

# Indoor Top- $k$ Keyword-aware Routing Query

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# Motivation



This paper:

- Formulates indoor top- $k$  keyword-aware routing query(IKRQ)
- Devises mapping structures to organize indoor keywords and compute route keyword relevance
- Derives pruning rules to reduce search space in routing
- Conducts extensive experiments on synthetic and real data sets to evaluate our proposals



## Indoor Top-k Keyword-aware Routing Query

Given a start point  $p_s$ , a terminal point  $p_t$ , a distance constraint  $\Delta$ , and a query keyword list  $QW$ , an **indoor top-k keyword-aware routing query**  $\text{IKRQ}(p_s, p_t, \Delta, QW, k)$  returns  $k$  regular and prime routes from  $p_s$  to  $p_t$  in a  $k$ -set  $\Theta$  such that  $\forall R \in \Theta, \delta(R) \leq \Delta$  and  $\Psi(R, \Delta, QW) \geq \Psi(R', \Delta, QW)$  for any route  $R' \notin \Theta$  from  $p_s$  to  $p_t$  with  $\delta(R') \leq \Delta$ .



# High-Level Overview

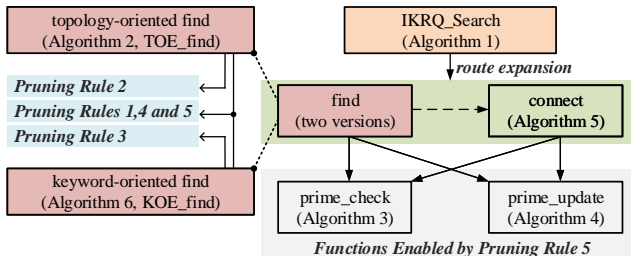


Figure: Architecture of the IKRQ Search Algorithms

# Indoor Topology & Route

**Homogeneous Routes.** Two routes  $R_i$  and  $R_j$  are **homogeneous routes** if  $R_i.head = R_j.head$ ,  $R_i.tail = R_j.tail$ , and  $KP(R_i) = KP(R_j)$

**Prime Route.** Suppose  $HR$  is a complete set of homogeneous routes for a routing query, we say a route  $R_i \in HR$  is **prime** against  $R_j \in HR$  if  $\delta(R_i) < \delta(R_j)$ .  $R_i$  is a **prime route** if  $R_i$  is prime against all other routes in  $HR$ .

## Principles of indoor route search

- **Principle of Regularity.** Disqualifies a route that contains one or more doors between two identical doors (e.g. d13-d14-d14-d13)
- **Principle of Diversity.** Avoid homogeneous routes in our indoor routing

TABLE II: Examples of Routes from  $p_s$  to  $p_t$

$R_1$	$(p_s \xrightarrow{v_1} d_2 \xrightarrow{v_2} d_6 \xrightarrow{v_3} d_7 \xrightarrow{v_5} p_t)$
$R_2$	$(p_s \xrightarrow{v_1} d_2 \xrightarrow{v_2} d_5 \xrightarrow{v_5} d_7 \xrightarrow{v_3} d_7 \xrightarrow{v_5} p_t)$
$R_3$	$(p_s \xrightarrow{v_1} d_2 \xrightarrow{v_2} d_5 \xrightarrow{v_5} d_9 \xrightarrow{v_6} d_9 \xrightarrow{v_5} d_7 \xrightarrow{v_3} d_7 \xrightarrow{v_5} p_t)$
$R_4$	$(p_s \xrightarrow{v_1} d_3 \xrightarrow{v_5} d_5 \xrightarrow{v_2} d_5 \xrightarrow{v_5} d_7 \xrightarrow{v_3} d_7 \xrightarrow{v_5} p_t)$



# Keyword Organization & Relevance

**Identity word (i-word).** Identifies the specific name of a partition (e.g. *Starbucks*)

**Thematic word (t-word).** Refers to a tag relevant to that partition (e.g. *coffee*, *mocha*)

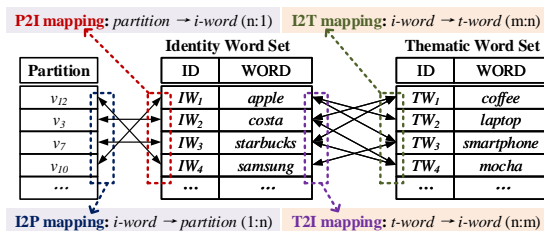


Figure: Indoor Space Keyword Mappings

For **T2I** mapping, we have **direct matching i-words** and **indirect matching i-words**



