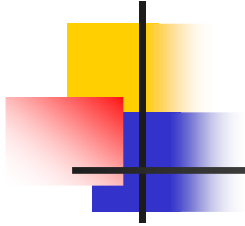




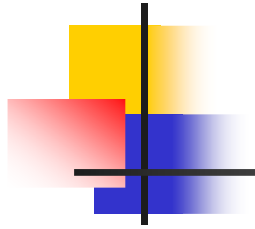
# Topics in Algorithms 2007

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# Tree Embeddings



# Solving Graph Metric Problems

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- How do we make the problem easier?
- Convert into a tree!!



# Projections

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- Can vertices in a given weighted graph  $G$  be mapped to vertices in any edge-weighted tree  $H$  so that all distances (i.e., shortest paths) only increase, but not by too much?
- Distortion: max stretch over all edges in  $G$



## H vs G

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- Two cases
  - $|G| = |H|$
  - $|G| < |H|$
- Two vertices in  $G$  cannot map to the same vertex in  $H$



## A Simple Case

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- $G$ =unweighted cycle of length  $n$  and  $|H|=|G|$
- How much is the distortion?
- $\geq n-1$ ?



## Proof of the Simple Case

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- Embedding of  $G$  in  $H$  must cancel out (why??)
- Take each  $e$  in  $G$ , map to  $H$  and then map back to  $G$ : two cases
  - Result is  $e$  itself  $\rightarrow G$  maps to itself  $\rightarrow$  contradiction (why??)
  - Result is some other path in  $G$  between the endpoints of  $e \rightarrow$  distortion for  $e$  is  $n-1$  (why??)



# Generalization

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- Embedding of unweighted  $G$  into  $H$  has distortion at least  $g-1$  if  $X(H) < X(G)$  and  $|H| = |G|$  ( $g$  is girth of  $G$ ,  $X()$  is  $E-V+1$ )



# Proof

---

- Take each  $e$  in  $G$ , map to  $H$  and then map back to  $G$ : two cases
  - Result is  $e$  itself  $\rightarrow$  each cycle in  $G$  maps to itself
  - Result is some other path in  $G$  between the endpoints of  $e \rightarrow$  distortion for  $e$  is  $g-1$  (why??)



# Proof

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- If each cycle in  $G$  maps to itself in  $G \rightarrow H \rightarrow G$ 
  - $X(G)$  independent cycles in  $G$  map to at most  $X(H)$  independent cycles in  $H$
  - $X(H)$  independent cycles in  $H$  cannot map to more than  $X(H)$  fundamental cycles in  $G$
  - Contradiction



## Further Generalization

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- Embedding of unweighted  $G$  into  $H$  has distortion at least  $g_k - 1$  if  $X(H) \leq X(G) - k$  and  $|H| = |G|$  ( $g_k$  is the length of the  $k$ th smallest cycle in  $G$ ,  $X()$  is  $E - V + 1$ )



# Proof

---

- Take each  $e$  in  $G$ , map to  $H$  and then map back to  $G$ : two cases
  - Result is  $e$  itself  $\rightarrow$  each cycle in  $G$  maps to itself
  - Result is some other path in  $G$  between the endpoints of  $e$ 
    - $\rightarrow$  the cycle formed by the path +  $e$  is NOT amongst the  $k-1$  shortest cycles  $\rightarrow$  distortion for  $e$  is at least  $g_k - 1$  (why??)
    - $\rightarrow$  the cycle formed by the path +  $e$  IS amongst the  $k-1$  shortest cycles  $\rightarrow$  each cycle in  $G$  maps to itself plus a combination of the  $k-1$  shortest cycles



# Proof

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- If each cycle in  $G$  maps (in  $G \rightarrow H \rightarrow G$ ) either to itself or to itself plus a combination of the smallest  $k-1$  cycles of  $G$ 
  - After  $G \rightarrow H \rightarrow G$  there are at least  $X(G)-k+1$  independent cycles in  $G$  (Why?)
  - $G \rightarrow H$  has only  $X(H) = X(G) - k$  basis cycles
  - Contradiction!!



