

[Knu11, Chapter 7.2.1.2]
Generating Permutations

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Outline

Permutations

Algorithm L

Algorithm P

Conclusion



Section 1

Permutations



What is a Permutation

- Given a (multi)set S a permutation is an **ordered** sequence of every item in S



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 - ▶ A set is an unordered collection of distinct items
 - ▶ A multiset allows repeated items
- For n elements there are $n!$ possible permutations
 - ▶ n possibilities for the first item... $n - 1$ for the second... so on



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 - (b) Minimal change between permutations (Gray)



Enumerating Permutations

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- It's nice if algorithms output permutations in either
 - (a) Some sorted order (lexographic)
 - (b) Minimal change between permutations (Gray)
- Our algorithm will be slow in it's entirety, but we want to minimize "delay" between outputs.
 - ▶ We want to achieve $O(1)$ delay between permutations



Section 2

Algorithm L



Lexographic Permutation

- A lexographic permutation of the multiset $\{1,2,2,3\}$:

1223	1232	1322	2123
2132	2213	2231	2312
2321	3122	3212	3221



Lexographic Permutation

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- Let's assume we start a sequence $\{a_1, \dots, a_n\}$ that is sorted, such that $a_1 \leq a_2 \leq \dots \leq a_n$
- We also insert a sentinel a_0 that's smaller than everything.



Algorithm L

ALGORITHM L($S[a_0, \dots, a_n]$):

```
1:  $j \leftarrow n - 1$ 
2: while  $j > 0$ :
3:   PRINT( $S$ )
4:    $j \leftarrow n - 1$ 
5:   while  $S[j] \geq S[j + 1]$ :
6:     decrement  $j$ 
7:   if  $j = 0$ :
8:     continue
9:    $l \leftarrow n$ 
10:  while  $S[j] \geq S[l]$ 
11:    decrement  $l$ 
12:  SWAP( $S[j], S[l]$ )
13:  REVERSE( $S, j + 1, n$ )
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- Otherwise, each iteration of this while loop will print out a permutation.



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- We find the largest j such that a_j can be increased
- Then, we find the smallest amount we can increase a_j by (the search for l).



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- We've generated the prefix a_1, \dots, a_j , but the second half is now a_n, \dots, a_{j+1} , so we reverse it.



Questions?



Questions!

- What is the delay between permutations?
- What is (crudely) the runtime of this algorithm?
- If elements in S are distinct, how often does the decrement j step *not* run?



Section 3

Algorithm P



Gray Permutation

- We want to generate permutations in a way so that only two adjacent elements swap at every iteration



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- This isn't guaranteed to happen in a multiset.

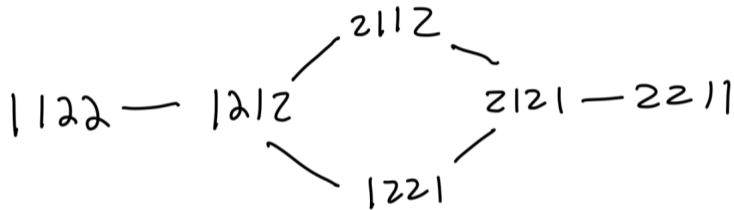


Gray Permutation

- We want to generate permutations in a way so that only two adjacent elements swap at every iteration
- This isn't guaranteed to happen in a multiset.
 - ▶ Consider a graph of permutations, where there are edges between adjacent swaps
 - ▶ We want to find a Hamiltonian path, but multisets can generate graphs where there are none!



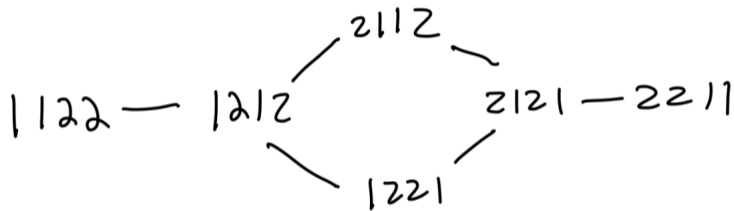
Gray Paths



- No path that covers all nodes



Gray Paths



- No path that covers all nodes
- Luckily, permuting distinct sets is usually what happens most often in practice



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- Inserting 4's in a snaking pattern by column, you have your sequence of permutations

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Algorithm P

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ALGORITHM P( $S[a_0, \dots, a_n]$ ):  
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2: while TRUE:  
3:   PRINT( $S$ )  
4:    $j \leftarrow n, s \leftarrow 0$   
5:   A:  $q \leftarrow C[j] + O[j]$   
6:     if  $q < 0$ : goto D  
7:     if  $q = j$ : goto B  
8:     SWAP( $S, j - C[j] + s, j - q + s$ )  
9:      $C[j] \leftarrow q$   
10:    continue  
11:   B: if  $j = 1$ :  
12:     break  
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14:   D:  $O[j] \leftarrow -O[j], j \leftarrow j - 1$   
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ALGORITHM $\text{MIP}(S[a_0, \dots, a_n])$:

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- We initialize C , which tracks inversions, i.e. the distance a_k is from k in later iterations
- We initialize O which tracks which direction values in C have changed (left or right)
- Every iteration, we print out a permutation



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- We track the coordinate j where $C[j]$ is about to change, such that $0 \leq C[j] < j$ for all j
- s tracks the number of indices k such that $C[k] = k - 1$ where $k > j$



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- We determine q from C and O . If q is less than 0, we switch directions at **D**. If $q = j$ we need to increase s and switch directions, if possible



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- We determine q from C and O . If q is less than 0, we switch directions at **D**. If $q = j$ we need to increase s and switch directions, if possible
- Otherwise, we swap the two relative locations within S and print out a permutation



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- If we need to increase s , we check if $j = 1$ and terminate, then we move to **D** to switch directions
- **D** switches the direction stored in O and decrements j and returns to **A** to try again



Questions?



Section 4

Conclusion



Other interesting algorithms from this chapter:

- Algorithm T: Extends Algorithm P to output an array of transitions, to reuse generating permutations in constant time



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- Algorithm G: A generalized approach to producing permutations when given a group of subsets of S



Other interesting algorithms from this chapter:

- Algorithm T: Extends Algorithm P to output an array of transitions, to reuse generating permutations in constant time
- Algorithm G: A generalized approach to producing permutations when given a group of subsets of S
- Algorithm X: An extension to Algorithm L to generate permutations satisfying some conditions efficiently
 - ▶ It does this by maintaining a linked list of available elements
 - ▶ This is not Algorithm X from last week



*A permutation on the ten decimal digits is simply a 10 digit decimal number in which all digits are distinct. Hence all we need to do is to produce all 10 digit numbers and select only those who digits are distinct. Isn't it wonderful how high speed computing saves us from the drudgery of thinking! We simply program $k + 1 \rightarrow k$ and examine the digits of k for undesirable equalities. This gives us the permutations in dictionary order too!
On second sober thought ... we do need to think of something else.*

— D. H. LEHMER (1957)



Bibliography



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