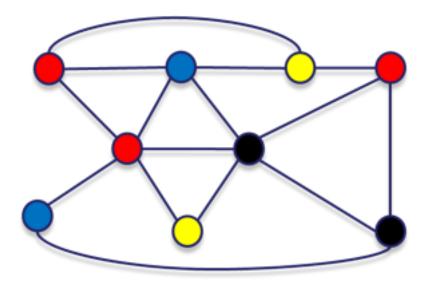
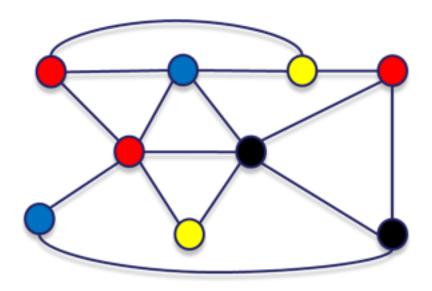
# Distance Oracles for Vertex-Colored Graphs

Oren Weimann Weizmann Institute

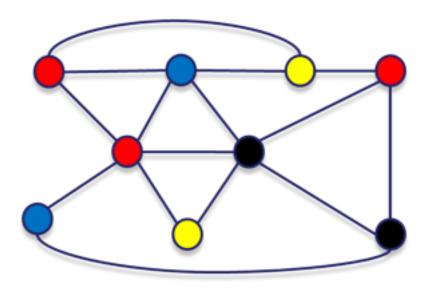


#### Joint work with: Danny Hermelin, Avivit Levy, and Raphael Yuster

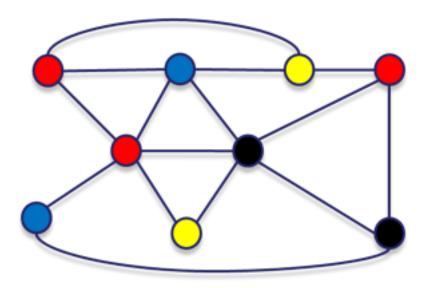
Tuesday, May 3, 2011



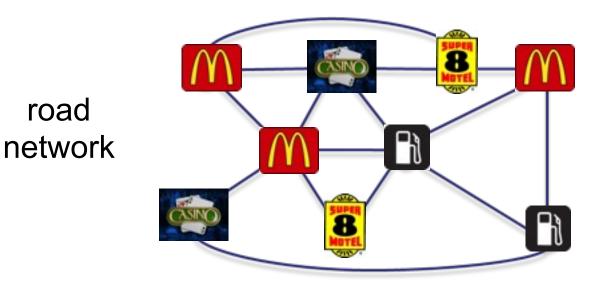
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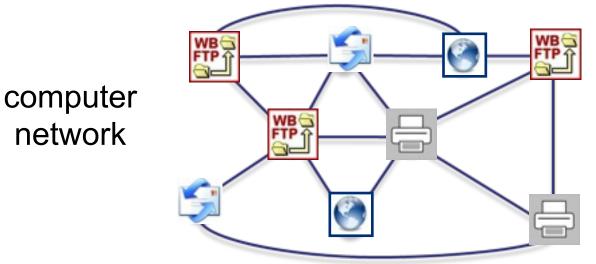


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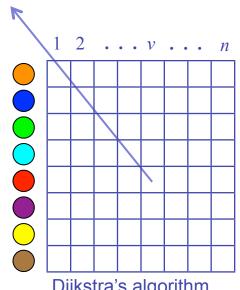
network

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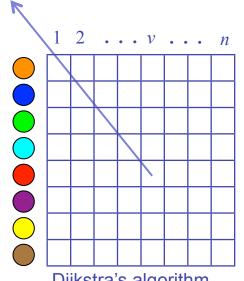
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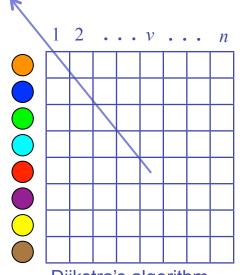
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$$\delta(v, \bullet) \leq d(v, \bullet) \leq \alpha \cdot \delta(v, \bullet)$$