# Steiner Points

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- Will  $|H| > |G|$  help?



## Further Generalization

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- Embedding of unweighted  $G$  into  $H$  has distortion at least  $g_k/3-4/3$  if  $X(H)=X(G)-k$  and  $|H| \geq |G|$  ( $g_k$  is the length of the  $k$ th smallest cycle in  $G$ ,  $X()$  is  $E-V+1$ )



# Problem

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- Take each  $e$  in  $G$ , map to  $H$  and then map back to  $G$ : map back is not defined for vertices in  $H-G$ 
  - Add extra degree 2 vertices to  $G$  (many choices, pick any one), i.e., artificially define map-back for  $H-G$
  - Add degree two vertices to  $H$  so each edge in  $H$  has length at most 1 (technical)
  - $E-V+1$  is in  $G$  or in  $H$  as a result of the above unchanged



# Problem

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- Distances between new vertices in  $G$  may not expand in  $H$ 
  - Translate to distances in terms of original vertices in  $G$



# Problem

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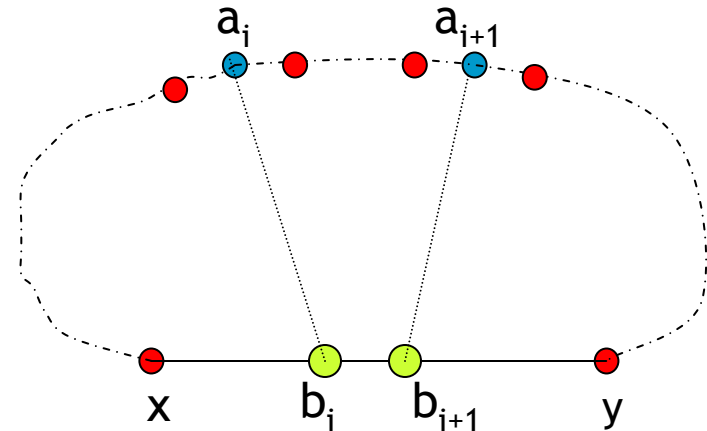
- Take each  $e=(x,y)$  in  $G$ , map to  $H$  and then map back to  $G$ :
  - We get a sequence on vertices  $x a_1 a_2 a_3 \dots y$ ; two cases
    - This cancels to just  $e$  itself  $\rightarrow$  each cycle in  $G$  maps to itself  $\rightarrow$  contradiction as before
    - This gives some other path in  $G$  between the endpoints of  $e$ 
      - $\rightarrow$  the cycle formed by the path +  $e$  IS amongst the  $k-1$  shortest cycles  
 $\rightarrow$  each cycle in  $G$  maps to itself plus a combination of the  $k-1$  shortest cycles  $\rightarrow$  contradiction as before
      - $\rightarrow$  the cycle formed by the path +  $e$  is NOT amongst the  $k-1$  shortest cycles (so length  $\geq g_k$ )  $\rightarrow$  cannot claim distortion at least  $g_k - 1$  as before because the distance between  $a_i$  and  $a_{i+1}$  in  $G$  need not be less than that in  $H$  (unless both vertices were in  $G$  originally)

# Proof

Consider  $G$

Take images of  $a_i$  and  $a_{i+1}$  on  $e=xy$  (distances between images are proportional to those in  $H$ )

- Distance  $b_i a_i$  is  $\leq g_k/3 - 4/3$  (Why?)
- Distance  $b_{i+1} a_{i+1}$  is  $\leq g_k/3 - 4/3$  (Why?)
- Distance  $a_i a_{i+1}$  is  $\leq g_k/3 - 1/3 + 2$ , likewise for  $b_i b_{i+1}$  (Why?)
- Total is  $\leq g_k - 1$ , i.e., the cycle  $b_i a_i a_{i+1} b_{i+1} b_i$  IS amongst the smallest  $k-1$  cycles
- Each cycle maps to itself plus a linear combination of small cycles  $\rightarrow$  contradiction as before

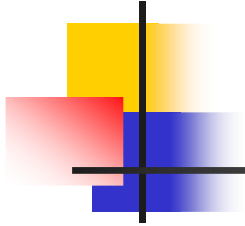




## Exercise

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- Complete the proof
- Is it tight for a cycle  $G$ ? Is there a graph  $H$  with  $|H| > |G|$  so that the embedding has distortion as low as  $|G|/3$ ?



