

Graph Algorithms

- Graph traversal
- Topological sort
- **Strongly connected components**
- Single-source shortest path

CS140 31-1

Digraph notions

- Vertex y is *reachable* from x if there is a directed path in G from x to y .
- By convention x is reachable from x by a directed path of length 0.

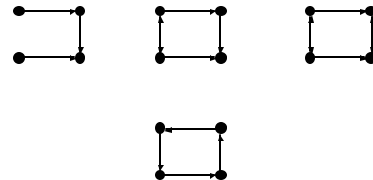
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Digraph notions cont.

- Vertex y is *reachable* from x if there is a directed path in G from x to y .
- Vertices x and y are *strongly connected* if x is reachable from y and y is reachable from x .

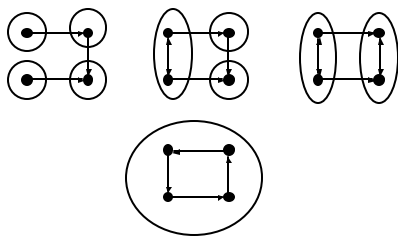
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Strongly-connected vertices?



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Strongly-connected vertices:



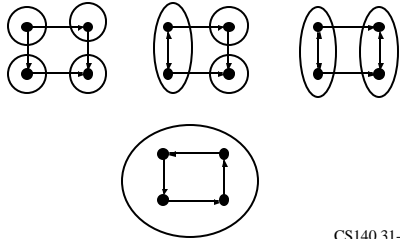
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Digraph notions cont.

- Strongly-connected is an equivalence relation.
- The vertices are partitioned into equivalence classes called strongly connected components.

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Strongly connected components SCC



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DFS Application

- Identify the strongly connected components of a digraph G .

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Depth-First(x)

Depth-First(x)
Mark x visited
For each edge $\langle x, y \rangle$
If y is unvisited then
DFS(y)

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DFS(G)

DFS(G)
While G has an unvisited
vertex x:
Depth-First(x)

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WARNING

- Order matters
- We'll use alphabetical priority

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DFS(G)

DFS(G)
While G has an unvisited
vertex x:
Depth-First(x)

Choose
alphabetically

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Depth-First(x)

Depth-First(x)

Mark x visited

For each edge $\langle x, y \rangle$

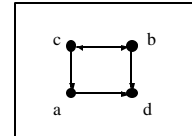
If y is unvisited then
DFS(y)

Choose
alphabetically

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DFS(G) Alphabetical priority

a is unvisited so DFS(a)

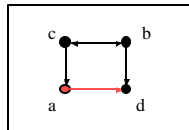


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DFS(a) Alphabetical priority

Visit a

Find $\langle a, d \rangle$ edge and call
DFS(d)

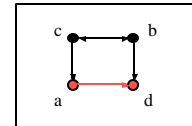


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DFS(d) Alphabetical priority

Visit d

All out-edges checked so
return



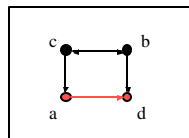
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DFS(a) Alphabetical priority

Visit a

Find $\langle a, d \rangle$ edge and call
DFS(d)

All out-edges checked so
return

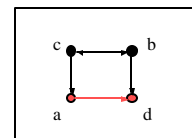


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DFS(G) Alphabetical priority

a is unvisited so DFS(a)

b is unvisited so DFS(b)



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DFS(b) Alphabetical priority

Visit b
Find edge <b,c> and call DFS(c)

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DFS(c) Alphabetical priority

Visit c
Find edge <a,c> – no action
Find edge <b,c> – no action
All out-edges checked so return

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DFS(b) Alphabetical priority

Visit b
Find edge <b,c> and call DFS(c)
Find edge <b,d> – no action
All out-edges checked so return

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DFS(G) Alphabetical priority

a is unvisited so DFS(a)
b is unvisited so DFS(b)
All nodes checked so return

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What is the running time of DFS?

- $O(m+n)$
- Every vertex is pushed onto the stack once and popped from the stack once.
- Each out-edge is inspected once.

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Strongly Connected Components

- Input: Digraph G
- Output: The strongly connected components of G.

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Naïve Algorithm

- Are x and y in the same connected component?
- Mark all vertices unvisited and call $\text{DFS}(x)$
- If y unvisited return no
- Mark all vertices unvisited and call $\text{DFS}(y)$
- If x unvisited return no otherwise yes

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Naïve algorithm

- Worst case: n^2 calls to $\text{DFS}(x)$

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All little more sophistication please...

