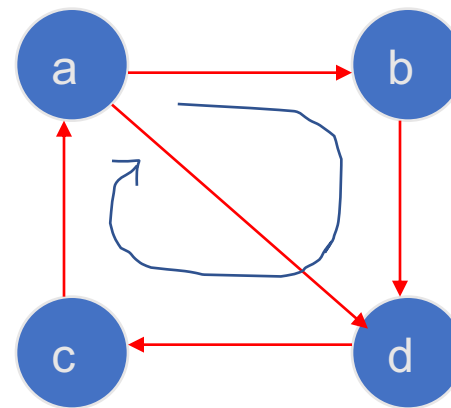
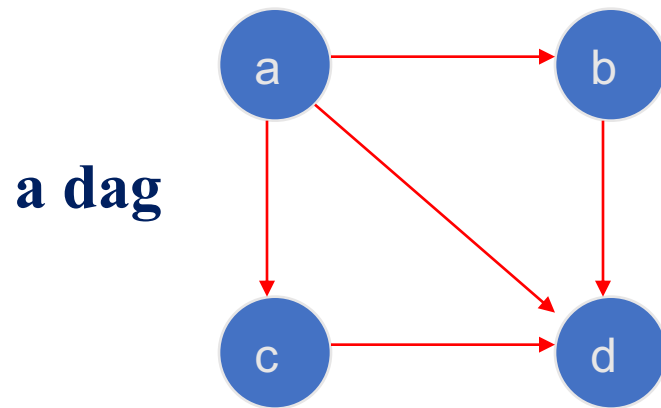


## 4.2 Topological Sorting

A *dag*: a directed acyclic graph,  
i.e. a directed graph with no (directed) cycles



**not a dag**

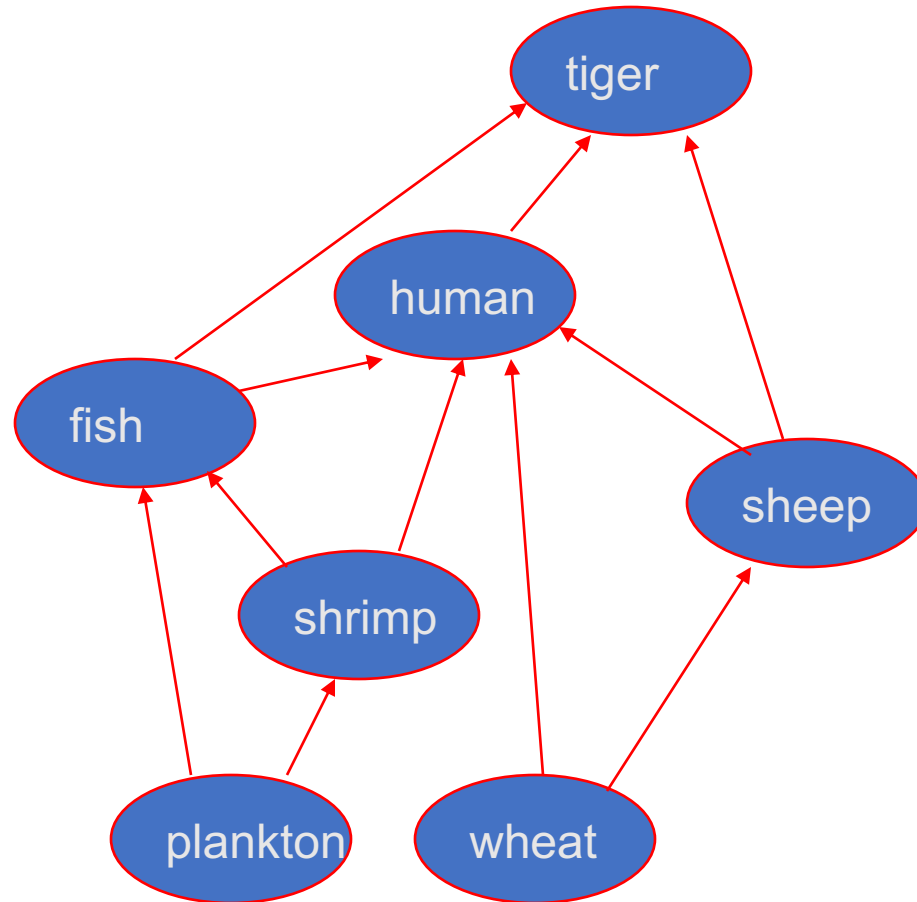
**a,b,c,d,a  
is a cycle**

Arise in modeling many problems that involve *prerequisite constraints*  
(construction projects, document version control)

Vertices of a dag can be linearly ordered so that for every edge  
its starting vertex is listed before its ending vertex (*topological sorting*). Being a  
dag is also a necessary condition for topological sorting be possible.