## Way Forward

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- How about embedding not on to a single less complex graph but to a probability distribution of less complex graphs
- What is the maximum expected stretch?



## Cycle to Paths

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- Take all  $n$  paths, each with prob  $1/n$
- How large is the expected stretch for any edge?  $\leq 2!!$



# Application

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- K-medians
- Find  $k$  centers in a graph so sum of all vertices of distance to nearest center is minimized
- Suppose you have an  $A$  approximate algorithm for trees
- And also an embedding on to a prob dist of trees so that the maximum expected stretch is  $B$
- Then we can claim an expected approx factor  $AB$  on graphs (Why?)
- How do we convert expectation to a high probability bound?
- How about running time?



## Probabilistic Lower Bounds

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- Why do the previous arguments fail for probability distributions over graphs in  $H$ ?
- In each graph in  $H$ , some edge has a large distortion, but the prob weight on this graph is low.



# Two Player Games

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- Fix  $G$  and some algorithm to embed  $G$  into a tree
- For all prob dist over trees. there exists an edge for which expected distortion  $\geq c$
- 2 player game
  - You choose prob dist  $P$  over trees
  - I choose an edge  $e$
  - Value of this game is the expected distortion for  $e$  wrt  $P$
  - I win if the value  $\geq c$  otherwise you win



# Two Player Games

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- Flip the game
- There exists an edge  $e$ , such that for all prob distributions over trees, the expected distortion for  $e \geq c$
- 2 player game
  - I choose an edge  $e$
  - You choose prob dist  $P$  over trees
  - Value of this game is the expected distortion for  $e$  wrt  $P$
  - I win if the value  $\geq c$  otherwise you win



# Two Games

---

- **Game A**
  - You choose prob dist  $P$  over trees
  - I choose an edge  $e$
  - Value of this game is the expected distortion for  $e$  wrt  $P$
  - I win if the value  $\geq c$  otherwise you win
  
- **Game B**
  - I choose an edge  $e$
  - You choose prob dist  $P$  over trees
  - Value of this game is the expected distortion for  $e$  wrt  $P$
  - I win if the value  $\geq c$  otherwise you win



Which game has a higher value?

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- $Game A \geq Game B$



# Two Games

---

- **Game A**
  - You choose prob dist  $P$  over trees
  - I choose an edge  $e$
  - Value of this game is the expected distortion for  $e$  wrt  $P$
  - I win if the value  $\geq c$  otherwise you win
  
- **Game B**
  - I choose a probability distribution  $Q$  over edges
  - You choose a tree
  - Value of this game is the expected distortion for  $e$  wrt  $Q$
  - I win if the value  $\geq c$  otherwise you win



Which game has a higher value?

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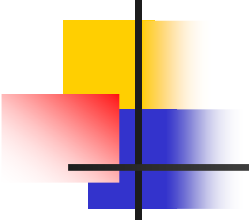
- $Game A \geq Game B$  !!
- Von Neuman's Principle, Yao's Lemma



# Probabilistic Lower Bounds

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- For all prob dist  $P$  over trees, there exists edge  $e$  with large expected distortion
- There exists prob dist  $Q$  over edges, such that for all trees, the expected distortion is large
- Pick  $Q$ , show that for all trees, the expected distortion is large
- Eg,  $Q$  is uniform, simply show that the average distortion when embedding into any tree is large



## Another Example: Randomized $\rightarrow$ Average Case

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- Show that no randomized algorithm can have good performance for all inputs
- Show that for any deterministic algorithm, the average performance over all inputs is not good



# Probabilistic Lower Bounds

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- Find a graph  $G$  such that the average distortion when embedding into any tree is large, say  $\log n/3$
- Show this for any graph which has
  - $\geq 2n$  edges
  - Smallest cycle  $> K$
  - At least half the edges must have distortion  $> K/3$
  - Average distortion must be greater than  $K/3$