

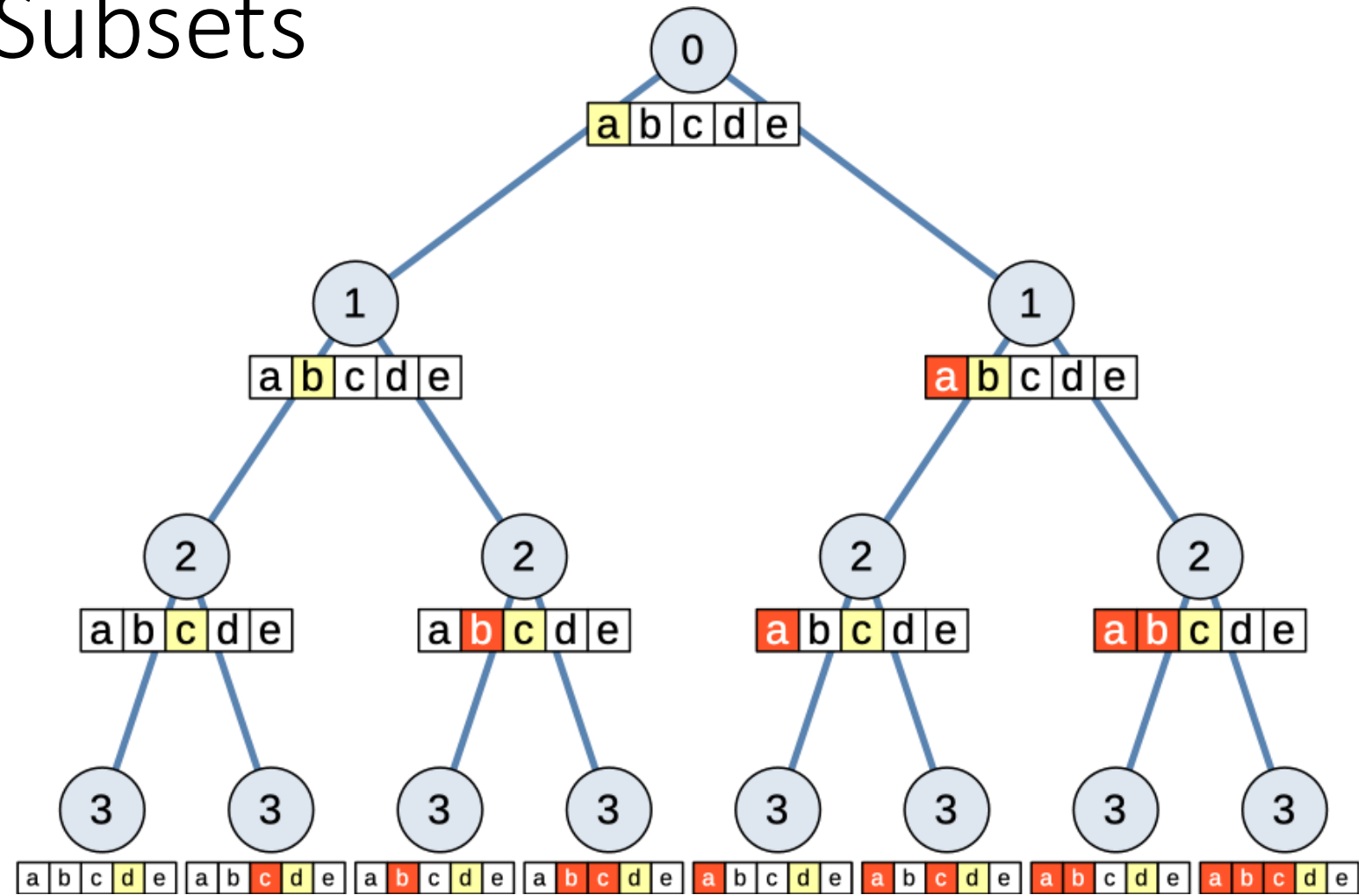
Competitive Programming

Search

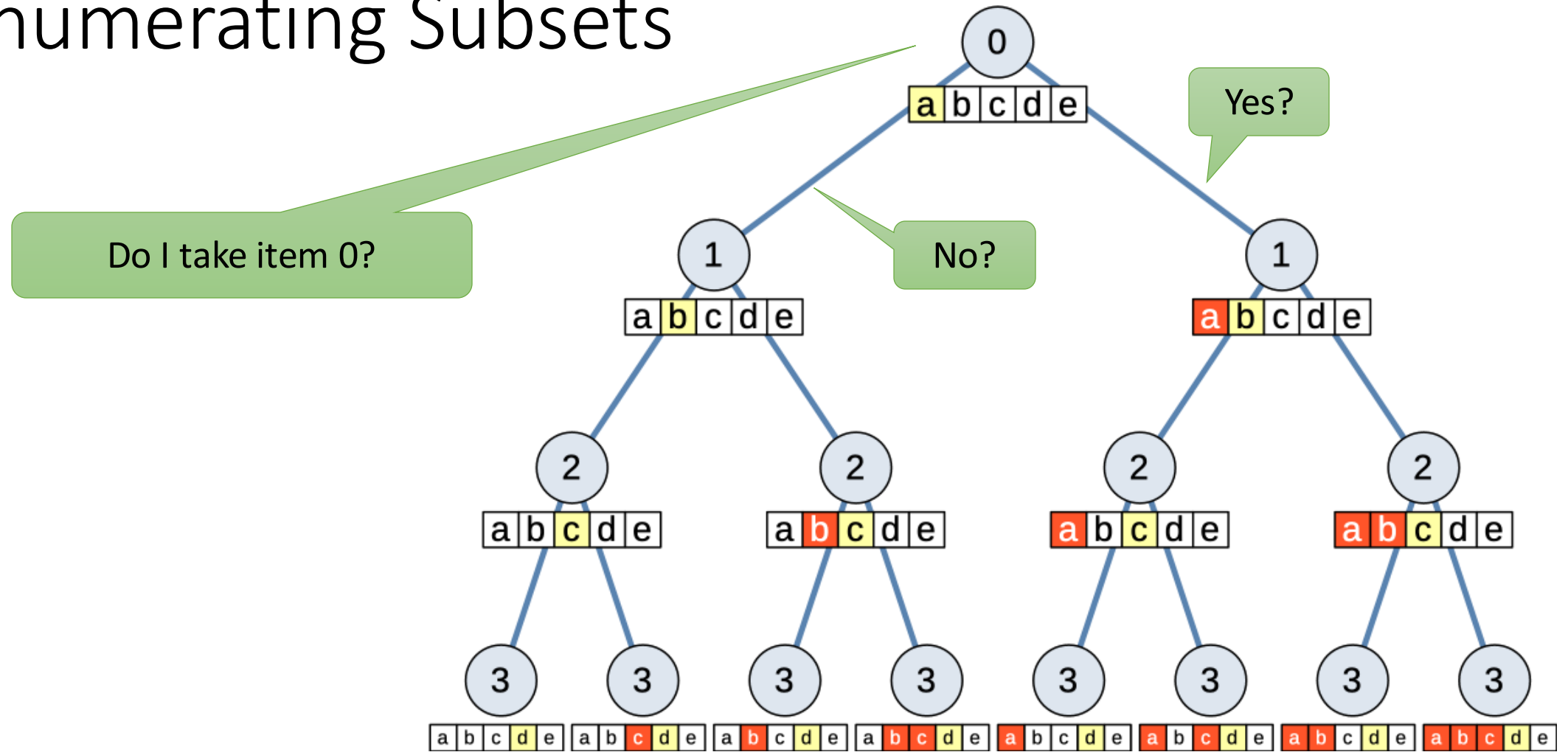
Search

- Considering possible solutions
 - All possible paths through a graph
 - All possible orderings of a sequence
 - All possible subsets of a set
 - All possible perfect matchings
 - ...
- Like graph traversal
 - Implicitly defined graph
 - Typically, too large to be given in the input
 - Maybe too large to store in memory

