# Lecture 4 (Enumerative) Combinatorics

- Principles of counting
- Counting possibilities
- Examples
  - In how many ways can we
    - Pick 6 numbers from 1 to 15 so that no two are consecutive?
    - Can 7 balls be placed in 4 boxes, if no box is to be left empty?

# Fundamental Principle of Counting

With m elements  $a_1, ..., a_m$  and n elements  $b_1, ..., b_n$  it is possible to form m x n (ordered) pairs  $(a_i, b_i)$  containing one element from each group

If we have  $n_r$  successive stages/selections/decisions with exactly  $n_k$  choices possible at the k-th step, then we can have a total of

 $N = n_1 n_2 \dots n_r$  different results

#### Example:

3 starters, 4 mains, 2 dessert gives 24 different menus.

4 methods to generate collections (of size k) from a set of n elements:

- 1. Ordered sampling from the set with replacement
- 2. Ordered sampling from the set without replacement
- 3. Taking a combination from the set without replacement
- 4. Taking a combination from the set with replacement

# Ordered sampling with replacement

"order matters, and elements can be drawn more than once"

Draw k elements from the set of n elements by selecting elements one by one:

- This gives an ordered sample of length *k*.
- If each time the selection is taken from the entire set (i.e. the same element can be drawn more than once), then there exist  $N = n^k$  different samples.

Example:

A={a,b,c}. How many words of size 4 can we form?

# Ordered sampling without replacement

"Order matters, elements can be drawn only once", i.e.

- Draw k elements from the set by selecting elements one by one and remove them from the set once they are chosen.
- There exist a total of N =  $(n)_k$  different samples without repetitions, where  $(n)_k = n(n-1) \dots (n-k+1)$

Additional terminology:

- If we select n elements like this we get a permutation of the set.
- A permutation of a set A is an ordered listing of the elements of the set. We represent it as  $a_1 a_2 \dots a_n$ .
- A permutation can be seen as a one-to-one mapping of A onto itself

#### Example:

A = {1, 2, 3} has six permutations 123, 132, 213, 231, 312, 321

### Ordered sampling without replacement

- The total number of different orderings (= permutations) of n elements is: n! (n factorial); Note: 0! =1
- A k-permutation of a set A is an ordered listing of a k-subset of A
- We represent it as  $a_1 a_2 \dots a_k$ , e.g. there are 6 2-permutations of A={1,2,3}: 12, 13, 21, 23, 31, 32
- As we have seen, a set of n elements has (n)<sub>k</sub> = n!/(n-k)!
  k-permutations
- Give the probability of sampling without any repetitions:  $(n)_k/n^k$

| Com                   | binations without replacement                                                                                    |
|-----------------------|------------------------------------------------------------------------------------------------------------------|
| "order do             | bes not matter, elements can be used only once"                                                                  |
| • Take k<br>taking    | elements without minding their order. Without replacement this corresponds to<br>a subset of the set.            |
| Example:<br>A={1,2,3} | . There are 3 such combinations: {1,2}, {2,3}, {1,3}                                                             |
| Define th             | the binomial coefficient (pronounced as "n choose k") as $\binom{n}{k} = \frac{(n)_k}{k!} = \frac{n!}{k!(n-k)!}$ |
| A set of r            | elements has $\binom{n}{k}$ subsets (combinations without repetition) of size k $\leq$ n                         |
| Note: $\binom{n}{0}$  | ) = 1                                                                                                            |
|                       |                                                                                                                  |

#### Combinations with replacement

Order does not matter, and elements can be chosen more than once.

Example: A={a, b, c, d}. Pick 4 elements, e.g. a, a, b, d.

Encode a, a, b, d as 1, 1, /, 1, /, 1 (Go through A, pick one from A (code '1'), or go to next element from A (code '/').) Encode b, c, c, d as /, 1, /, 1, 1, /, 1.

Every selection corresponds to such strings. Strings always have length n+k-1; there are always (n-1) next-symbols, and k 1's.

The total number of combinations with repetition (also knows as bags or multisets) of size k from a set of n elements is:

 $\binom{n+k-1}{n-1} = \binom{n+k-1}{k}$ 

Example: 3 types of pies. In how many ways can we pick 10 pies. (10 + 3 - 1)! / 3! (10 - 1)! = 220

### Bernoulli trials Bernoulli trials process consisting of n experiments: • Each experiment has two possible outcomes, e.g. 0 or 1, success or failure: $\Omega_i = \{0, 1\}, i = 0, ..., n$ • The probability p of success (1) is the same for each experiment; the probability q of failure(0) is 1 – p: $m_i(1) = m_i(S) = p$ $m_i(0) = m_i(F) = q = 1 - p$ Tree: probabilities of outcomes of entire experiment (see figure page 96)

# **Binomial distribution**

Given *n* Bernoulli trials with probability *p* of success on each experiment, the probability of exactly k successes is:

 $b(n, p, k) = \binom{n}{k} p^k q^{n-k}$ 

Explanation:

P(E) with E = { $\omega \mid \omega$  has k successes } P(E) =  $\sum_{\omega \in E} m(\omega)$ 

Using the tree: every path with k successes and n-k failures: m({ k successes, n-k failures }) =  $p^k q^{n-k}$ 

How many such paths are there? n possible trials, k should be successes:  $\binom{n}{k}$ 

If B is a random variable counting the number of successes in a Bernoulli trials process with parameters n and p. Then the distribution m(k) = b(n, p, k) is called the Binomial distribution.

# Binomial distribution

A dice is rolled four times.

What is the probability that exactly one 6 turns up:

 $b(4, \frac{1}{6}, 1) = \binom{4}{1} \cdot \frac{1}{6} \cdot \left(\frac{5}{6}\right)^3$