Dijkstra's algorithm after contracting color

- Benchmark result by Thorup-Zwick [JACM'02]:
  - $O(kn^{1+1/k})$  space.
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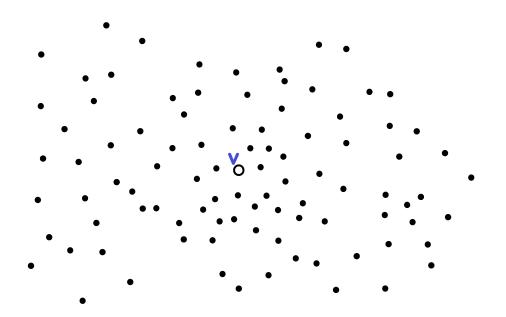
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**Theorem:**  $O(kn^{1+1/k})$ -space  $(3^{k-1}-1)$ -stretch vertex-color oracles allowing changing colors in  $O(kn^{1/k}\lg n)$  time.

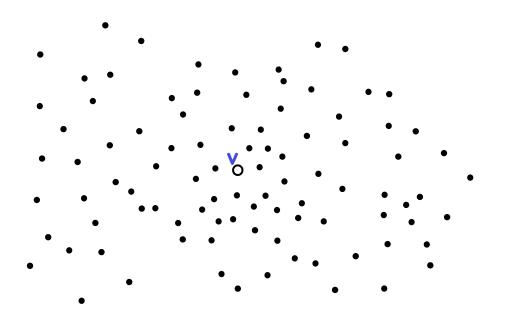
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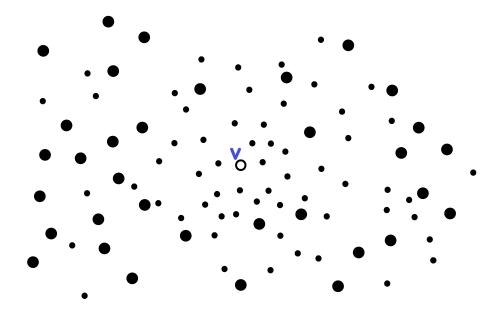
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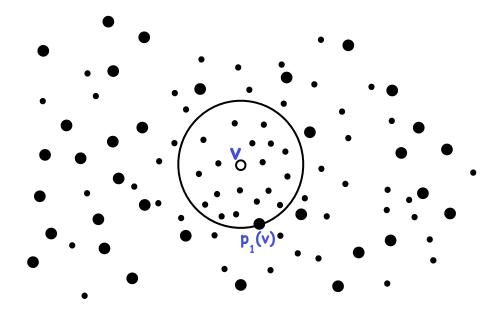
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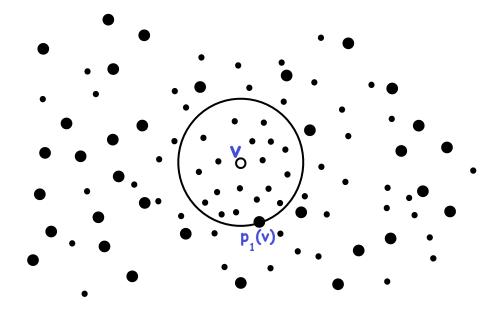