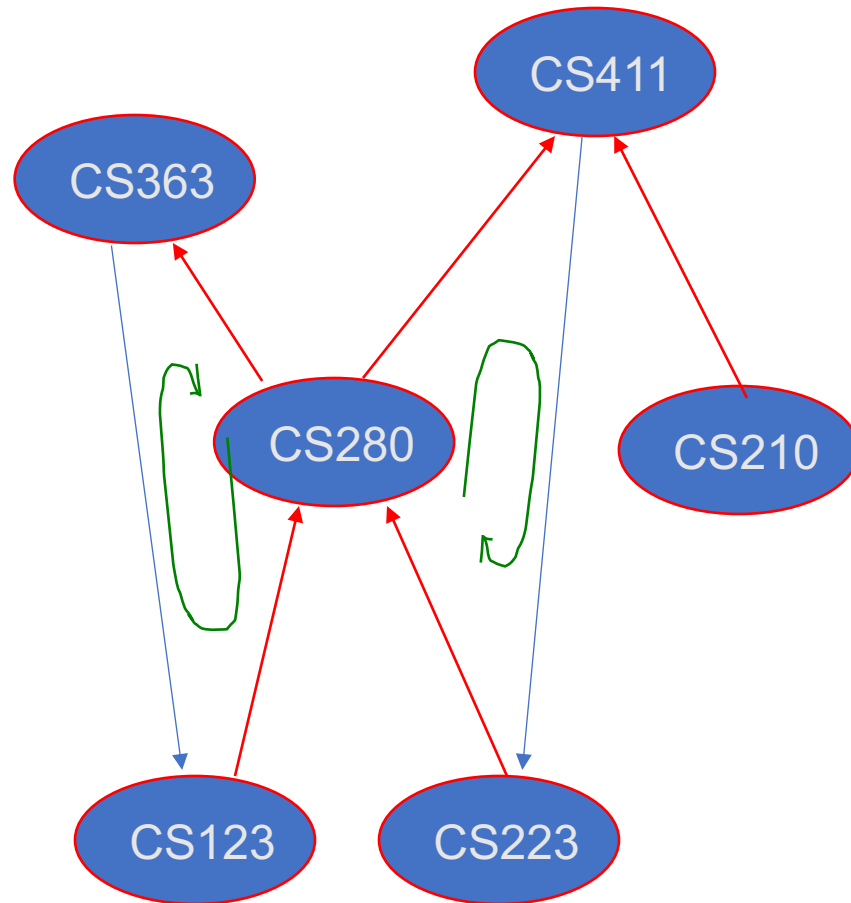
# Topological Sorting Example

Order the following items in a food chain



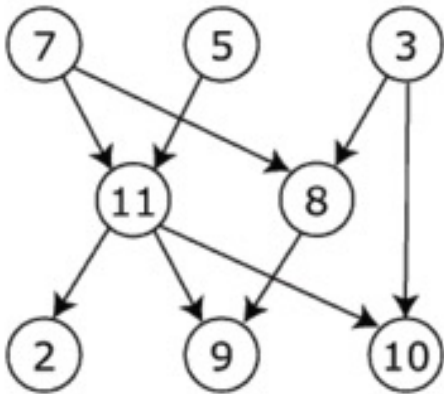
# Topological Sorting Example

Order the following courses in a curriculum



# Topological Sorting Example

- Topological sorting algorithms were first studied in the early 1960s in the context of the [PERT](#) (program evaluation review technique) for [scheduling in project management](#) ([Jarnagin 1960](#)).
- The jobs are represented by vertices, and there is an edge from  $x$  to  $y$  if job  $x$  must be completed before job  $y$  can be started.