- We can find the strongly connected components of G with two calls to $\text{DFS}(G)$

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Three ideas

- **DFS Forest of G**
- Timestamps
- Reversal of G

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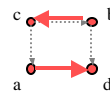
DFS Forest of G

- The DFS Forest of G is the subgraph consisting of
 - Every vertex of G
 - Each edge traversed in $\text{DFS}(G)$

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“Traversed”

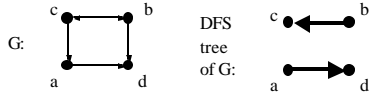
- Walked across to visit



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DFS Forest

- The DFS Forest of G is the subgraph consisting of
 - Every vertex of G
 - Each edge traversed in $\text{DFS}(G)$



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WARNING

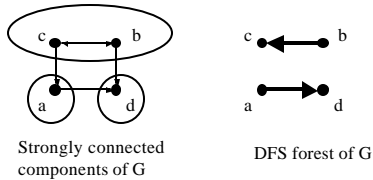
- DFS Forests are sometimes



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DFS Forest

- If x is reachable from y ... can't say much



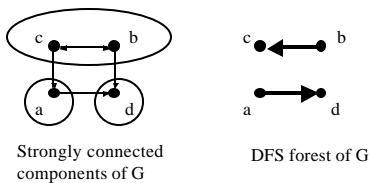
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DFS Forest

- If x and y are in the same strongly connected component of G then they are in the same tree of the DFS forest of G .
- Why?

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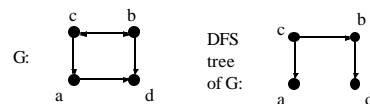
Converse is not true



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The problem

- The DFS forest of G depends on the order in which we consider vertices and edges.
- Example: ordering c, b, a, d or c, b, d, a



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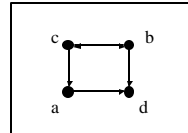
Three ideas

- DFS Forest of G
- **Timestamps**
- Reversal

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DFS(G)

a is unvisited so DFS(a)

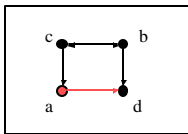


	First-arrival	Last-Departure
a		
b		
c		
d		

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DFS(a)

Visit a
Find <a,d> edge so call
DFS(d)

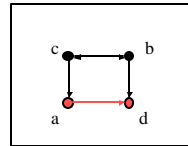


	First-arrival	Last-Departure
a	1	
b		
c		
d		

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DFS(d)

Visit d
All out-edges checked so
return

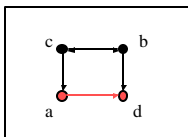


	First-arrival	Last-Departure
a	1	
b		
c		
d	2	3

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DFS(a)

Visit a
Find <a,d> edge and call
DFS(d)
All out-edges checked so
return

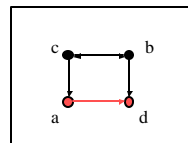


	First-arrival	Last-Departure
a	1	4
b		
c		
d	2	3

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DFS(G)

a unvisited so Call DFS(a)
b unvisited so Call DFS(b)



	First-arrival	Last-Departure
a	1	4
b		
c		
d	2	3

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DFS(b)

Visit b
Find edge <b,c> and call DFS(c)

	First-arrival	Last-Departure
a	1	4
b	5	
c		
d	2	3

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DFS(c)

Visit c
Find edge <a,c> – no action
Find edge <b,c> – no action
All out-edges checked so return

	First-arrival	Last-Departure
a	1	4
b	5	
c	6	7
d	2	3

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DFS(b)

Visit b
Find edge <b,c> and call DFS(c)
Find edge <b,d> – no action
All out-edges checked so return

	First-arrival	Last-Departure
a	1	4
b	5	8
c	6	7
d	2	3

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DFS(G)

Call DFS(a)
Call DFS(b)
All nodes visited so return

	First-arrival	Last-Departure
a	1	4
b	5	8
c	6	7
d	2	3

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Three ideas

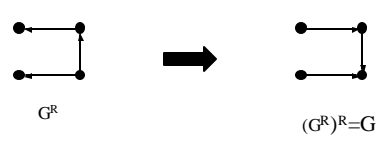
- DFS Forest of G
- Timestamp
- **Reversal of G**

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G^R : Reverse the edges of G

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$(G^R)^R$: Reverse the edges of G^R