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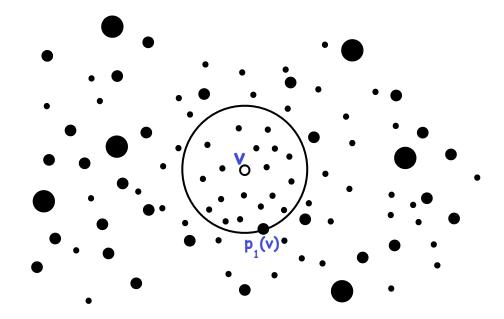
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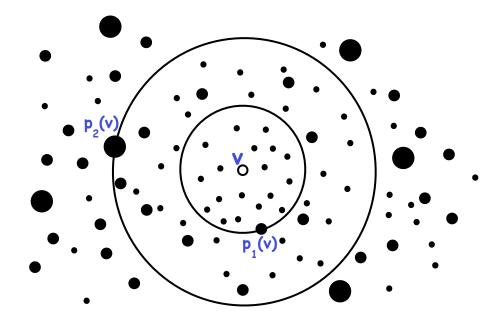
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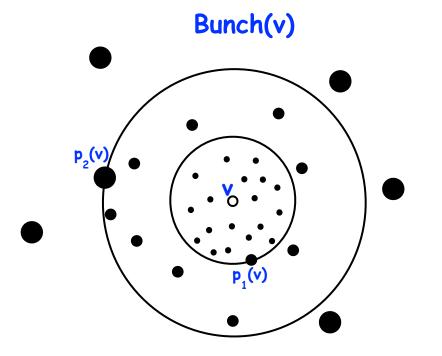
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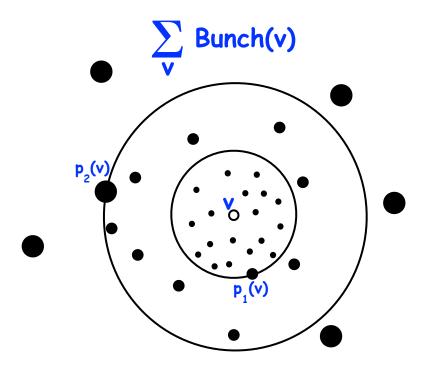
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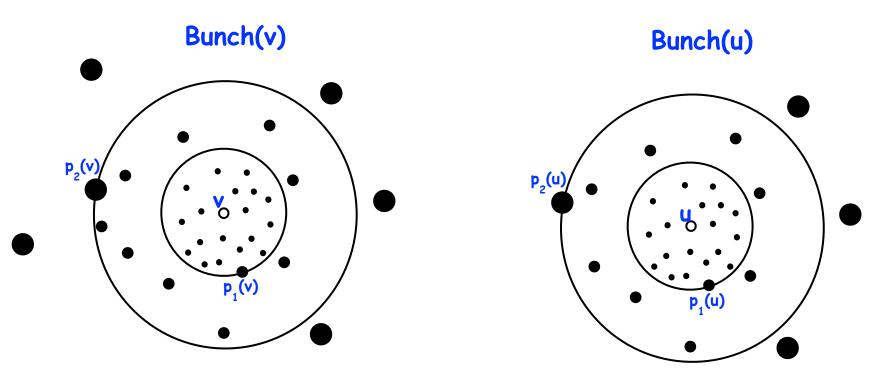
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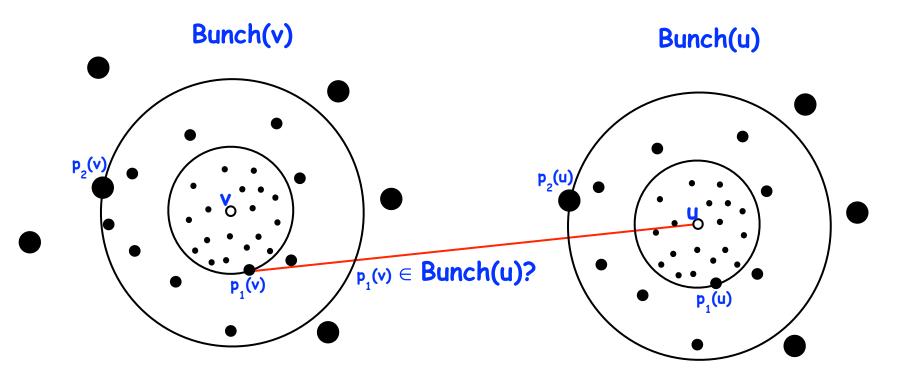
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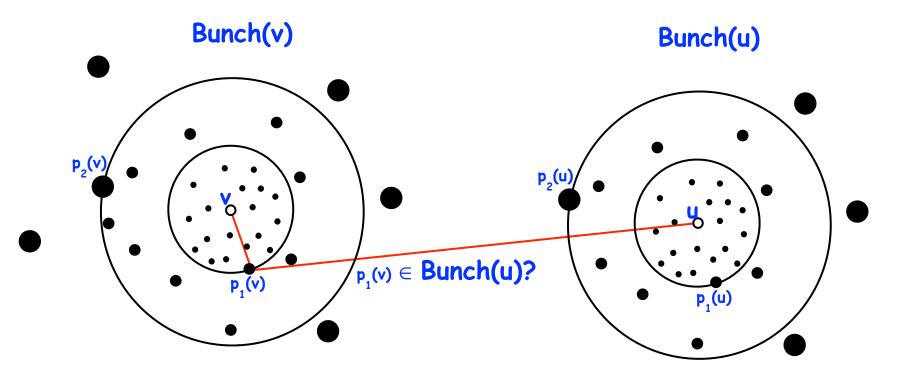
