

CMPT231

Lecture 10: ch22

Graph Algorithms

Some material from [Sedgewick + Wayne, "Algorithms"](<http://algs4.cs.princeton.edu/>)

Romans 10:13-15 (NIV)

“Everyone who **calls** on the **name of the Lord** will be saved.”

How, then, can they **call** on the one they have not **believed** in?

And how can they **believe** in the one of whom they have not **heard**?

And how can they **hear** without someone **preaching** to them?

And how can anyone **preach** unless they are **sent**?

As it is written:

Outline for today

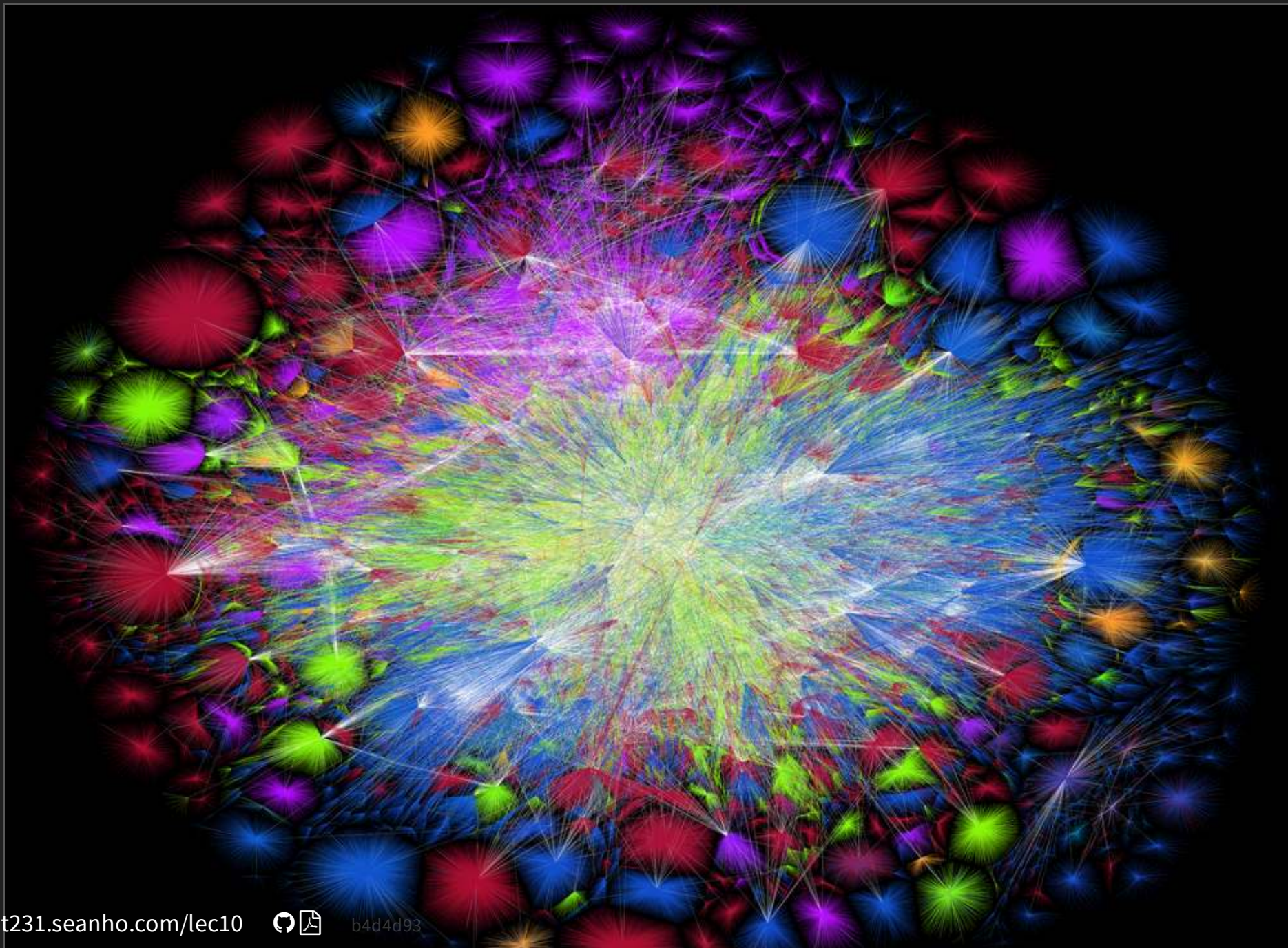
- Intro to **graph** algorithms
 - Applications and typical problems
 - Edge list, adjacency list, adjacency matrix
- **Breadth-first** graph traversal
- **Depth-first** graph traversal
 - **Parenthesis** structure
 - Edge **classification**
 - Topological **sort**
 - Finding **strongly-connected** components