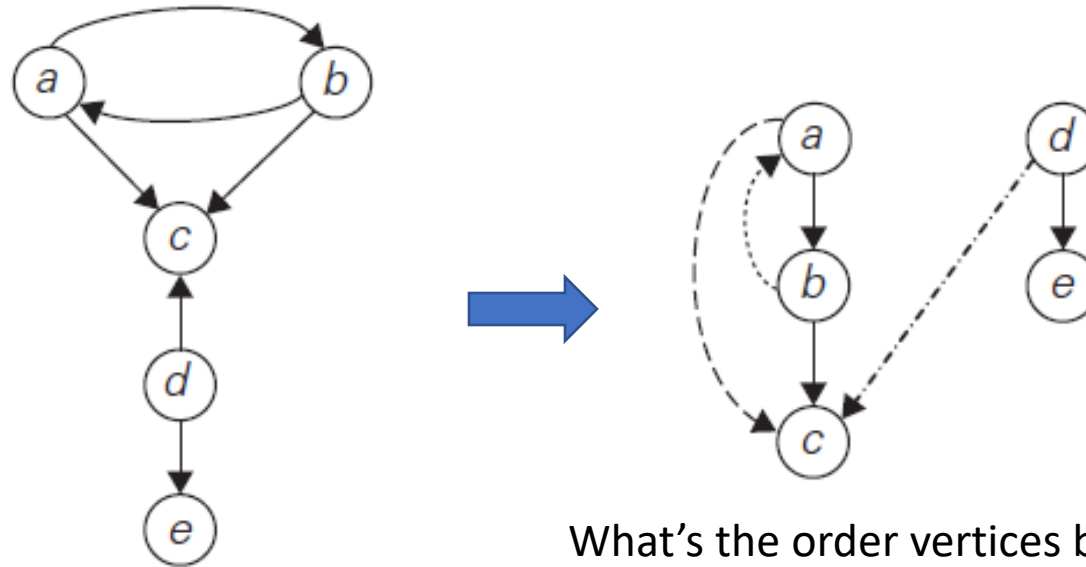
The graph shown to the left has many valid topological sorts, including:

- 7, 5, 3, 11, 8, 2, 9, 10 (visual left-to-right, top-to-bottom)
- 3, 5, 7, 8, 11, 2, 9, 10 (smallest-numbered available vertex first)
- 3, 7, 8, 5, 11, 10, 2, 9
- 5, 7, 3, 8, 11, 10, 9, 2 (fewest edges first)
- 7, 5, 11, 3, 10, 8, 9, 2 (largest-numbered available vertex first)
- 7, 5, 11, 2, 3, 8, 9, 10

# Topological Sorting

- Two algorithms to solve the topological sorting problem (i.e., to determine a directed graph is a dag or not)
  - DFS-based Algorithm
  - Source Removal Algorithm

# Depth First Search on a Digraph



What's the order vertices become dead-ends? (i.e., The order vertices are popped off the traversal stack):

*c, b, a, e, d*

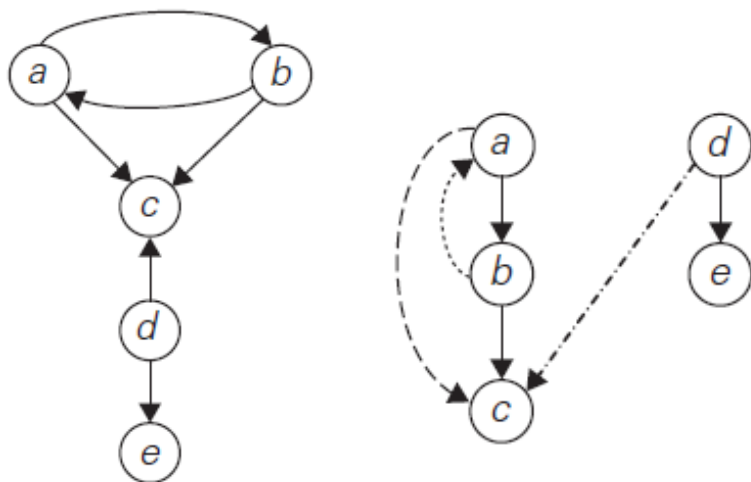
How's the above order related to topological sort?

# DFS-based Algorithm

## DFS-based algorithm for topological sorting

- Perform DFS traversal, noting the order vertices are popped off the traversal stack
- **Reverse order** solves topological sorting problem
- Back edges encountered? → if yes → NOT a dag!