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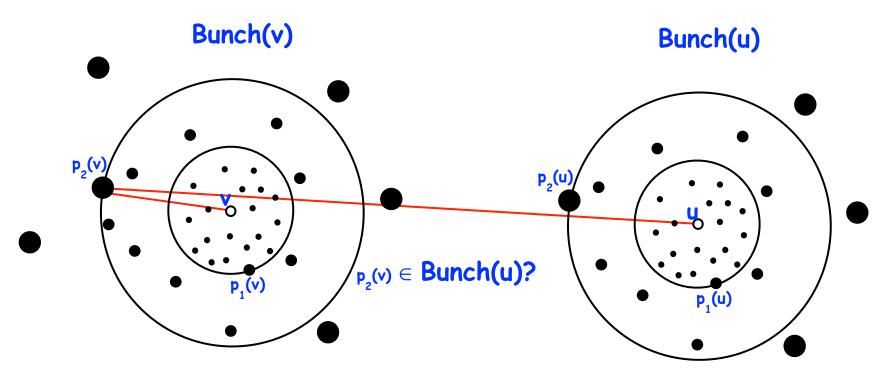
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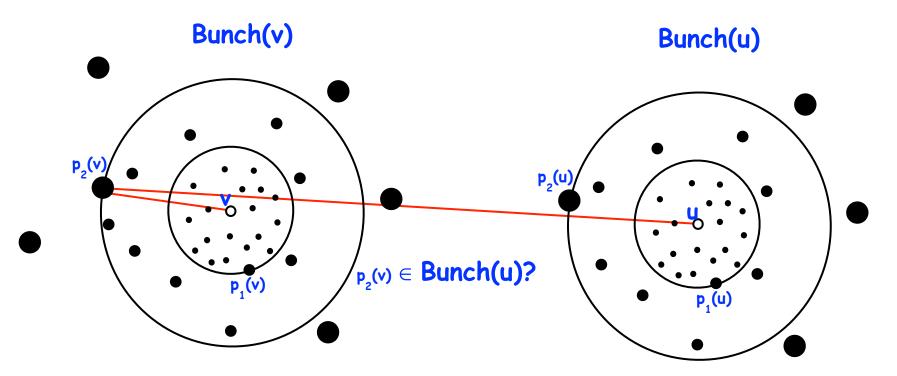
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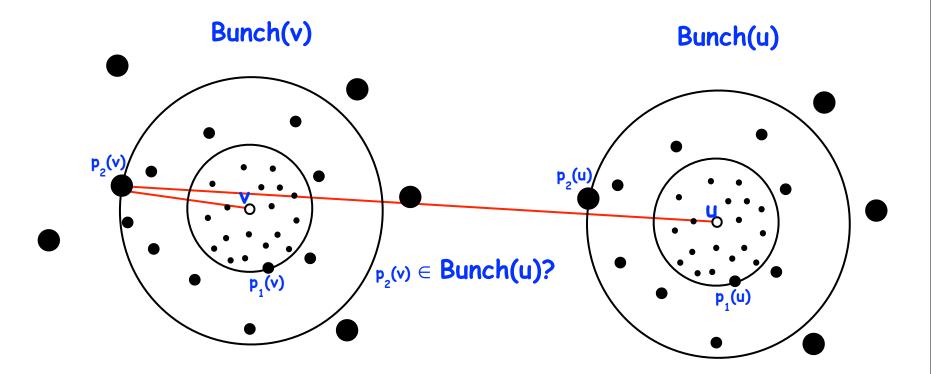
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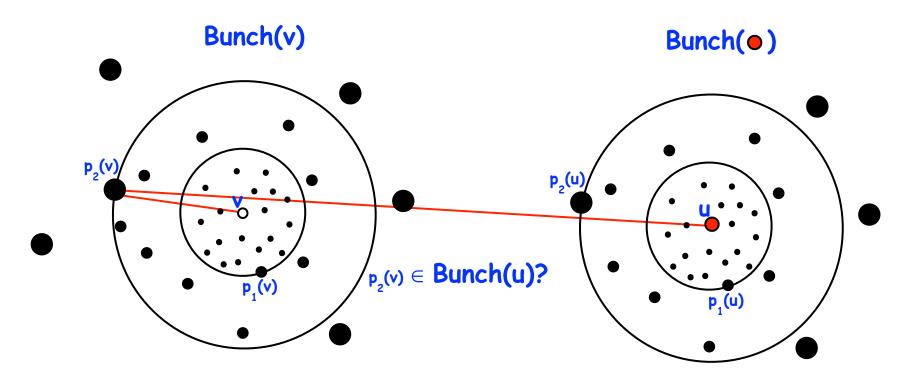
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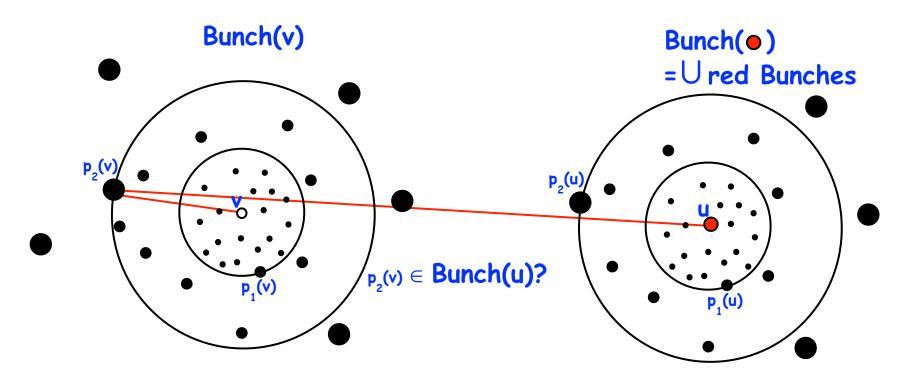
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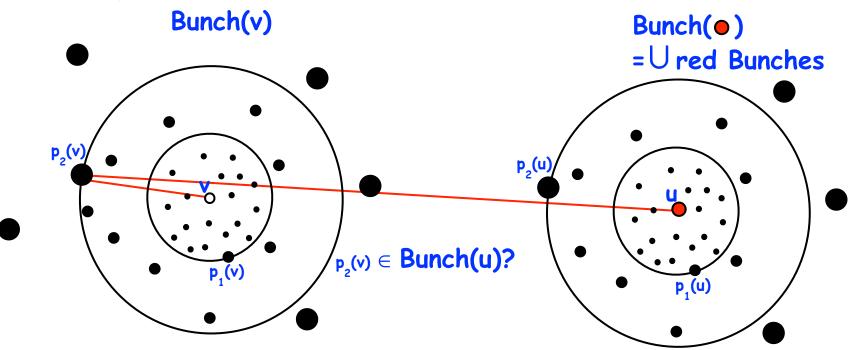
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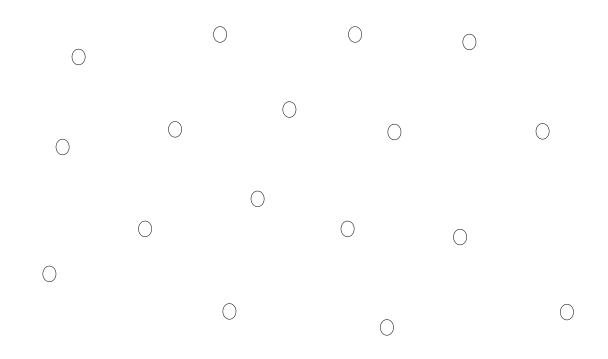


