

# Navigation in Maps : Remembering Strategies Across Episodes

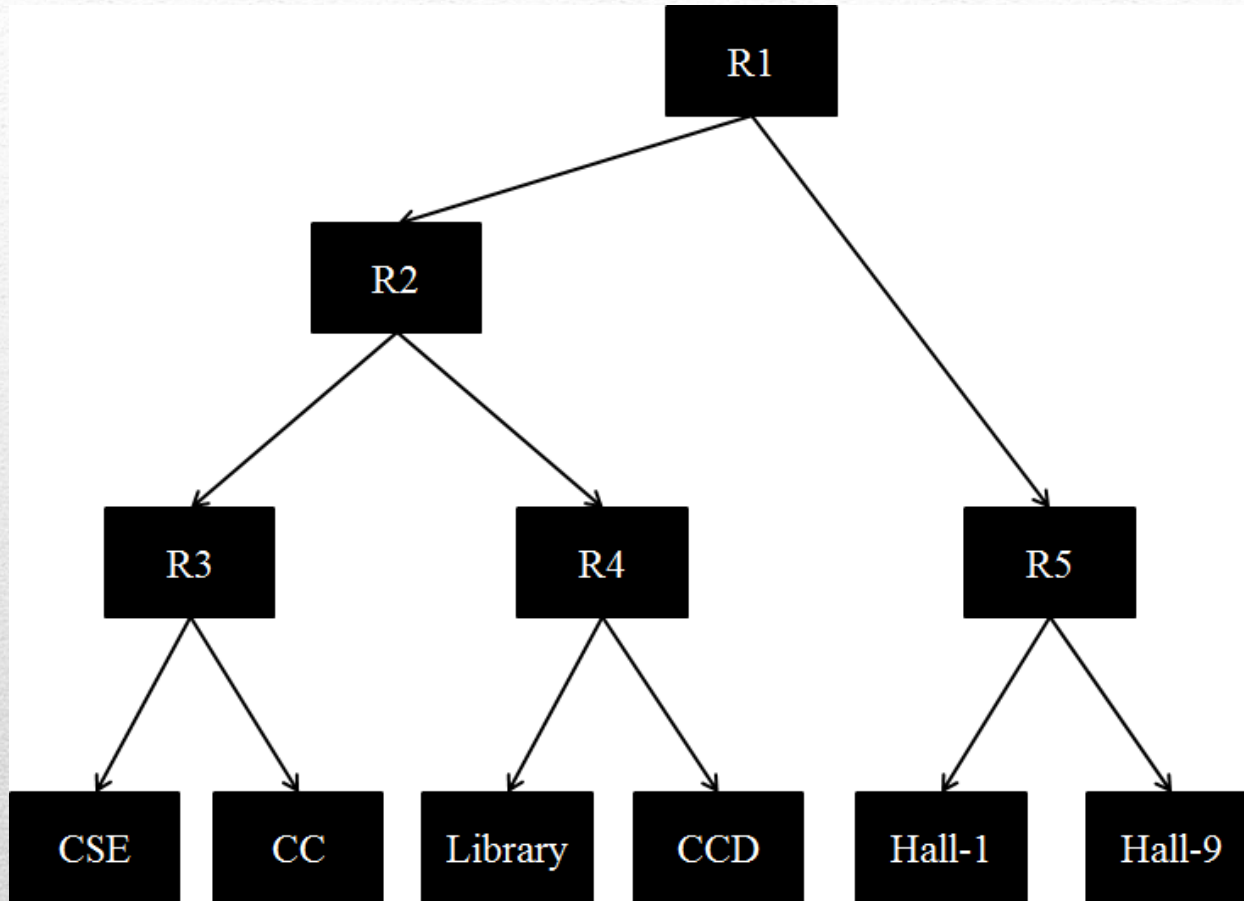
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# Introduction

- Humans organize spatial information in the form of hierarchy
  - Humans choose from a set of heuristics in spatial reasoning
  - Some studied heuristics are –
    - Fine-to-coarse strategy (Wiener and Mallot 2003)
    - Cluster Method (Gallistel and Cramer 1998)
    - Least Decision Load (ONeill 1992)
    - etc..
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## Navigation : Remembering Strategies Across Episodes



A hierarchy for IITK map. Clustering is conceptual and not only based on nearness as evident from seeing Hall-1 and Hall-9 clubbed even though they are very far but both refer to the same concept of student hall.