Intro to graph algorithms

- Representing **graphs**: $G = (V, E)$
- **V: vertices** / nodes
 - storage: **array**, **linked-list**, etc.
- **E: edges** connecting vertices
 - **directed** or **undirected**
 - storage: edge **list**, adjacency **matrix**, etc.
- Some corner cases:
 - **Self-loop**: edge from vertex to itself
 - **Parallel** edges: multiple edges with same start/end
- **Complexity** of graph algorithms in terms of

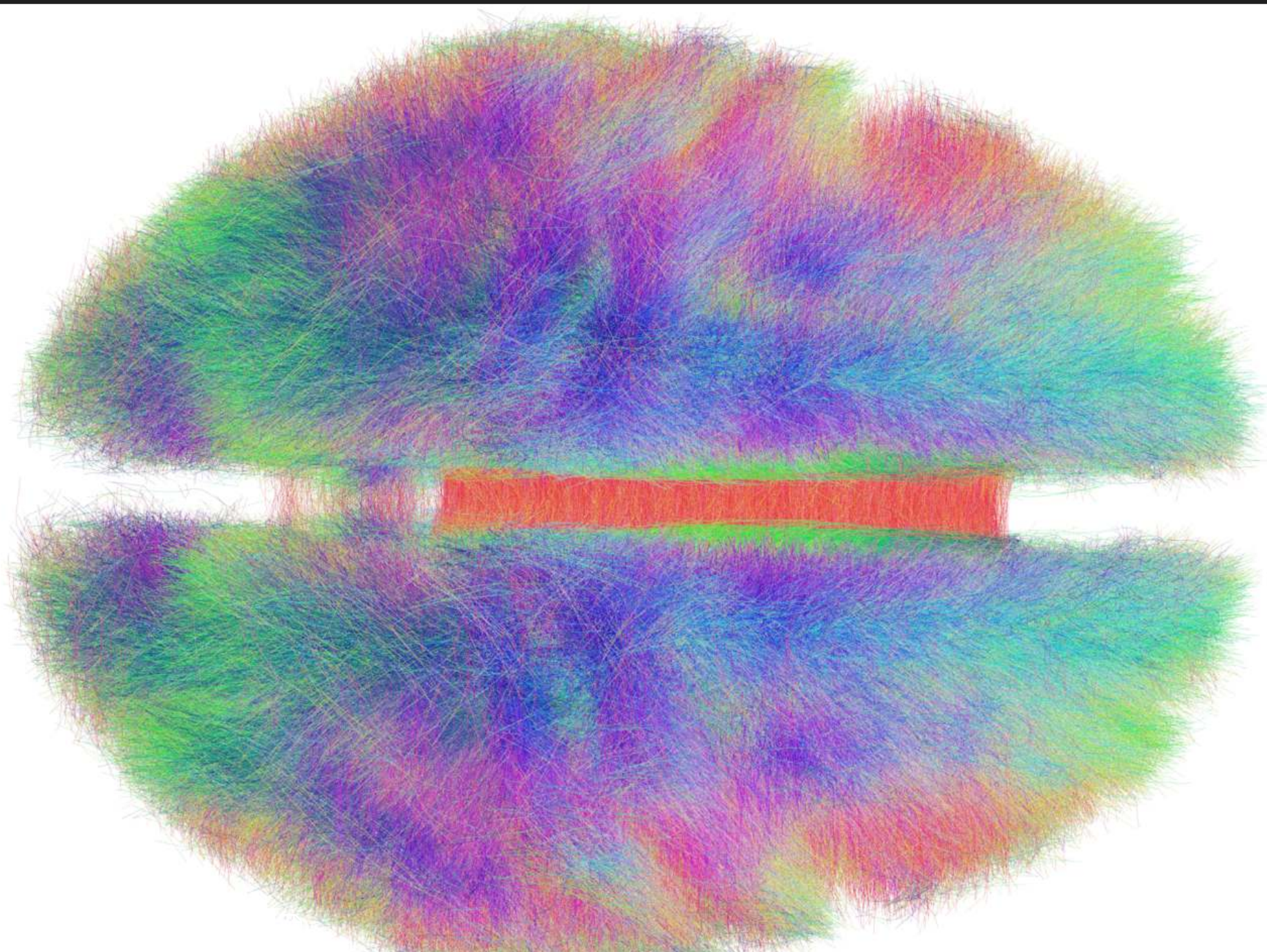
Applications of graphs

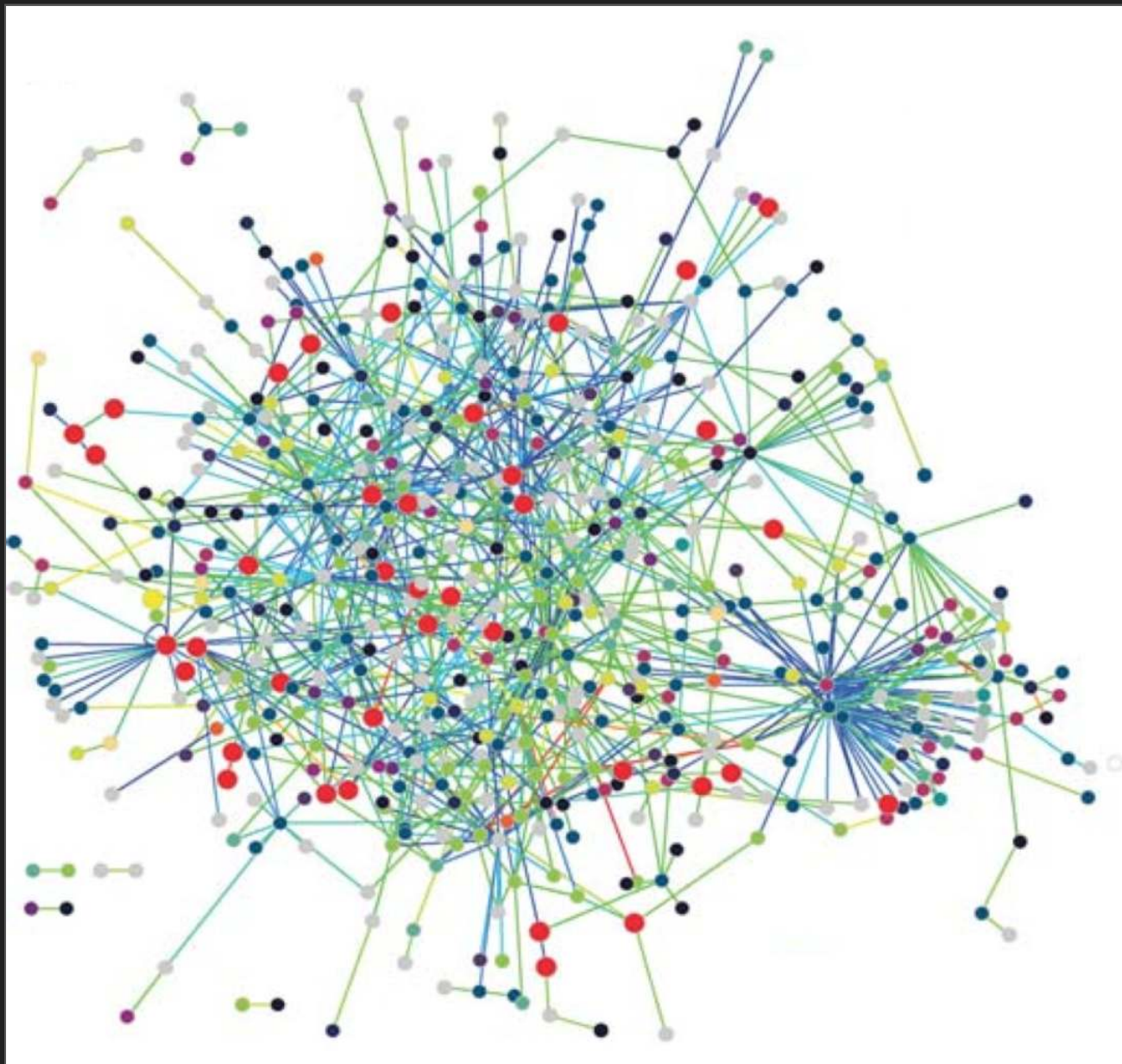
graph	vertex	edge
air transport	airport	flight path
social	person	friendship /relationship
internet	computer	network connection
finance	stock /asset	transaction
neural net	neuron	synapse
protein net	protein	protein-protein interaction





