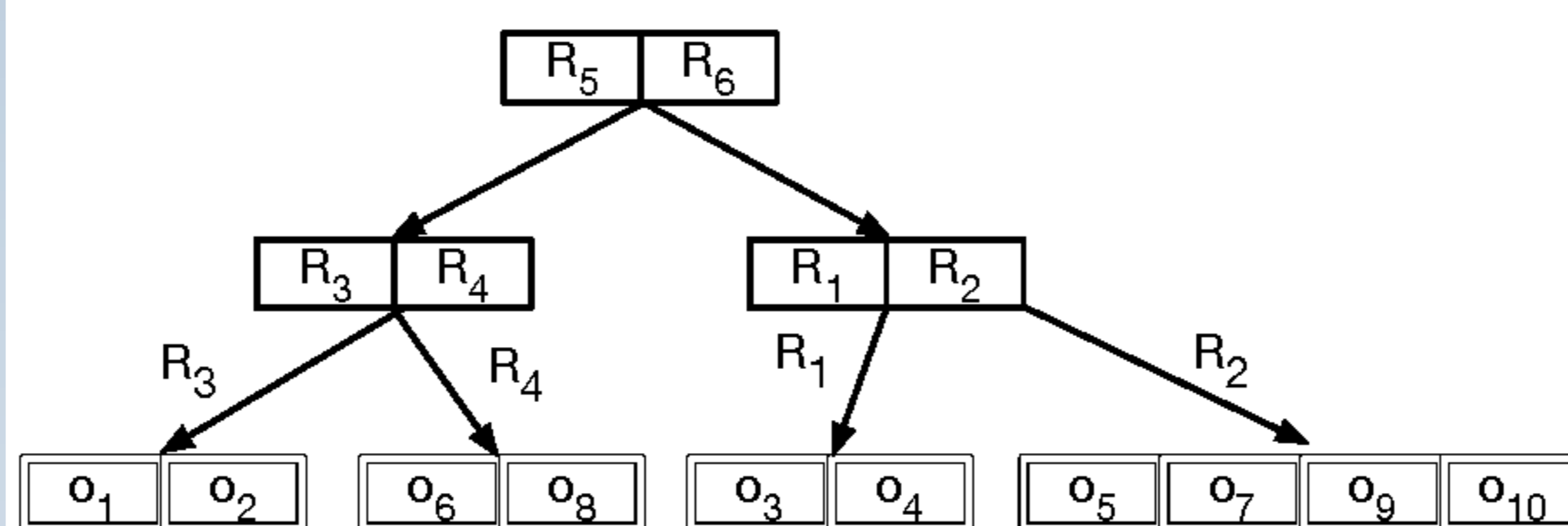
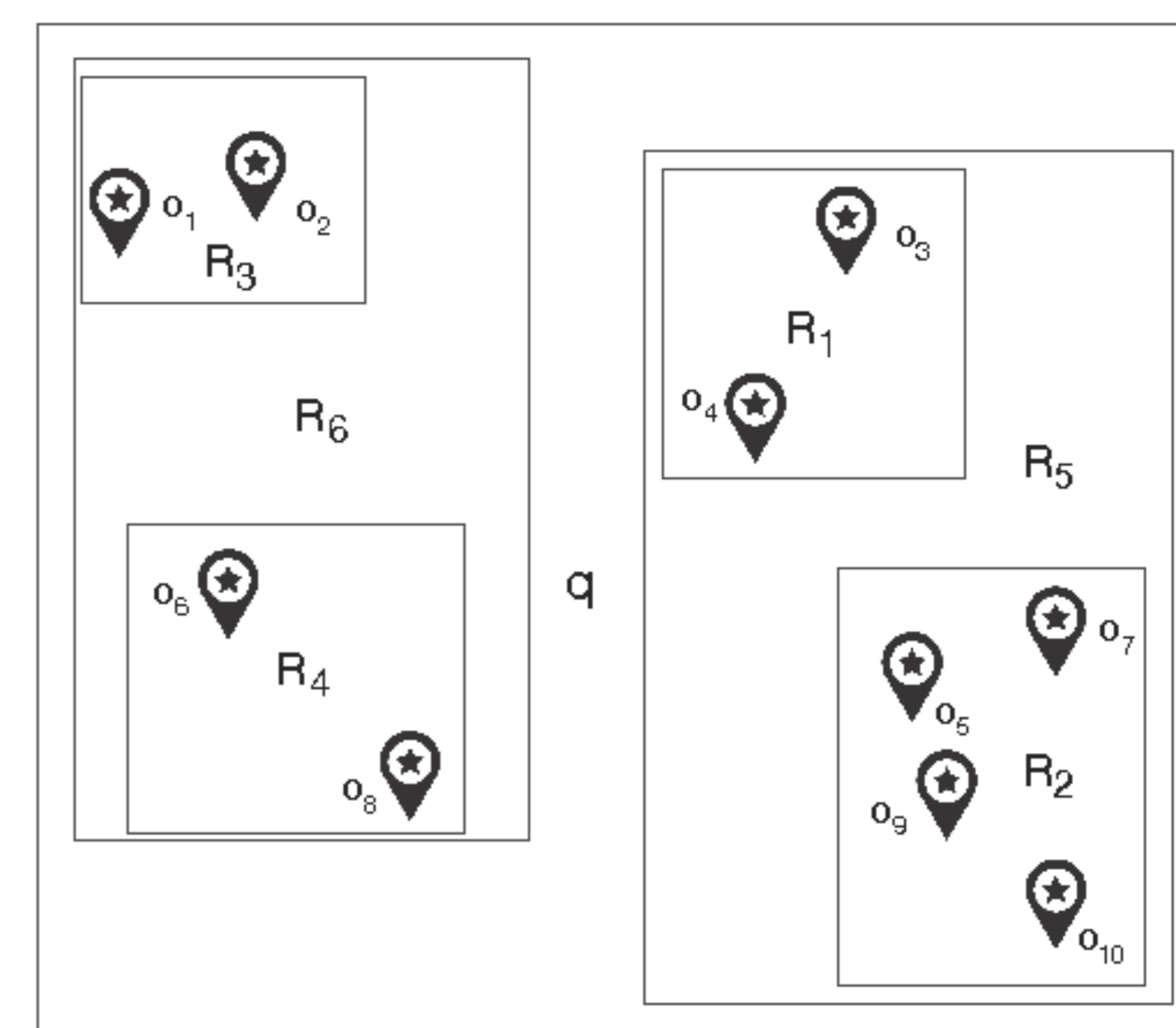