Example:



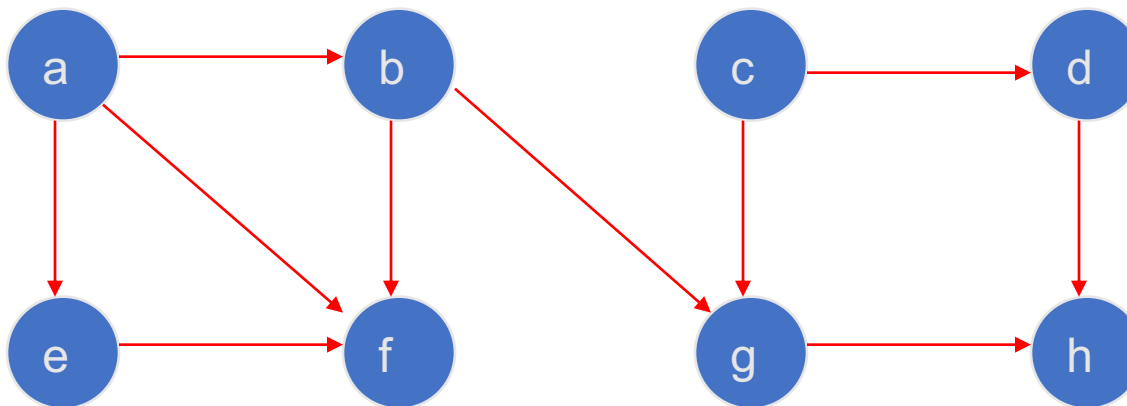
- The order vertices become dead-ends: c, b, a, e, d
- **Reverse order:** d, e, a, b, c
- **Is this a solution? Not yet.**
- Back edges encountered?  
yes → **NOT a dag**
- **Not a solution**

# DFS-based Algorithm

## DFS-based algorithm for topological sorting

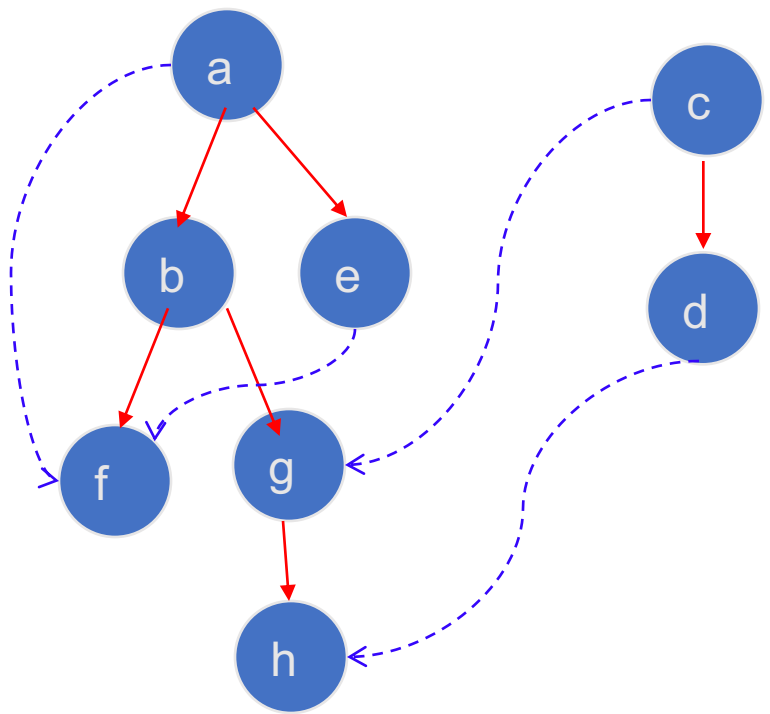
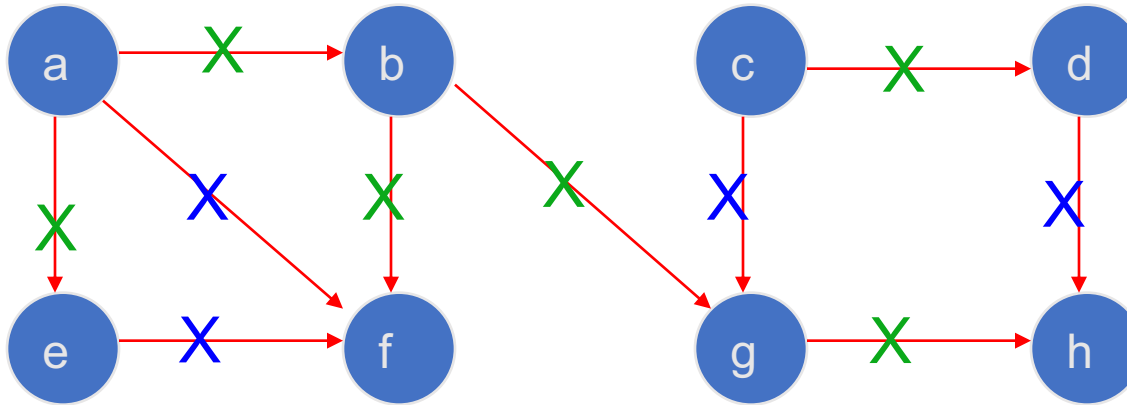
- Perform DFS traversal, noting the order vertices are popped off the traversal stack
- **Reverse order** solves topological sorting problem
- Check this. Back edges encountered?
  - if yes → NOT a dag! → no solution found.