G^R $(G^R)^R = G$

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Reachability




G G^R

X is reachable from Y in $G \Leftrightarrow Y$ is reachable from X in G^T

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Reachability



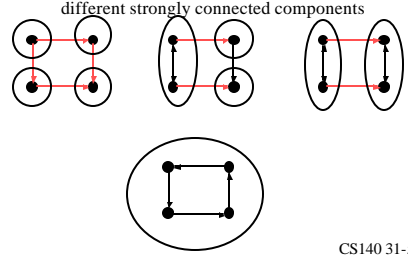
G G^R

X is reachable from Y in $G \Leftrightarrow Y$ is reachable from X in G^T
So the SCC of G and G^R are the same!

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SCC

Reversal only affects edges between
different strongly connected components



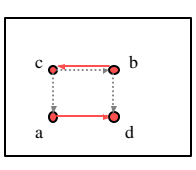
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SCC

- DFS(G) with timestamp
- DFS(G^R) using last-departure time decreasing order
- The trees in the DFS forest of G^R correspond to the connected components of G

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DFS(G)



	First-arrival	Last-Departure
a	1	4
b	5	8
c	6	7
d	2	3

Last-Departure time decreasing order: b,c,a,d

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Claim

- If x is reachable from y then at least one of the following holds:
 - A. $\text{Last-Departure}(y) > \text{Last-Departure}(x)$
 - B. x and y are in the same SCC

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Proof

When $\text{DFS}(y)$ is called:

1. We haven't yet visited X – then x is visited during $\text{DFS}(y)$
2. We have visited X
 - a. We haven't departed X
 - b. We have departed X

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Proof

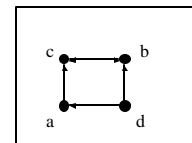
When $\text{DFS}(y)$ is called:

1. We haven't yet visited $X \rightarrow$ then x is visited during $\text{DFS}(y)$ \Rightarrow A holds
2. We have visited X
 - We haven't departed X \Rightarrow B holds
 - We have departed X \Rightarrow A holds

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$\text{DFS}(G^R)$

Order: b,c,a,d

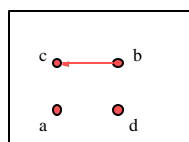


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$\text{DFS}(G^R)$

Order: b,c,a,d

Each DFS tree corresponds to a connected component.



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Why does this work?

1. If x and y are in the same strongly connected component of G then they are in the same tree of the DFS forest of G^R .
2. If x and y are in the same tree of the DFS forest of G^R then they are in the same strongly connected component of G .

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Claim 1

- If x and y are in the same strongly connected component of G then they are in the same tree of the DFS forest of G .
- The SCC of G are identical to those of G^R .

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Why does this work?

1. If x and y are in the same strongly connected component of G then they are in the same tree of the DFS forest of G^R .
2. If x and y are in the same tree of the DFS forest of G^R then they are in the same strongly connected component of G .


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Claim 2

- Let x and y be in the same tree constructed in the DFS forest of G^R . WLOG assume x is the root.
- Since y is reachable from x in G^R , x is reachable from y in G . By a previous claim one of the following conditions holds:
 - $\text{Last-Departure}(y) > \text{Last-Departure}(x)$ in $\text{DFS}(G)$, or
 - x and y are in the same SCC in G

CS140 31-63

Claim 2

- Let x and y be in the same tree constructed in the DFS forest of G^R . WLOG assume x is the root.
- Since y is reachable from x in G^R , x is reachable from y in G . By a previous claim one of the following conditions holds
 - $\text{Last-Departure}(y) > \text{Last-Departure}(x)$ in $\text{DFS}(G)$
 -  Contradiction
 - x and y are in the same SCC in G

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Why does this work?

1. If x and y are in the same strongly connected component of G then they are in the same tree of the DFS forest of G^R .
2. If x and y are in the same tree of the DFS forest of G^R then they are in the same strongly connected component of G .

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Graph Algorithms

- Graph traversal
- **Topological sort**
- Strongly connected components
- Single-source shortest path

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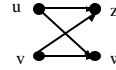
Topological Sort

- Input: Acyclic digraph
- Output: List of the vertices of G ordered to satisfy the following: If there is a path from x to y in G then x precedes y in the list.

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Example

- Input:



- Output: u, v, z, w

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Algorithm

- DFS(G) with timestamps
- Output vertices by decreasing last-departure time.

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