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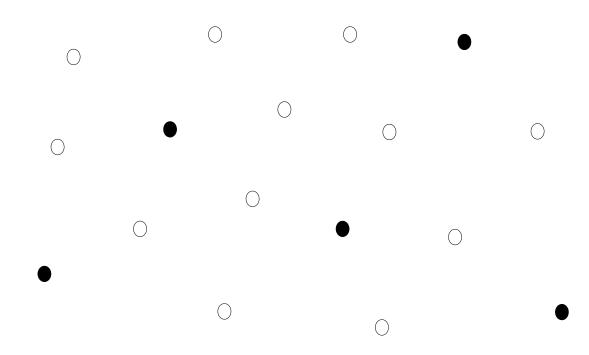
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- 3. check all **p**(v)



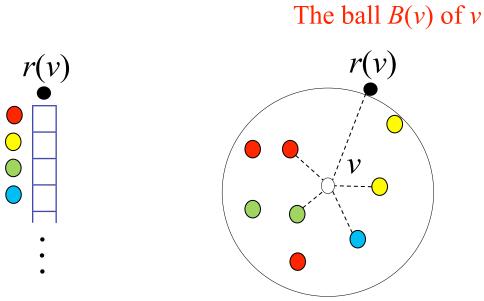
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- Store all distances
- $-\delta(r,\lambda)$  for every router *r* and color  $\lambda$ .
- $\delta(v, r(v))$  from every vertex v to its closest router r(v).
- $\delta(v,\lambda)$  from every vertex v to every color  $\lambda$  with  $\delta(v,\lambda) < \delta(v,r(v))$ .