Example:



Efficiency?  
 $O(n)$





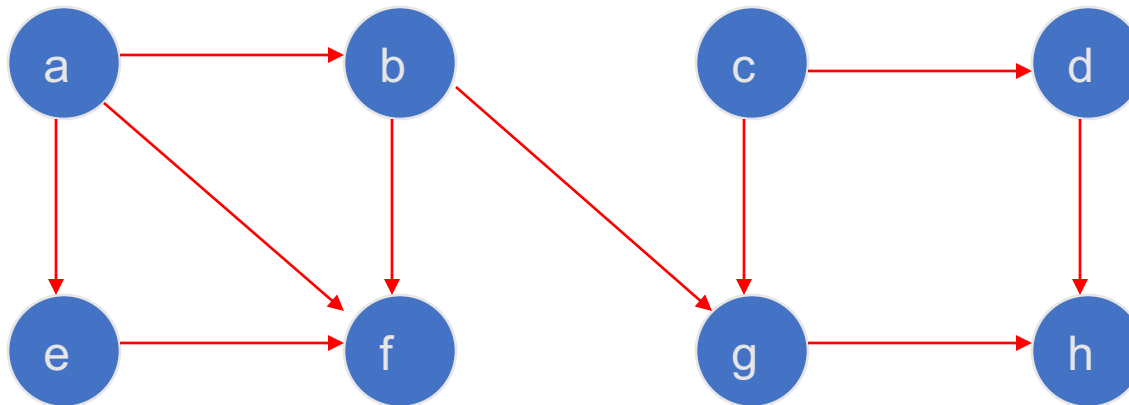
Check the order the vertex  
becomes dead ->  
Only forward edges  
Encountered  
-> It is a dag

# Source Removal Algorithm

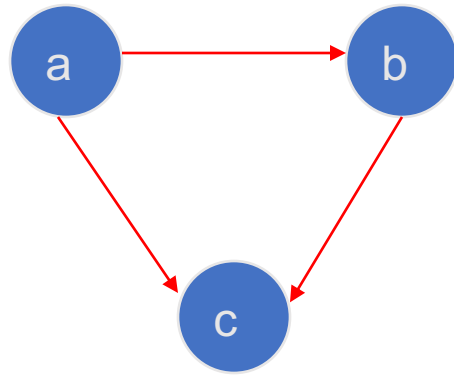
## Source removal algorithm

Repeatedly **identify and remove a source** (a vertex with no **incoming edges**) and all the edges incident to it until either no vertex is left (problem is solved) or there is no source among remaining vertices (not a dag)

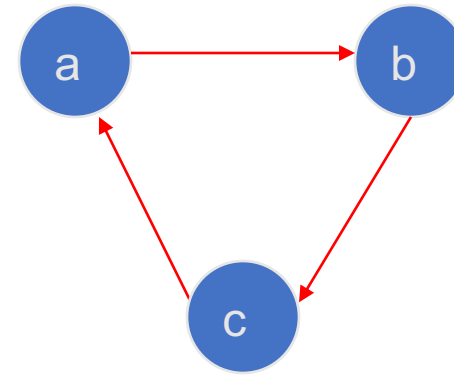
Example:



Efficiency: same as efficiency of the DFS-based algorithm



no vertex is left  
-> it is a dag



no source among  
remaining vertices  
-> it is not a dag

## 4.3 Generating Permutations

## Bottom up algorithm

- If  $n = 1$  return 1;
- Else Given the  $(n-1)!$  permutation of 1, 2, ...,  $n-1$ , insert  $n$  into each position of each of them

Example:  $n=3$

```
start 1
```

step1	12	21
-------	----	----

step2 123 132 312 ; 321 231 213

step3    1234   1243   1423   4123 ; 1324   1342   1432   4132; ....