# Keyword Organization & Relevance

**Candidate I-word Set**  $\kappa(w_Q)$ . Set of entries each of which is in form of  $(w_i, s)$ , a pair of a matching i-word  $w_i$  and the similarity score  $s$  between  $w_Q$  and  $w_i$ ,  $s > \tau$ .

$\kappa(w_Q)$  has two cases:

- If  $w_Q$  is an i-word,  $\kappa(w_Q) = \{(w_Q, 1)\}$
- If  $w_Q$  is a t-word,  $\kappa(w_Q)$  consists of
  - All direct matching i-word, i.e.,  $(w'_i, 1)$ , for all  $w'_i \in T2I(w_Q)$
  - All indirect matching i-word, i.e.,  $(w''_i, s(w''_i))$ , where

$$s(w''_i) = \frac{|I2T(w''_i) \cap \bigcup_{w_i \in T2I(w_Q)} I2T(w_i)|}{|I2T(w''_i) \cup \bigcup_{w_i \in T2I(w_Q)} I2T(w_i)|} > \tau$$

partition	i-word	t-words
$v_3$	<i>costa</i>	{ <i>coffee, drinks, macha</i> }
$v_{10}$	<i>apple</i>	{ <i>phone, mac, laptop, watch</i> }
$v_7$	<i>starbucks</i>	{ <i>coffee, macha, latte, drinks</i> }
$v_{12}$	<i>samsung</i>	{ <i>phone, laptop, earphone</i> }

## Example

$I2T(costa) = \{coffee, drinks, macha\}$  and  $\bigcup_{w_i \in T2I(latte)} I2T(w_i) = \{coffee, drinks, macha, latte\}$



# Keyword Organization & Relevance

## Keyword Relevance.

$$\rho_{QW}(R) = \begin{cases} 0, & \text{if } N_{QW}(R) = 0; \\ N_{QW}(R) + \frac{\sum_{w_Q \in QW} \left( \max_{w'_i \in M(w_Q, R)} s(w'_i) \right)}{N_{QW}(R)}, & \text{otherwise.} \end{cases}$$

## Ranking Score.

$$\psi(R, \Delta, QW) = \alpha \cdot \frac{\rho(R)}{|QW| + 1} + (1 - \alpha) \cdot \left( \frac{\Delta - \delta(R)}{\Delta} \right)$$



## Pruning rules

- ① A partial route  $R^* = (p_s, d_i, \dots, d_n)$  in the searching can be pruned if  $\delta(R^*) + |d_n, p_t|_L > \Delta$ .
- ② A door  $d_n$  can be pruned out of the search if  $|p_s, d_n|_L + |d_n, p_t|_L > \Delta$ .
- ③ An indoor partition  $v_i$  can be pruned out of the search if its lower bound distance  $\delta(p_s, v_i, p_t) =$

$$\min_{d_i \in P2D_{\square}(v_i), d_j \in P2D_{\square}(v_i)} (|p_s, d_i|_L + \delta_{d2d}(d_i, d_j) + |d_j, p_t|_L) > \Delta.$$

- ④ Given the current  $k$ -th highest ranking score  $\psi_k$  among the seen complete routes, a partial route  $R^* = (p_s, d_i, \dots, d_n)$  can be pruned if its upper bound ranking score  $\psi_U(R^*) = \alpha \cdot 1 + (1 - \alpha)(1 - (\delta(R^*) + |d_n, p_t|_L)/\Delta) \leq \psi_k$ .
- ⑤ A partial route  $R^* = (p_s, d_i, \dots, d_n)$  in the search can be pruned if the search has already obtained a route  $R^{*'} from  $p_s$  to  $d_n$  that is prime against  $R^*$ .$



# Search Algorithms for IKRQ

## Topology-oriented Expansion (ToE)

Idea: To reach all accessible doors from the current door based on indoor topology, i.e., always expands from the current door to the next enterable door within one hop

