Abhiram Ranade

March 8, 2016

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n = number of vertices, m = number of edges Only finite number of paths to consider.

Decisions that we make in designing an algorithm:

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Not proper recursion: Instances on which recursive calls are made are not "simpler" than original instance.

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  if i = 0 and v = t then return null
  if i = 0 and v != t then return "invalid"
  PO = sPath(i-1,v) // if length(shortest path) < i
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