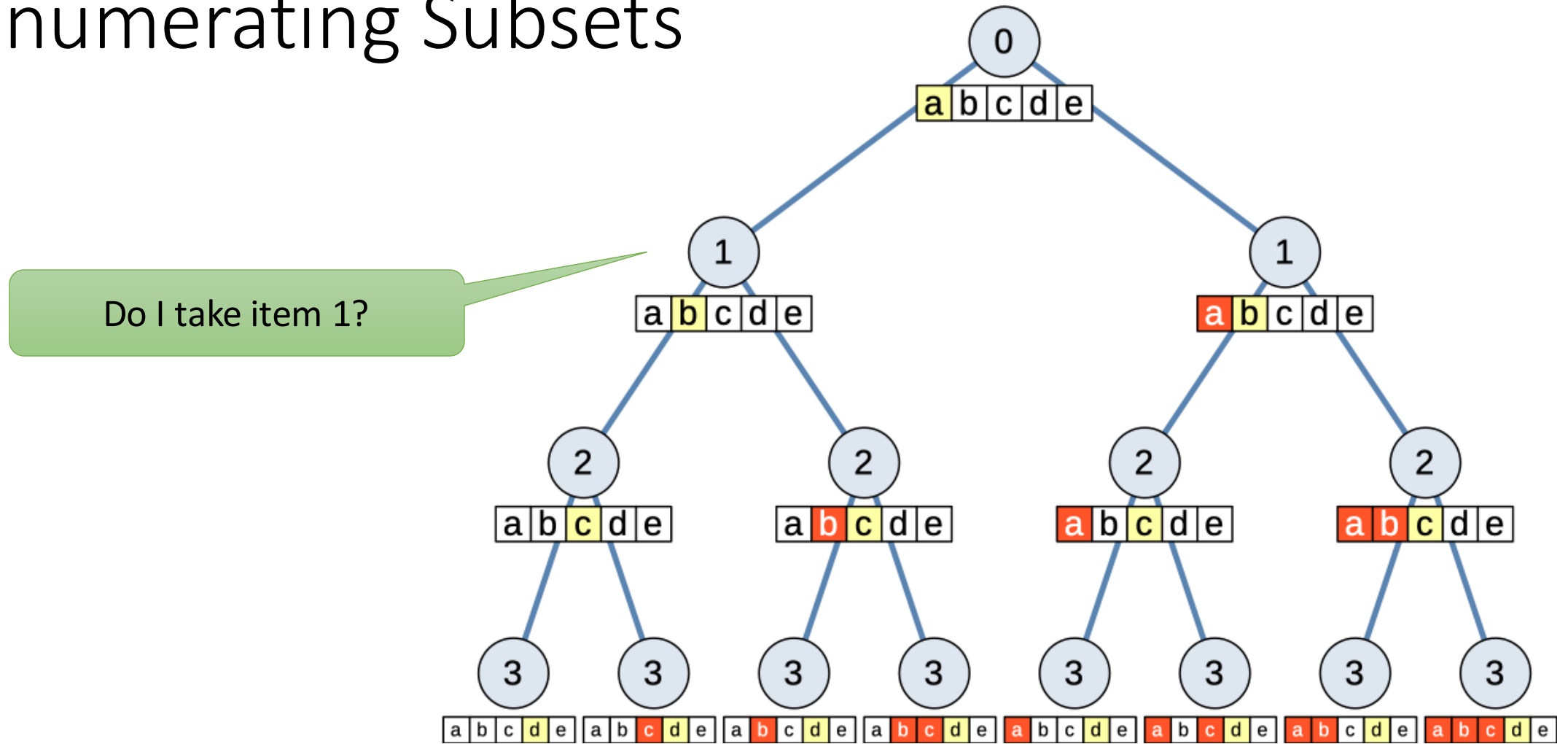
Enumerating Subsets



Enumerating Subsets



Enumerating Subsets



Recursive Search

```
void search( int i, list<int> subset, list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    // Skip element i.  
    search( i + 1, subset, seq );  
  
    // Take element i.  
    subset.add( seq[ i ] );  
    search( i + 1, subset, seq );  
    subset.pop_back();  
}
```

Depth-First Traversal

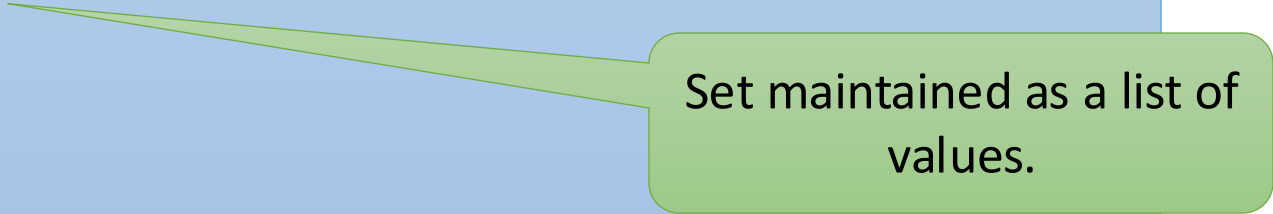
```
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    // Take element i.  
    subset.add( seq[ i ] );  
    search( i + 1, subset, seq );  
    subset.pop_back();  
}
```

This is very easy to code.