## Keyword-oriented Expansion (KoE)

Idea: Focus on the query words that have not been covered by the current stamp, and directly expand to one of the key partitions that can cover some of those uncovered query words

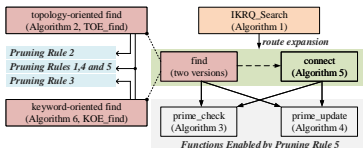
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**Algorithm 1** IKRQ\_Search ( $p_s, p_t, \Delta, QW, k$ )

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```
1: initialize priority queue Q
2: set of all candidate i-words  $W_{ei} \leftarrow \bigcup_{w_Q \in QW} \kappa(w_Q).W_i$ 
3:  $P \leftarrow \left( \bigcup_{w_Q \in QW} I2P(\kappa(w_Q).W_i) \right) \setminus v(p_s) \cup v(p_t)$ 
4: door sets  $D_n \leftarrow \emptyset, D_f \leftarrow \emptyset$ 
5:  $kbound \leftarrow 0$ 
6: initialize hashtable  $H_{prime}$ 
7:  $R_0 \leftarrow (p_s)$ 
8:  $S_0 \leftarrow (v(p_s), R_0, 0, p(R_0), \psi(R_0))$ 
9:  $Q.push(S_0)$ 
10: while Q is not empty do
11:    $S_i \leftarrow Q.pop()$ 
12:    $ES \leftarrow find(S_i)$  ▷ find the next valid stamps
13:   for each  $S_j \in ES$  do
14:      $connect(S_j)$  ▷ connect each valid stamp to terminal
15: return current top-k results
```

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**Table:** Dataset Information (Indoor Keywords)

	Synthetic Data	Real Data
# of i-word	1120	533
# of t-word	9195	5036

**Table:** Notations of Comparable Methods

Modification	ToE family	KoE family
–	ToE	KoE
<i>no distance-based Pruning Rules 1 3</i>	ToE\D	KoE\D
<i>no kbound-based Pruning Rule 4</i>	ToE\B	KoE\B
<i>no prime-based Pruning Rule 5</i>	ToE\P	–
<i>with precomputed shortest routes</i>	–	KoE*



# Experimental Studies

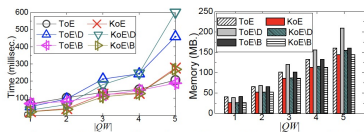


Fig. 6: Time vs.  $|QW|$

Fig. 7: Memory vs.  $|QW|$

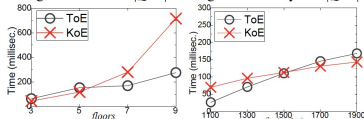


Fig. 11: Time vs. floor

Fig. 12: Time vs.  $\delta_{x2t}$

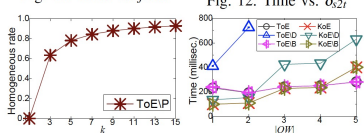


Fig. 16: Homogeneous rate

Fig. 17: Time vs.  $|QW|$

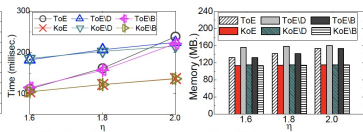


Fig. 8: Time vs.  $\eta$

Fig. 9: Memory vs.  $\eta$

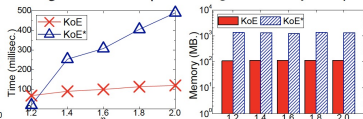


Fig. 13: Time of KoE\*

Fig. 14: Memory of KoE\*

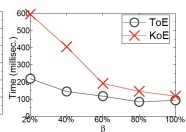


Fig. 10: Time vs.  $\beta$

Fig. 15: Time of ToE\P

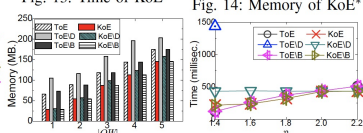


Fig. 18: Memory vs.  $|QW|$

Fig. 19: Time vs.  $\eta$

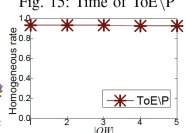


Fig. 20: Homogeneous rate



# Thank you!

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