24hrs of flights in/out of Europe: [422South for NATS](<http://422south.com/work/euro-24-air-traffic-visualization-for-nats>)





Problems in graph theory

- **Path finding**: is there a path from u to v ?
- **Shortest path**: find the **shortest** path from u to v
- **Cycle**: does the graph have any **cycles**?
- **Euler cycle**: traverse each **edge** exactly once
- **Hamilton cycle**: touch each **vertex** exactly once
- **Connectivity**: are all the vertices **connected**?
- **Bi-connectivity**: can you disconnect the graph by **removing** one vertex?
- **Planarity**: draw graph in **2D** w/o crossing edges?
- **Isomorphism**: are two graphs **equivalent**?

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Representing edges

- **Edge list:** array/list of (u,v) pairs of nodes
 - $[(1,2), (1,3), (2,4)]$
 - How to find neighbours of a vertex u ?
- **Adjacency list:** indexed by start node
 - $[\{1: [2, 3]\}, \{2: [1, 4]\}, \{3: [1]\}, \{4: [2]\}]$
 - How to find the (out)-degree of each vertex?
- **Adjacency matrix:** boolean $|V| \times |V|$ matrix

- $A[i,j] = 1$ iff (i,j) is an edge:

$$\begin{pmatrix} 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \end{pmatrix}$$

- What about directed graphs? Weighted graphs?

Graph traversal: breadth-first

- **Traversal**: visits each node exactly **once**
- BFS: overlay a **breadth-first tree**
 - Choose a **start** (root) node
 - **Path** in tree = **shortest** path from root
 - Only nodes **reachable** from start node
 - BFS tree not necessarily **unique**
- Graph could have **loops**:
 - Need to **track** which nodes we've seen
- Assign **colours** to nodes as we traverse graph:
 - **White**: unvisited
 - **Grey**: on border (some unvisited neighbours)
 - **Black**: no unvisited neighbours

BFS algorithm

- In: **vertex** list, **adjacency** (linked) list, **start** node
- Out: **modify** vertex list, adding **parent** pointers

```
def BFS( V, E, start ):
    init V all white and NULL parent
    start.colour = grey
    init FIFO: Q.push( start )
    while Q.notempty():
        u = Q.pop()
        for v in E.adj[ u ]:
            if v.colour == white:
                v.colour = grey
                v.parent = u
                Q.push( v )
        u.colour = black
```

![BFS](static/img/Breadth-First-Search-Algorithm.gif)

Complexity?

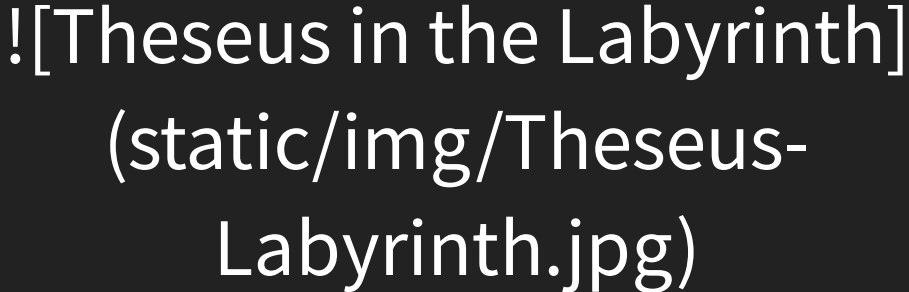
BFS properties

- BFS examines nodes in order of **distance** from source
 - Queue first holds all nodes of distance k ,
 - Then all nodes of distance $k+1$, etc.
- **Levels** of BFS tree = nodes of same **distance** from source
- \Rightarrow BFS computes **shortest paths** from source to all other reachable nodes in time $O(|V| + |E|)$
 - e.g., **Kevin Bacon number**:
 - vertices = **actors**, edges = **shared movies**