.....

- This approach requires that all the permutations of  $1, 2, \dots, (n-1)$  are *calculated already*
  - *Not easy to do! (requires lots of space)*

# Permutations of Size $n$

## Generating permutations of size $n$

- find all permutations of size  $n-1$  of elements  $a_1, a_2, \dots, a_{n-1}$
- construct permutations of  $n$  elements as:
  - append  $a_n$  to each permutation of size  $n-1$
  - for each permutation of size  $n-1$ 
    - for  $k$  from 1 to  $n-1$ 
      - insert  $a_n$  in front of  $a_k$
  - append  $a_n$  to the end

# Subsets and Gray Codes

## The straight-forward (or bottom up) implementation

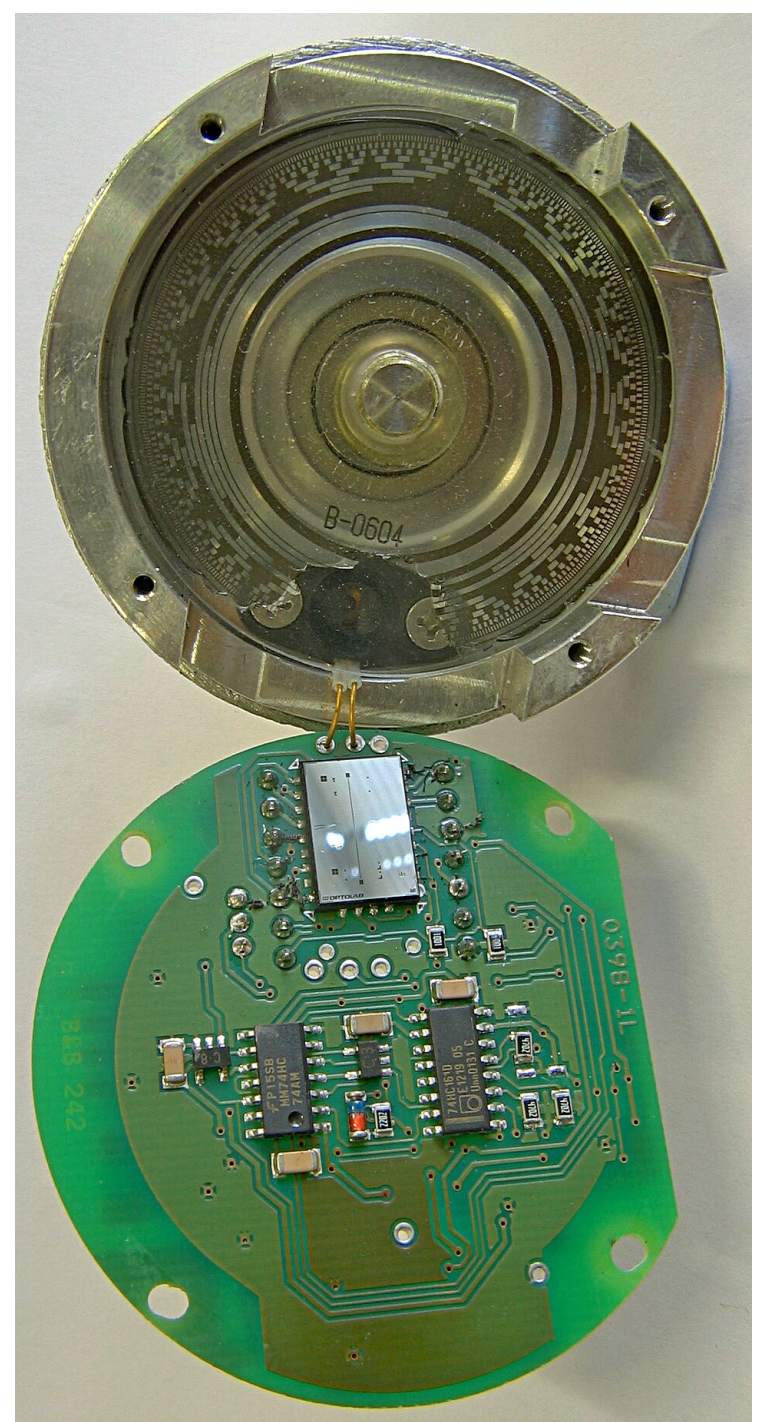
- Let  $S_{n-1}$  be the set of all subsets of  $n-1$  elements,
- $S_{n-1} = \{A_1, A_2, \dots, A_m\}$ ,  $m = 2^{n-1}$
- $S_n = \{A_1, A_2, \dots, A_m, A_1 \cup a_n, A_2 \cup a_n, \dots, A_m \cup a_n\}$