Incremental (cheap)
modification of the set.

Recursive Search

```
void search( int i, list<int> subset, list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    // Skip element i.  
    search( i + 1, subset, seq );  
  
    // Take element i.  
    subset.add( seq[ i ] );  
    search( i + 1, subset, seq );  
    subset.pop_back();  
}
```



Set maintained as a list of values.

Subset as a Boolean Array

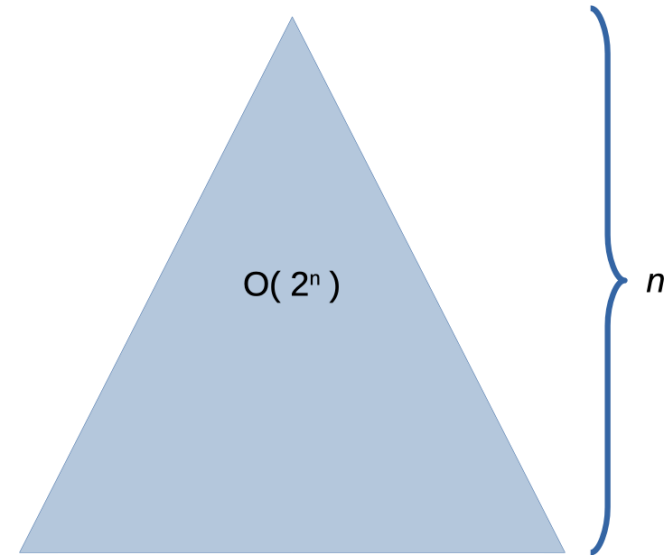
```
void search( int i, bool subset[ n ], list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    // Skip element i.  
    search( i + 1, subset, seq );  
  
    // Take element i.  
    subset[ i ] = true;  
    search( i + 1, subset, seq );  
    subset[ i ] = false;  
}
```

Subset as a Boolean Array

```
void search( int i, int bitmask, list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    // Skip element i.  
    search( i + 1, bitmask, seq );  
  
    // Take element i.  
    search( i + 1, bitmask | ( 1 << i ), seq );  
}
```

Search can be Expensive

- Search space is typically exponential
- Pruning can let us avoid subtrees that can't contain a solution.
- Branch-and-bound can let us skip subtrees that can't contain a solution.



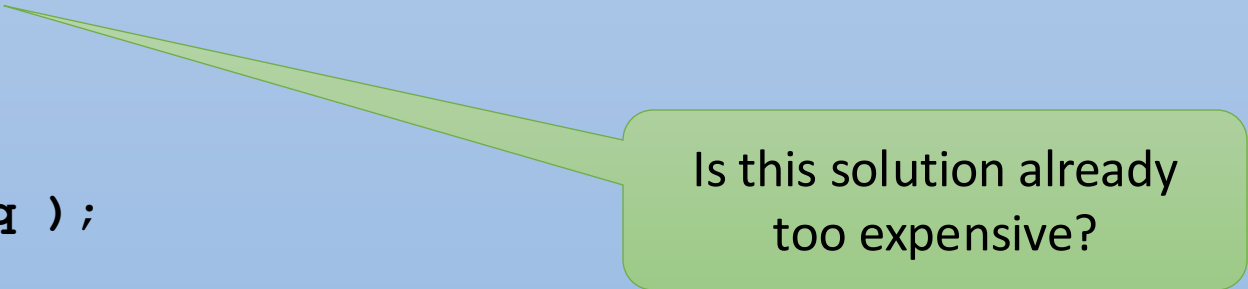
Search Pruning

```
void search( int i, bool subset[ n ], list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    if ( ! validSolution( subset ) )  
        return;  
  
    // Skip element i.  
    search( i + 1, subset, seq );  
  
    // Take element i.  
    subset[ i ] = true;  
    search( i + 1, subset, seq );  
    subset[ i ] = false;  
}
```

Do prior choices violate
the problem constraints?