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Trémaux maze solving

- Graph representation of a **maze**:
 - **Vertex** = **intersection**, **edge** = **passage**
- **Theseus** slaying the Minotaur in the **Labyrinth**  ! [Theseus in the Labyrinth] (static/img/Theseus-Labyrinth.jpg)
 - Ariadne gave him a tool: **ball of string**:
- **Unwind** string as you go
 - **Track** each **visited** intersection + passage
 - **Retrace** steps when

Depth-first search

- First explore as **deep** as we can
 - **Backtrack** to explore other paths
 - **Recursive** algorithm (ball of string = **call stack**)
- **Colouring**: **white** = undiscovered, **grey** = discovered, **black** = finished (visited all neighbours)
- Add **timestamps** on **discover** and **finish**
- Overlay a **forest** on the graph
 - **Subtree** at a node = all nodes visited between this node's **discovery** and **finish**

DFS algorithm

```
def DFS( V, E ):  
    init V all white and NULL parent  
    time = 0  
    for u in V:      # why loop over ALL vert  
        if u.colour == white:  
            DFS-Visit( V, E, u )
```

```
def DFS-Visit( V, E, u ):  
    time++  
    u.discovered = time  
    u.colour = gray  
    for v in E.adj[ u ]:  
        if v.colour == white:  
            v.parent = u  
            DFS-Visit( V, E, v )  
    u.colour = black  
    time++  
    u.finished = time
```

![DFS anim]
(static/img/Depth-First-Search.gif) !
[DFS]
(static/img/DFS.svg)

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DFS: parenthesis structure

- Each node's **subtree** is visited between its **discover** and **finish** times
- **Print** a $(\cdot_u$ when we **discover** node u
 - Print a $)_u$ when we **finish** it
- Output is a valid **parenthesisation**:
 - e.g., $(\cdot_u(\cdot_v(\cdot_w)_w)_v(\cdot_x(\cdot_y)_y)_x)_u(\cdot_z)_z$
 - But not $(\cdot_u(\cdot_v)_u)_v$
- The (**discover**, **finish**) intervals for any two vertices are
 - Either completely **disjoint**
 - Or one **contained** in the other

DFS: white-path theorem

- The (d, f) interval for v is **contained** in u
 $\Leftrightarrow v$ is a **descendant** of u in the DFS
 - i.e., $u.d < v.d < v.f < u.f$
- **White-path** theorem: ![DFS]
 - v is a **descendant** of u in (static/img/DFS.svg)
the DFS \Leftrightarrow
 - When u is **discovered**,
there is
a **path** $u \rightarrow v$ all of **white**
vertices

DFS: flood-fill

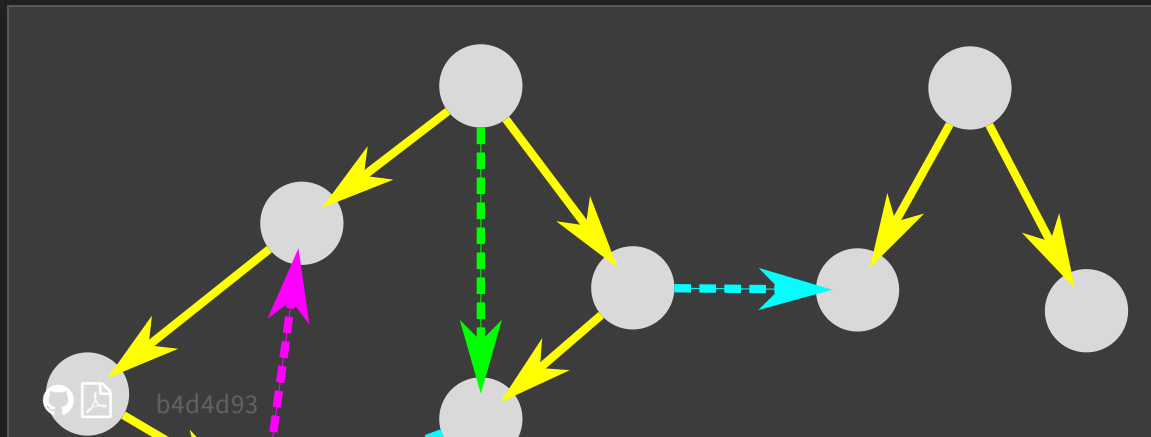
- **Vertex:** pixel
- **Edge:** adjacent pixels of similar colour
- **Blob:** all pixels connected to given pixel