## Gray Codes:

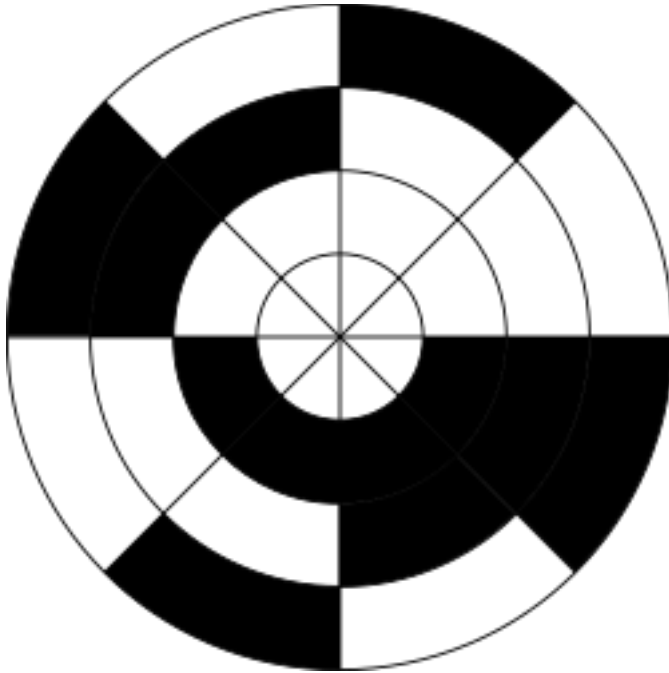
- No need to generate all power sets of smaller sets.
- Frank Gray (1953): a minimal-change algorithm for generating all binary sequences of length  $n$  - “binary reflected Gray code”.

# Rotary Encoders

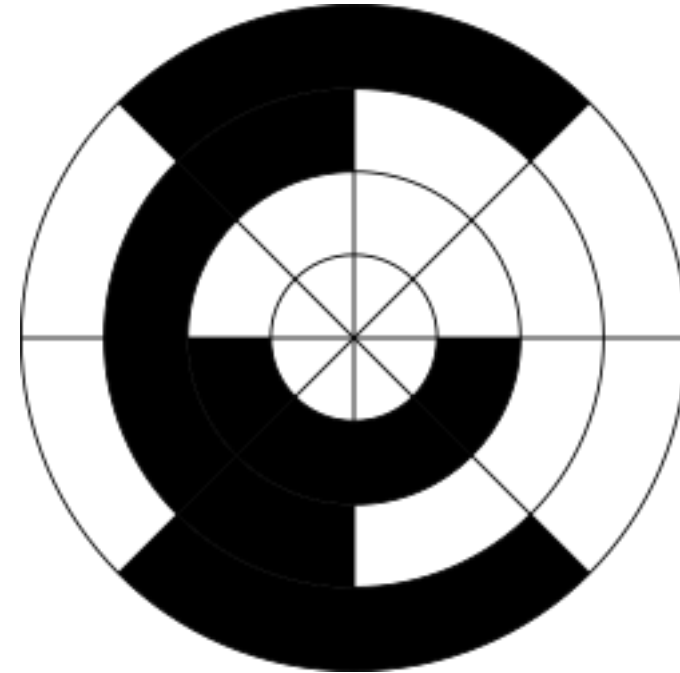
- In robotics, it's often essential to know the *angular position* of a rotating shaft.
- An *encoder* converts some electrical signal into an estimate of angular position.
- An *optical* encoder shoots light through tiny slits and converts that to a binary number that is mapped to an angle.
- A *mechanical* encoder does the same thing with small electrically conductive brushes.