Branch-and-bound

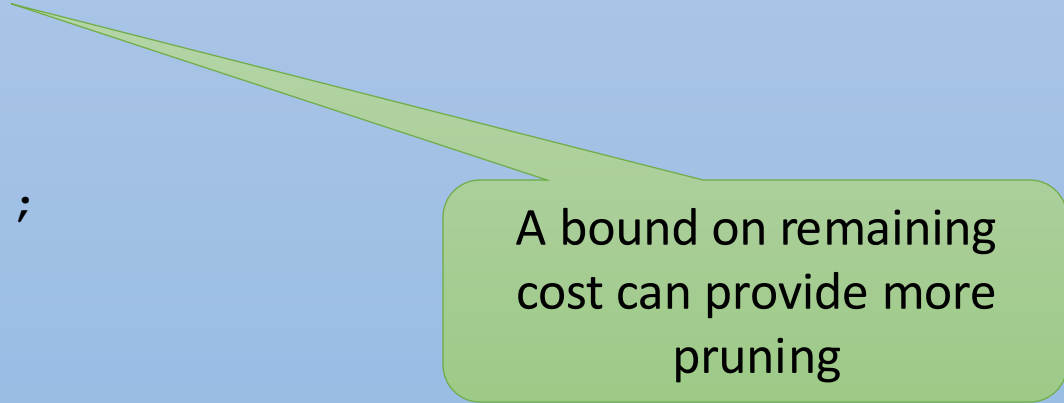
```
void search( int i, int cost, bool subset[ n ], list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    if ( cost >= bestSolution )  
        return;  
  
    // Skip element i.  
    search( i + 1, subset, seq );  
  
    // Take element i.  
    subset[ i ] = true;  
    search( i + 1, subset, seq );  
    subset[ i ] = false;  
}
```



Is this solution already too expensive?

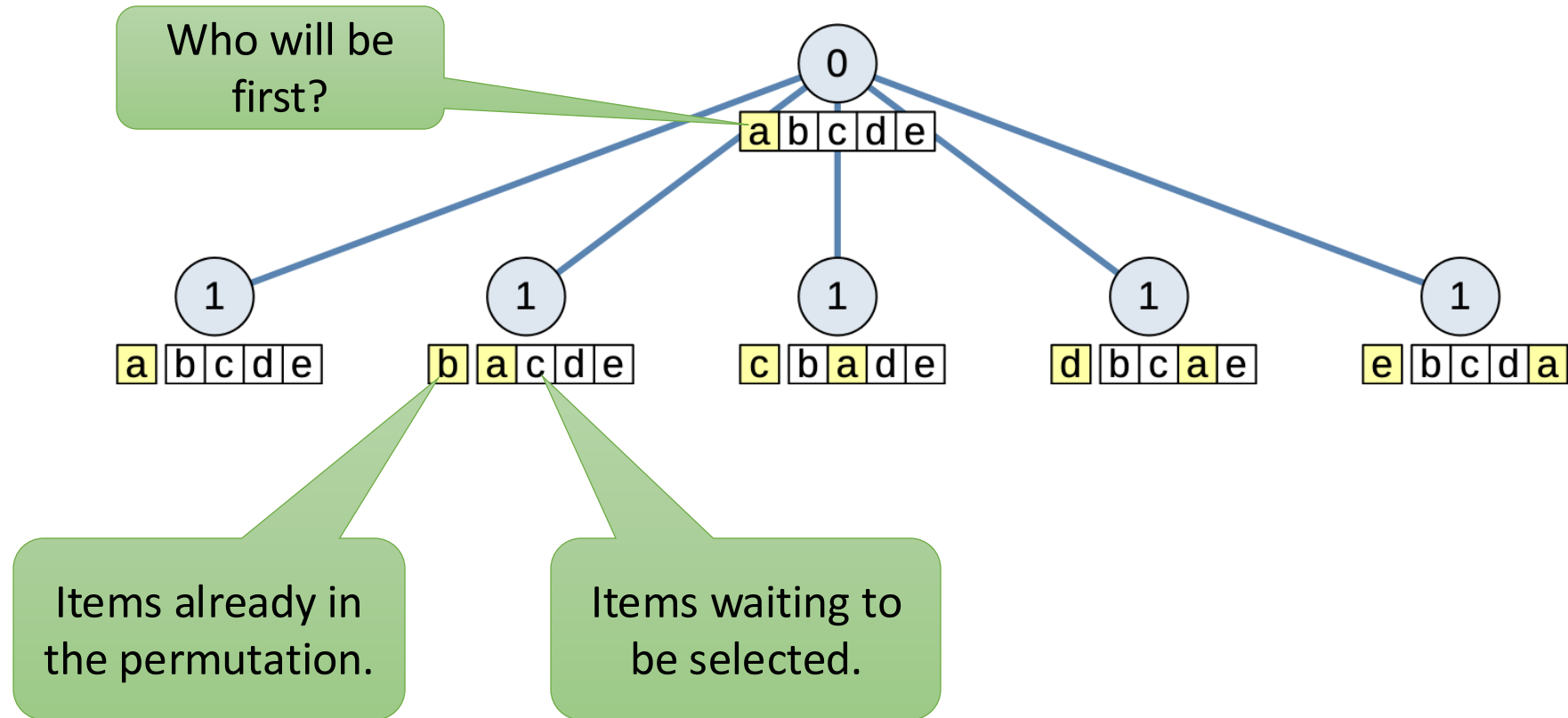
Branch-and-bound

```
void search( int i, int cost, bool subset[ n ], list<int> seq ) {  
    if ( i == n )  
        // is this a solution?  
  
    if ( cost + remainingCostBound( subset ) >= bestSolution )  
        return;  
  
    // Skip element i.  
    search( i + 1, subset, seq );  
  
    // Take element i.  
    subset[ i ] = true;  
    search( i + 1, subset, seq );  
    subset[ i ] = false;  
}
```