![Manhattan map](static/img/Manhattan.svg)

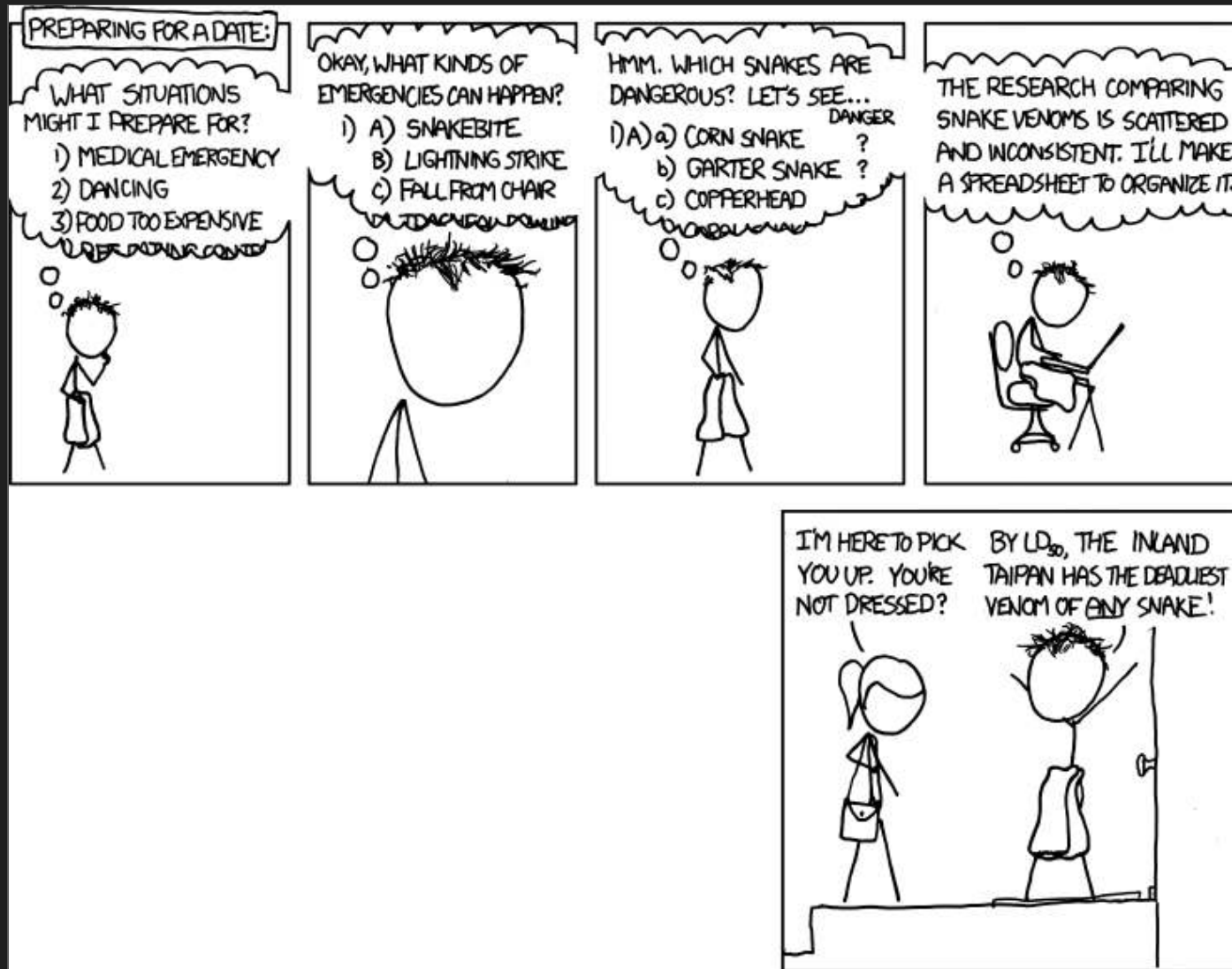
![Australia grid](static/img/Australia_grid2.png)