# Gray Codes



A “natural” binary rotary encoding: each sector is 45 degrees. If the encoders aren’t perfectly aligned there can be catastrophic errors



A “gray code” prevents errors. How? What is different



# Generating Subsets

Binary reflected Gray code: minimal-change algorithm for generating  $2^n$  bit strings corresponding to all the subsets of an  $n$ -element set where  $n > 0$

If  $n=1$  make list  $L$  of two bit strings 0 and 1

else

generate recursively list  $L1$  of bit strings of length  $n-1$

copy list  $L1$  in reverse order to get list  $L2$

add **0** in front of each bit string in list  $L1$

add **1** in front of each bit string in list  $L2$

append  $L2$  to  $L1$  to get  $L$

return  $L$

# Subsets and Gray Codes

base	reflect	prepend	reflect	prepend
0	0	00	00	000
1	<u>1</u>	01	01	001
	1	11	11	011
	0	10	<u>10</u>	010
			10	110
			11	111
			01	101
			00	100

# Review: Binary Search

- Very efficient algorithm for searching a key in a sorted array:

$K$  vs  $A[0] \dots A[m] \dots A[n-1]$

If  $K = A[m]$ , stop (successful search); otherwise, continue searching by the same method in  $A[0..m-1]$  if  $K < A[m]$  and in  $A[m+1..n-1]$  if  $K > A[m]$

```
 $l \leftarrow 0; \quad r \leftarrow n-1$   
while  $l \leq r$  do  
   $m \leftarrow \lfloor (l+r)/2 \rfloor$   
  if  $K = A[m]$  return  $m$   
  else if  $K < A[m]$   $r \leftarrow m-1$   
  else  $l \leftarrow m+1$   
return -1
```

# Analysis of Binary Search

- Time efficiency
  - worst-case recurrence:
  - $C_w(n) = 1 + C_w(\lfloor n/2 \rfloor)$ ,  $C_w(1) = 1$
  - solution:  $C_w(n) = \lceil \log_2(n) + 1 \rceil$

This is **VERY** fast: e.g.,  $C_w(10^6) = ?$

- $C_w(10^6) = 20$

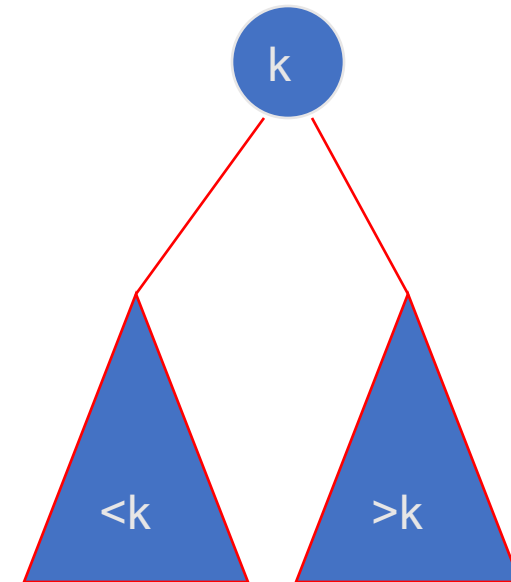
# Analysis of Binary Search

- Optimal for searching a sorted array
- Limitations: must be a sorted array (not linked list)
- Has a continuous counterpart called *bisection method* for solving equations in one unknown  $f(x) = 0$  (see Sec. 12.4 if you like to learn more in this topic, option to you)

# Binary Search Tree Algorithms

Several algorithms on BST requires recursive processing of just one of its subtrees, e.g.,

- Searching
  - Efficiency:
    - Best case  $O(1)$
    - Worst case: the height of the tree
    - Average case?
- Insertion of a new key
- Finding the smallest (or the largest) key



# Searching in Binary Search Tree

Algorithm  $BTS(x, v)$

//Searches for a node with key equal to  $v$  in BST rooted at node  $x$

if  $x = NIL$  return -1

else if  $v = K(x)$  return  $x$

else if  $v < K(x)$  return  $BTS(left(x), v)$

else return  $BTS(right(x), v)$

Efficiency

worst case:  $C(n) = n$

average case:  $C(n) \approx 2 \ln n \approx 1.39 \log_2 n$