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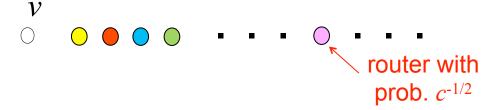


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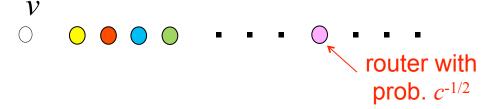
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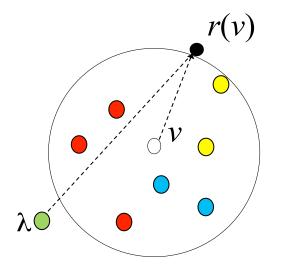
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- If  $\lambda \notin B(v)$  then return  $\delta(v, r(v)) + \delta(r(v), \lambda)$ . (stretch 3)

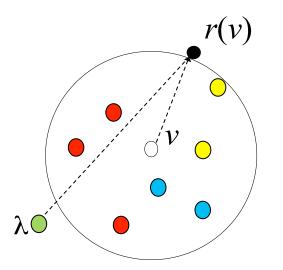


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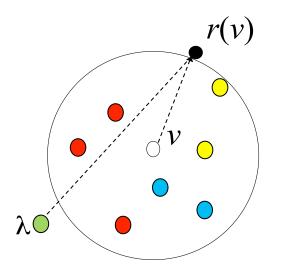
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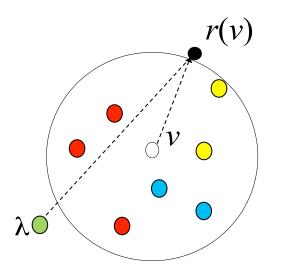
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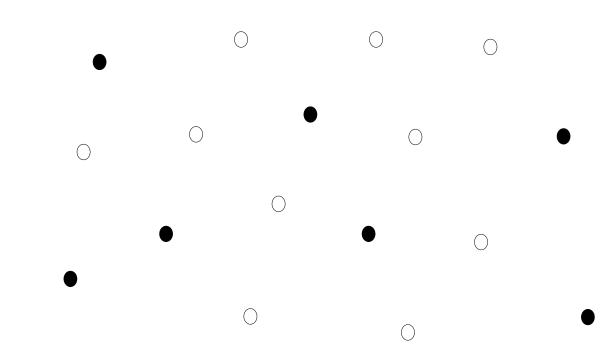
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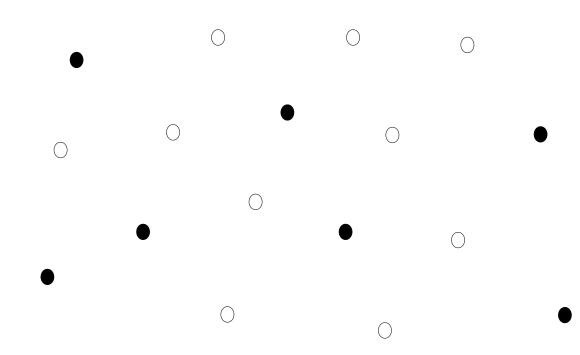
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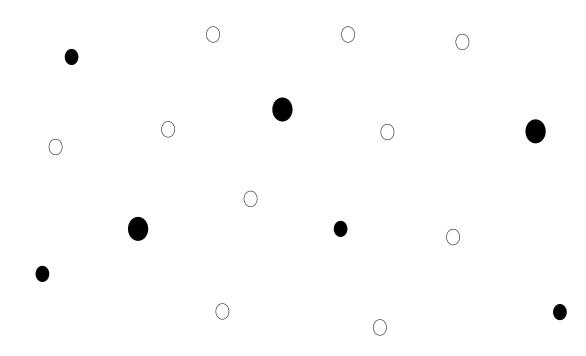
 $\delta(v, r(v)) + \delta(r(v), \lambda) \leq 3\delta(v, \lambda)$ 





> Select *routers* for the routers with prob.  $c^{-1/k}$ .