DFS: edge classification

- All **edges** in a graph are either
 - **Tree** edges: in the **DFS forest**
 - **Back** edges: up to **ancestor** in same DFS tree (incl **self-loop**)
 - **Forward** edges: down to **descendant**
 - **Cross** edges: **different** subtrees or DFS trees
- For directed graphs: **acyclic** \Leftrightarrow no **back** edges



DFS: preparing for a date (XKCD)



I REALLY NEED TO STOP
USING DEPTH-FIRST SEARCHES.

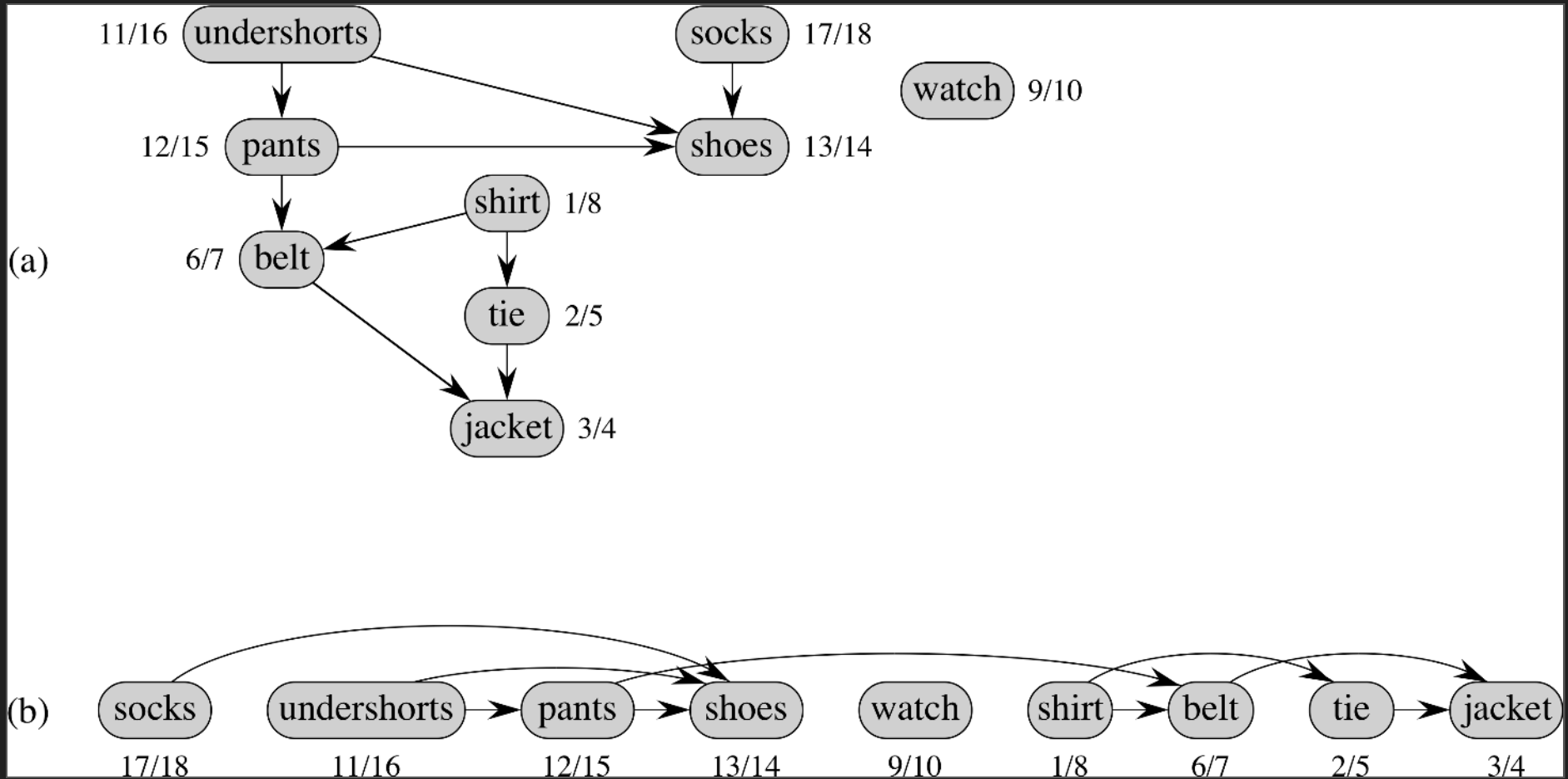
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DFS: topological sort