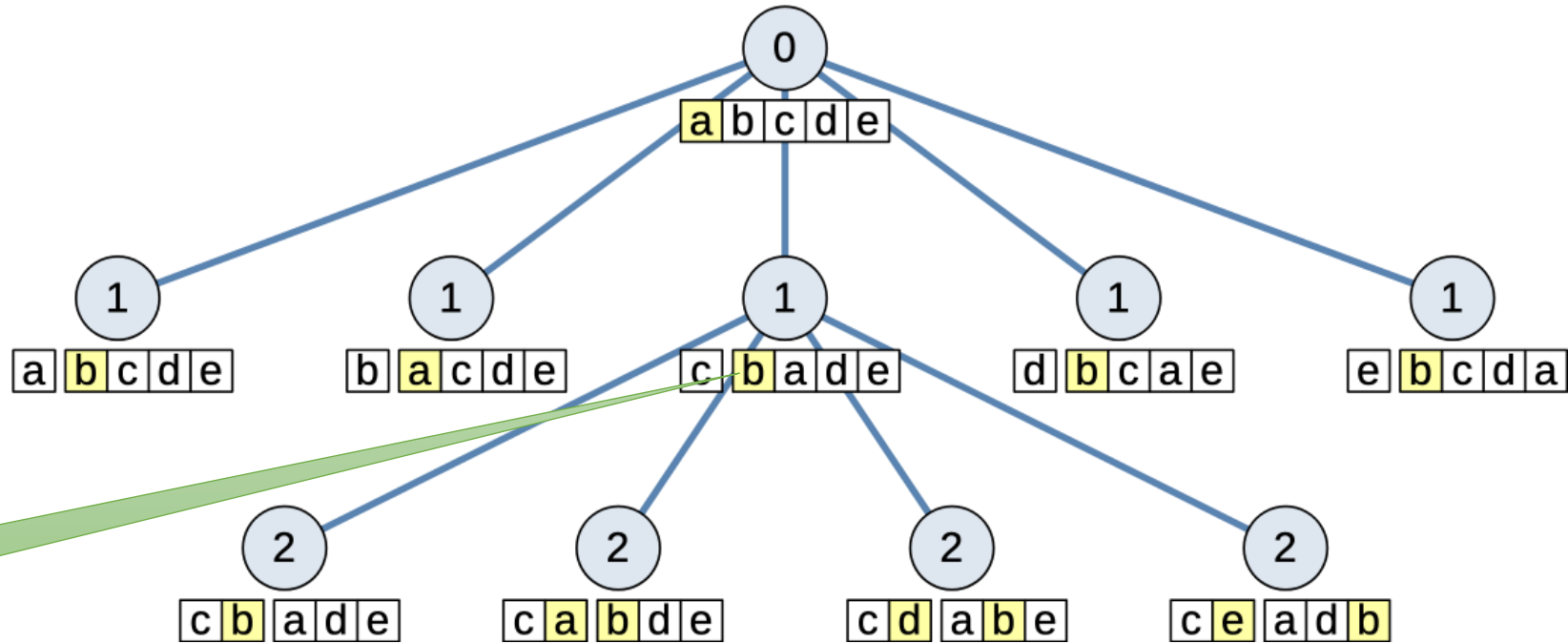


A bound on remaining
cost can provide more
pruning

Enumerating Permutations



Enumerating Permutations



Branch-and-bound

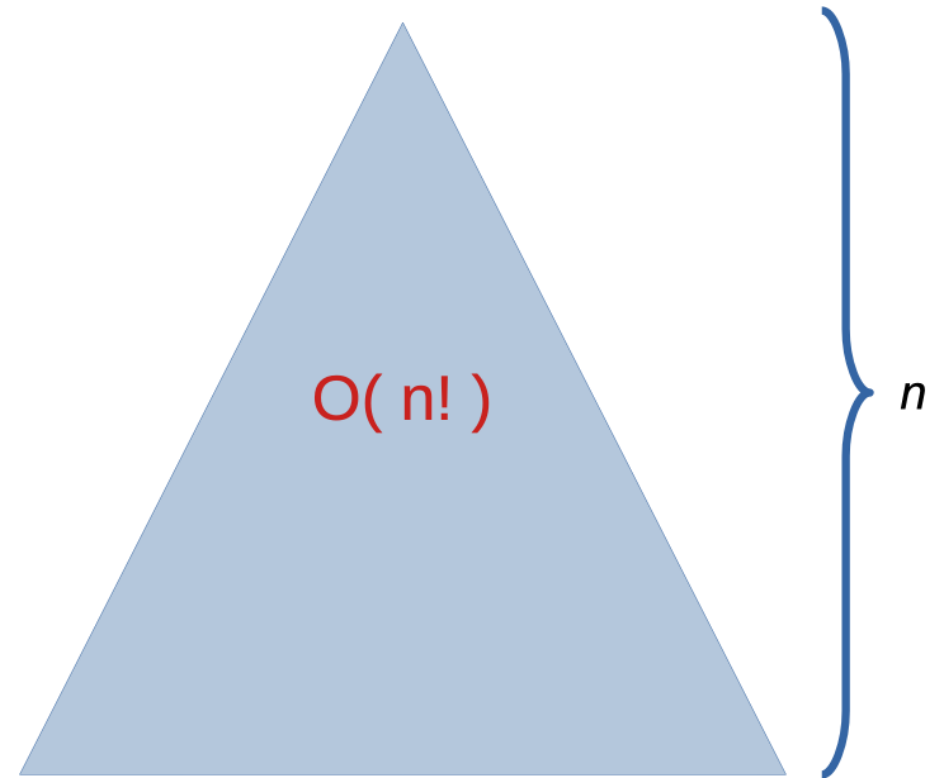
```
void search( int i, list<int> perm ) {  
    if ( i == n )  
        // is this a solution?  
  
    for ( int j = i; j < n; j++ ) {  
        swap( perm[ i ], perm[ j ] );  
        search( i + 1, perm );  
        swap( perm[ i ], perm[ j ] );  
    }  
}
```

Permutation is
maintained in place.

Put the sequence back
like it was.

Expensive!

- All possible permutations is a larger search space.
- Pruning can be even more important.