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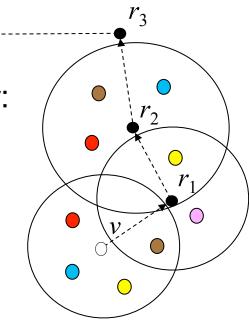
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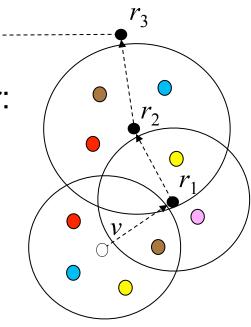
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  - Stretch increases to  $2^{k-1}$ .

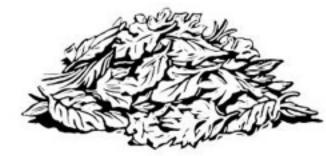


# **Changing Colors**

Maintain balls using heaps.

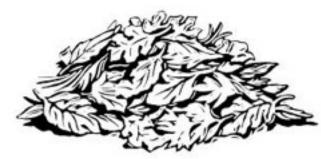


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  - $O(kn^{1+1/k})$  space instead of  $O(knc^{1/k})$ .

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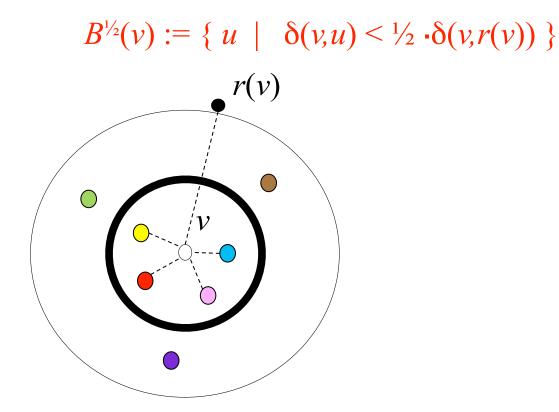
- Heap per color, sorted by distance from ball center.
- > Requires selecting routers with probability depending on n.
  - $O(kn^{1+1/k})$  space instead of  $O(knc^{1/k})$ .
- > On color change of v:
  - Update two heaps in each ball that contains v.



 $\succ$  <u>Problem</u>: *v* can belong to a lot of balls.

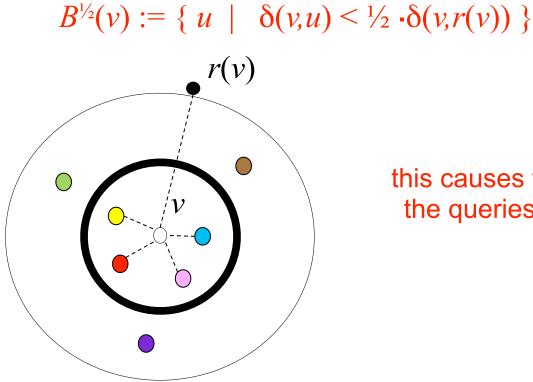
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Solution: use half-balls.



this causes the stretch of the queries to increase

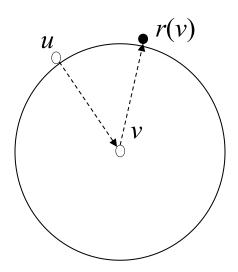




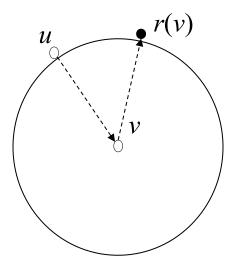
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- > v is in at most  $kn^{1/k}$  balls.





*1.*  $O(kn^{1+1/k})$ -space (2*k*-1)-stretch ?



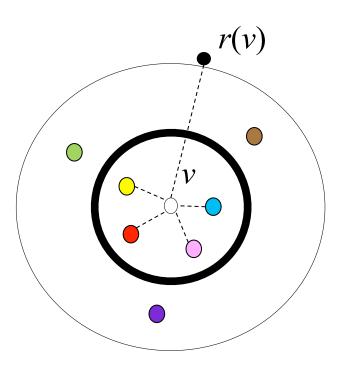
- 1.  $O(kn^{1+1/k})$ -space (2k-1)-stretch ?
- 2.  $O(knc^{1/k})$ -space poly(k)-stretch ?



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- *3.*  $O(knc^{1/k})$ -space with changing colors ?



# Thank you!



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