- Linear **ordering** of vertices such that:
 - for every edge $u \rightarrow v$, u comes **before** v in the sort
 - Assumes **no cycles**! (i.e., **DAG**: directed acyclic)
- **Applications**: **dependency** resolution, **compiling** files, task planning / **Gantt** chart
- Use **DFS** to sort in **decreasing** order of **finish** time
 - As each vertex **finishes**, insert at **head** of a linked list
- **DFS** might not be **unique**, so **topological sort** might not be unique

Topological sort: example

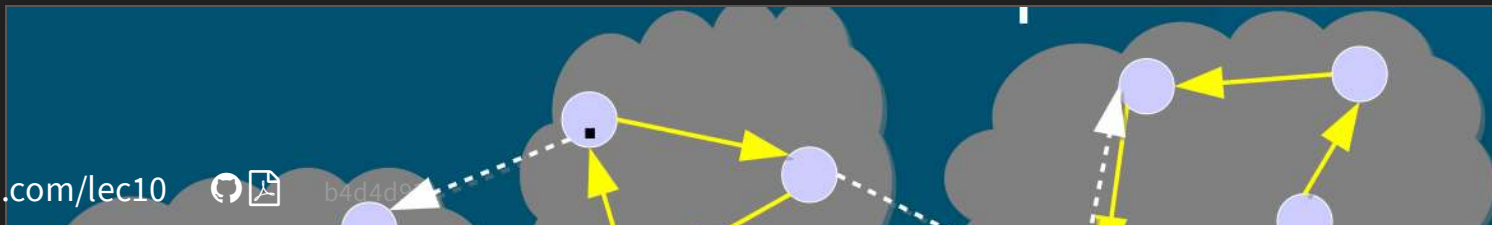


Topological sort: proof

- Recall DFS **colouring**: **white** = undiscovered
 - **grey** = discovered, **black** = finished
- Proof of **correctness**: $(u, v) \in E \Rightarrow v.f < u.f$
- When DFS explores (u, v) , what **colour** is v ?
 - if **gray**: then v is an **ancestor** of u
 - So (u, v) is a **back** edge
 - So graph has a **loop** (disallowed)
 - if **white**: then v becomes a **child** of u :
 - $u.d < v.d < v.f < u.f$
 - if **black**: then v is **done**, but not u yet:
 - $v.f < u.f$

DFS: connected components

- Largest **completely-connected** set of vertices:
 - Every **vertex** has a **path** to every **other** vertex in the component
- Algorithm:
 - Compute **DFS** to find **finishing** times
 - **Transpose** the graph: **reverse** all edges
 - Compute **DFS** on transposed graph
 - Start at vertex that finished **last** in orig DFS
 - Each **tree** in final DFS is a separate **component**



Connected components

- (a) **Original** graph: ![Fig 22-9: components]
(static/img/Fig-22-9.svg)
 - DFS trees
shaded
 - DFS starts at
c
- (b) **Transpose**
graph:
 - All edges
reversed
 - DFS trees
shaded
 - DFS starts at

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Online demos

- **Breadth-first** search:
 - U San Fran (generate random graphs)
 - VisuAlgo (draw your own graph; step through code)
- **Depth-first** search:
 - U San Fran (only one tree of the DFS forest)
 - VisuAlgo (edge classification, only one tree)
- **Topological sort:**
 - U San Fran, VisuAlgo
- **Connected** components:
 - U San Fran
 - VisuAlgo (SCC: Kosaraiu's algorithm)

13:00