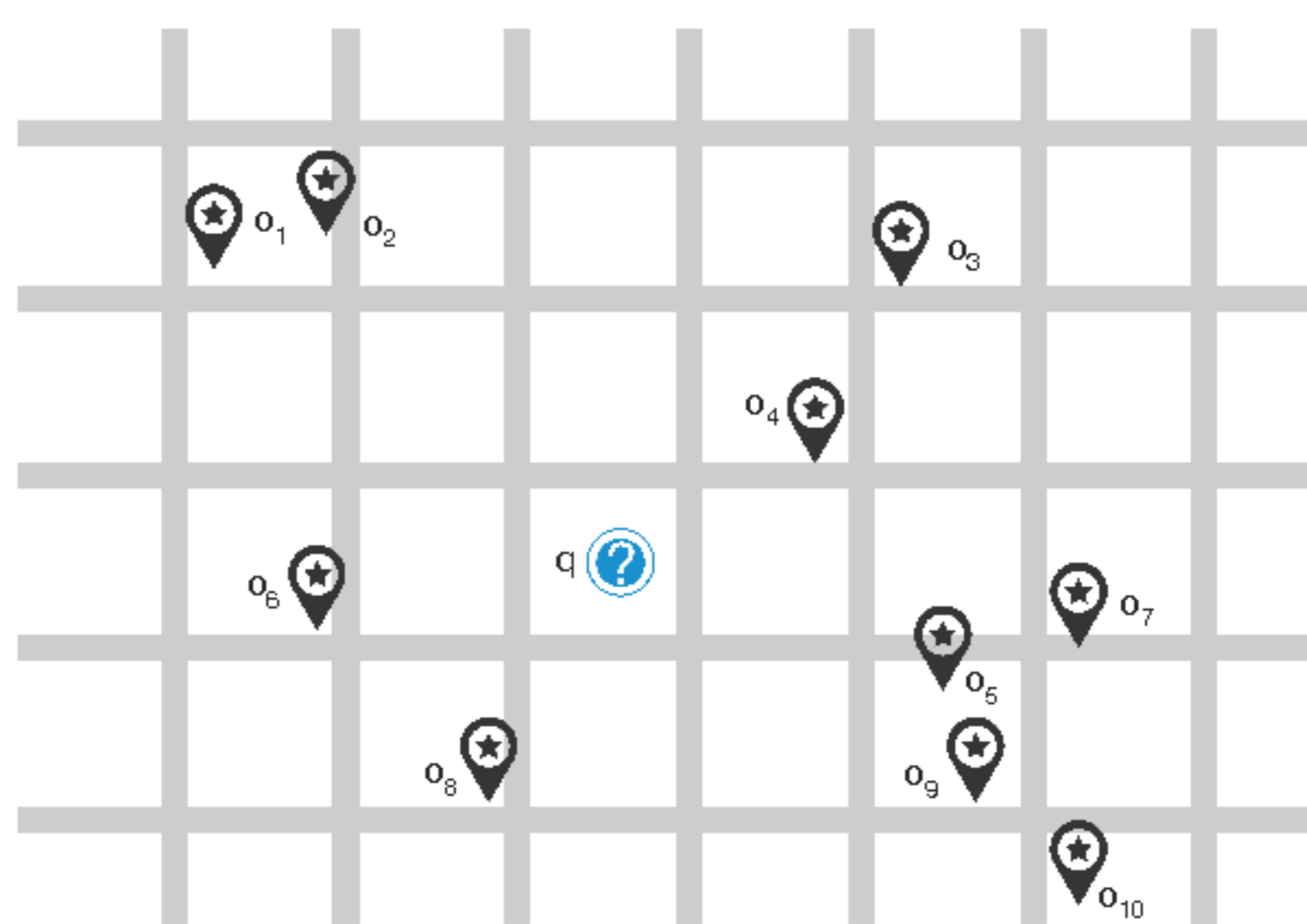
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## Introduction and goals