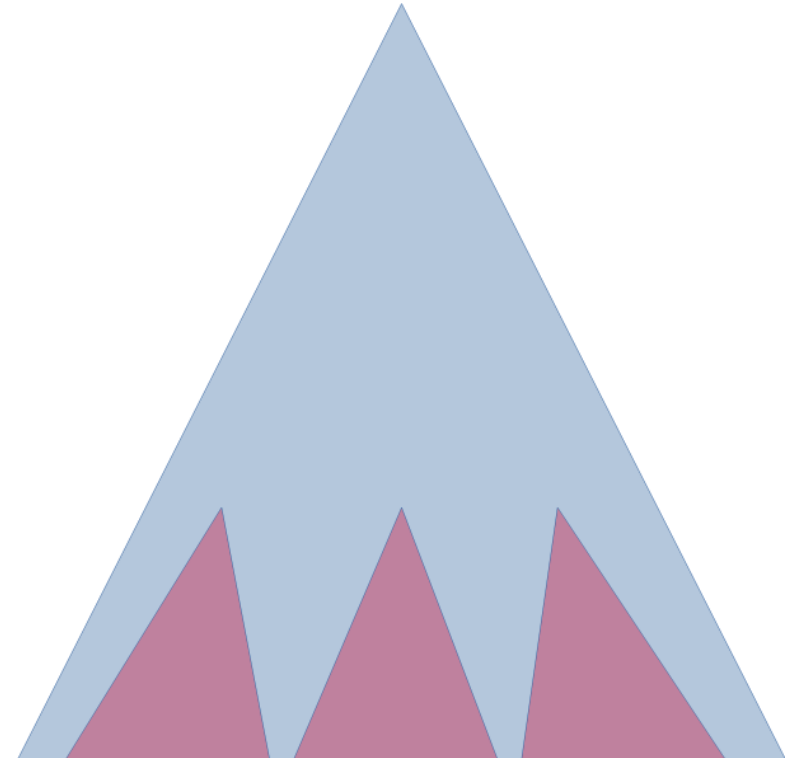


Search Pruning

```
void search( int i, list<int> perm ) {  
    if ( i == n )  
        // is this a solution?  
  
    if ( perm[ 0 ] ... perm[ i - 1 ] can't be a solution )  
        return;  
  
    for ( int j = i; j < n; j++ ) {  
        swap( perm[ i ], perm[ j ] );  
        search( i + 1, perm );  
        swap( perm[ i ], perm[ j ] );  
    }  
}
```

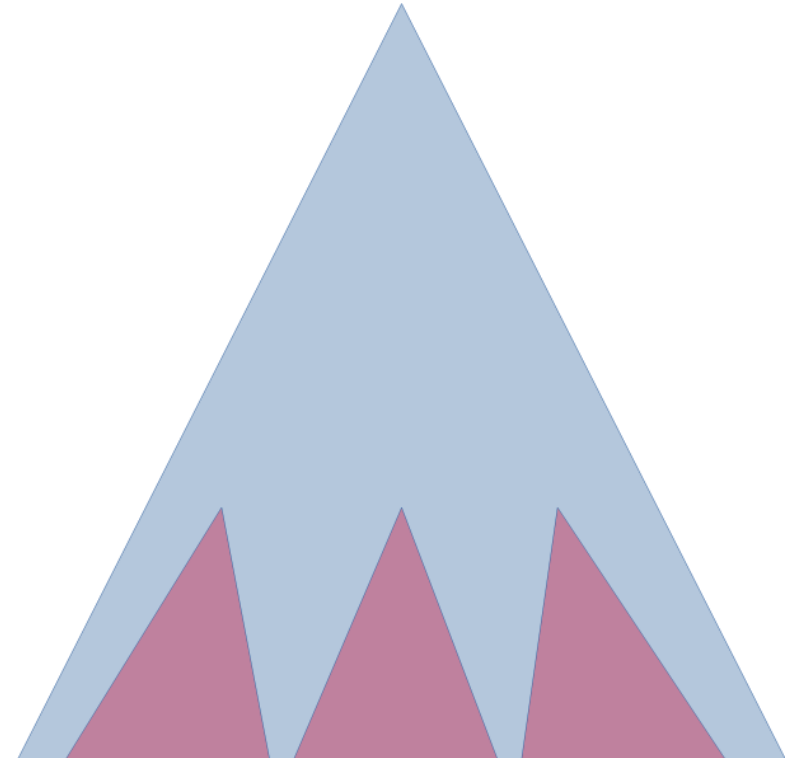
Duplicate Subtrees

- The same subtree can show up more multiple times.
- Caching solutions can avoid duplicate work.
- How do you make a cache for a subset of elements?



Duplicate Subtrees

- The same subtree can show up more multiple times.
- Caching solutions can avoid duplicate work.
- How do you make a cache for a subset of elements?
 - Easy. Use a bit mask as the index.



Subtree Caching

```
void search( int i, int cost, int remaining, list<int> perm ) {
    if ( i == n )
        // is this a solution?

    if ( cache[ remaining ] &&
         cost + cache[ remaining ] is too high )
        return;

    for ( int j = i; j < n; j++ ) {
        swap( perm[ i ], perm[ j ] );
        search( i + 1, cost + ?, remaining ^ perm[ i ], perm );
        swap( perm[ i ], perm[ j ] );
    }

    cache[ remaining ] = ?;
}
```