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# Formal Description of Problem

- Given a set of landmarks, in which order will you visit them
  - Each candidates answer is some permutation of the set of landmarks
  - Answer is based on the hierarchical structure developed
  - Develop a strategy that matches closely with the human reasoning given the hierarchical structure
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## Previous Work (Nayak, Mishra, Mukerjee 2011)

- Divides navigation into episodes
  - In each episode choose a heuristic with a given probability
  - Learn these probability using stochastic modeling
  - No memory of previous heuristic exists – Memoryless Model
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# Hypothesis To Be Tested

## First Order Markovian Memory

“ Chances of using a heuristic is increased in a given episode if it was used in the previous episode”

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# Methodology

- For each heuristic compute equivalent 0-1 normalized feature  $\{F_i\}$
- For each episode compute cost of each heuristic

$$\text{Cost} = a F_1 + b F_2 + c F_3 + d \text{ Bias}$$

- Choose the heuristic with minimum cost
  - Here the Bias factor is 0 for heuristic that was used in last episode and 1 for all other heuristics
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## Methodology contd..

- For a given value of  $(a,b,c,d)$  we find the distance from the user answer using Jaro-Wrinkler Distance
  - Use simulated annealing to find the optimal value of  $(a,b,c,d)$  in  $\mathbb{R}^4$
  - Experiment is repeated without Bias and results are compared
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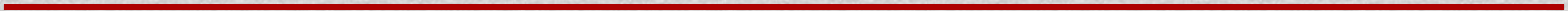
## References

- [Nayak et al 2011] Nayak, Mishra, Mukerjee Towards a Cognitive Model for Human Wayfinding Behavior in Regionalized Environments, AAAI 2011
  - [Wiener and Mallot 09] Wiener, J., and Mallot, H. 2003. Fine-to-coarse route planning and navigation in regionalized environments. *Spatial Cognition and Computation* 3(4):331–358.
  - [Hirtle and Jonides 85] Hirtle, S., and Jonides, J. 1985. Evidence of hierarchies in cognitive maps. *Memory & Cognition* 13:208–217.
  - [Reitman and Reuter 80 ] Reitmann, J., and Rueter, H. 1980. Organization revealed by recall orders and confirmed by pauses. *Cognitive Psychology* 12:554–581.
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**THANK YOU**

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# Extra Slide



## Finding Common Cluster

- Given various tree, one for each subject, how to find a single optimal tree
- Create Distance Matrix of size  $n \times n$  where  $n$  is the number of subject
- Find distance between tree  $T_i$  and  $T_j$  as follows :

[Jackknifing Hirtle 85]

If there are  $t$  landmarks such that on deleting them the tree becomes same then distance is  $t$

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## Finding Common Cluster Contd..

- Find the tree such that the average distance from all other tree is minimum in the distance matrix graph
  - This tree along with the learned parameters (a,b,c,d) can be used in navigation system
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## Jaro-Wrinkler Distance

- Given two strings  $s_1$  and  $s_2$  the Jaro-Wrinkler distance is defined as –
- Let  $m$  : number of matching characters
- $T$  is half the number of transpositions

$$d_j = \begin{cases} 0 & \text{if } m = 0 \\ \frac{1}{3} \left( \frac{m}{|s_1|} + \frac{m}{|s_2|} + \frac{m-t}{m} \right) & \text{otherwise} \end{cases}$$

- Two characters are considered matching if they are not farther than

$$\left\lfloor \frac{\max(|s_1|, |s_2|)}{2} \right\rfloor - 1$$