- Interest of recommender systems in mobile computing scenarios
- The location is a key spatial attribute:
  - Can techniques from the field of spatial databases help?
- Explore the potential use of Collective Spatial Keyword Querying (CoSKQ)

## Collective Spatial Keyword Querying (CoSKQ)

- Technique from the spatial databases field
- Goal: retrieve a group of spatial objects that collectively match the user preferences given:
  - Specific locations (of the user and also of the objects)
  - A set of keywords
- Use of IR-tree data structures (balanced trees that allow indexing objects and keywords)



Internal node:

- pointers to the child nodes
- a Minimum Bounding Rectangle (MBR) covering its subtree
- the set of all keywords in the subtree

Leaf node:

- items  $o$  (POI objects) in the node
- a bounding rectangle for each  $o$
- a pointer to an inverted file with the keywords that describe each POI

## Proposal: Re-CoSKQ for the recommendation of POIs

- Semantic coverage of the query keywords (no exact match req.)
- Minimize the cost:

- Distance to get to the POIs
- Similarity between the query and the descriptions of items

$U = \{u_1, \dots, u_n\} \rightarrow$  users

$O = \{o_1, \dots, o_m\} \rightarrow$  POIs

$o_i, \kappa = \{k_1, \dots, k_j\} \rightarrow$  keywords describing POI  $o_i \in O$

## Examples of distance functions

- Location distance:
  - Euclidean
  - L1-Norm / Manhattan
  - Geodesic distance (shortest path)
- Term distance:
  - Similarity based on concept closeness (relatedness)

$$sim(k_1, k_2) = 1 - \frac{sp(k_1, k_2)}{2D}$$

- Similarity based on closeness and concept depth

$$sim(k_1, k_2) = \begin{cases} e^{-\alpha l} \frac{e^{\beta h} - e^{-\beta h}}{e^{\beta h} + e^{-\beta h}} & \text{if } k_1 \neq k_2 \\ 1 & \text{otherwise} \end{cases}$$

- $l$ : shortest path
- $d$ : depth of the least common subsumer
- $\alpha, \beta > 0$ : weights

## Evaluation proposal

- Define a representative set of queries
- Annotate a dataset of POIs with predefined categories based on the keywords  $\rightarrow$  ground truth  $\rightarrow$  precision, recall, ... + performance and tuning
- Also interesting: user-centered evaluation, DataGenCARS

## Examples of cost functions

$$cost(q, \mathcal{O}') = \alpha \cdot \max_{o \in \mathcal{O}'} [dist(q, \lambda, o, \lambda)] + \beta \cdot \max_{o_1, o_2 \in \mathcal{O}'} [dist(o_1, o_2)] + \omega \cdot \max_{k_1 \in q, \kappa, k_2 \in \cup_{o \in \mathcal{O}'} o, \kappa} [dist(k_1, k_2)] \quad \leftarrow \text{TYPE 1 - COMB}$$

$$cost(q, \mathcal{O}') = \max \left\{ \alpha \cdot \max_{o \in \mathcal{O}'} [dist(q, \lambda, o, \lambda)], \beta \cdot \max_{o_1, o_2 \in \mathcal{O}'} [dist(o_1, o_2)], \omega \cdot \max_{k_1 \in q, \kappa, k_2 \in \cup_{o \in \mathcal{O}'} o, \kappa} [dist(k_1, k_2)] \right\} \quad \leftarrow \text{TYPE 2 - MAX}$$

$$cost(q, \mathcal{O}') = \alpha \cdot \min_{o \in \mathcal{O}'} [dist(q, \lambda, o, \lambda)] + \beta \cdot \max_{o_1, o_2 \in \mathcal{O}'} [dist(o_1, o_2)] + \omega \cdot \max_{k_1 \in q, \kappa, k_2 \in \cup_{o \in \mathcal{O}'} o, \kappa} [dist(k_1, k_2)] \quad \leftarrow \text{TYPE 3 - MIN-MAX}$$

$$cost(q, \mathcal{O}') = \left[ \left( \alpha \cdot \left( \sum_{o \in \mathcal{O}'} (dist(q, \lambda, o, \lambda))^{\phi_1} \right)^{\frac{1}{\phi_1}} \right)^{\phi_2} + \left( \beta \cdot \max_{o_1, o_2 \in \mathcal{O}'} dist(o_1, o_2) \right)^{\phi_2} + \left( \omega \cdot \max_{k_1 \in q, \kappa, k_2 \in \cup_{o \in \mathcal{O}'} o, \kappa} dist(k_1, k_2) \right)^{\phi_2} \right]^{\frac{1}{\phi_2}} \quad \leftarrow \text{TYPE 4 - UNIFIED COST FUNCTION}$$

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