o2: Combinatorics

Jerry Cain April 3rd, 2024

Lecture Discussion on Ed



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General approach to counting permutations



For each group of indistinct objects, divide by the overcounted permutations.

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Order *n* semidistinct objects $\frac{n!}{n_1! n_2! \cdots n_r!}$

How many letter orderings are possible for the following strings? 1. KIKIRIAFIN 2. K's, 5 I's, me of all others 11. 5.121

2. EFFERVESCENCE 13 letters 2 F's, 5 E's, 2 C's, one ogali others 13! 2! 5! 2!

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Strings

Order *n* semidistinct objects $\frac{n!}{n_1! n_2! \cdots n_r!}$

How many letter orderings are possible for the following strings?

1. KIKIIRIAFIN $=\frac{11!}{5!2!}=166,320$ 2. EFFERVESCENCE $=\frac{13!}{2!5!2!}=12,972,960$



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Unique 6-digit passcodes with four smudges distin

Order *n* semidistinct objects $\frac{n!}{n_1! n_2! \cdots n_r!}$



How many unique 6-digit passcodes are possible if a phone password uses each of **four** distinct numbers?

Two mutually exclusive scenarios:

- One digit repeated three times, other three repeated once
- Two digits repeated twice, other two repeated once



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first scenario: $n_1 = 4 \cdot \frac{6!}{3!} = 480$ 4 ways to choose the digit repeated three times second scenario: $n_2 = 6 \cdot \frac{6!}{2!2!} = 1080$

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Unique 6-digit passcodes with four smudges dist

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first scenario:
$$n_1 = 4 \cdot \frac{6!}{3!} = 48$$

second scenario: $n_2 = 6 \cdot \frac{6!}{2!2!} = 1080$ 6 ways to choose two digits the each appear twice 24, 25, 28, 45, 48, 58

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Unique 6-digit passcodes with four smudges distin

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How many unique 6-digit passcodes are possible if a phone password uses each of **four** distinct numbers?

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first scenario: $n_1 = 4 \cdot \frac{6!}{3!} = 480$ second scenario: $n_2 = 6 \cdot \frac{6!}{2!2!} = 1080$ 1560 such passcodes

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Summary of Combinatorics



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Combinations I

Summary of Combinatorics



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There are n = 20 people. How many ways can we choose k = 5 people to get cake?



1. *n* people get in line

n! ways

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There are n = 20 people. How many ways can we choose k = 5 people to get cake?



n! ways

1 way

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There are n = 20 people. How many ways can we choose k = 5 people to get cake?



n people 2. get in line

. Put first *k* in cake room

n! ways

1 way

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There are n = 20 people. How many ways can we choose k = 5 people to get cake?



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There are n = 20 people. How many ways can we choose k = 5 people to get cake?



get in line

n! ways

in cake room

1 way

1. *n* people 2. Put first *k* 3. Allow cake 4. Allow non-cake

k! different permutations all considered the same group of children

group to mingle group to mingle

(n-k)! different permutations all lead to the same group of children Stanford University 20

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Combinations

A combination is an <u>unordered</u> selection of k objects from a set of n distinct objects.

The number of ways of making this selection is



Overcounted: any ordering of unchosen group is same choice Stanford University 21

Combinations

A combination is an <u>unordered</u> selection of *k* objects from a set of *n* distinct objects.

The number of ways of making this selection is

$$\frac{n!}{k! (n-k)!} = n! \times 1 \times \frac{1}{k!} \times \frac{1}{(n-k)!} = \binom{n}{k} \quad \begin{array}{l} \text{Binomial} \\ \text{coefficient} \end{array}$$
Note:

$$\binom{n}{n-k} = \binom{n}{k} \quad \begin{array}{l} \text{He number of ways to select a group} \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \text{He number of ways to select a group } \\ \end{tabular} \\ \end{tabular} \\ \end{tabular$$

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Probability textbooks

How many ways are there to choose a **subset** of 3 from a set of 6 distinct books? By saying **subset**, we assume order doesn't matter.



Choose k of

n distinct objects





Combinations II

Summary of Combinatorics



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General approach to combinations

The number of ways to choose r groups of n distinct objects such that For all i = 1, ..., r, group i has size n_i , and $\sum_{i=1}^r n_i = n$ (all objects are assigned), is

$$\frac{n!}{n_1! n_2! \cdots n_r!} = \binom{n}{n_1, n_2, \cdots, n_r}$$

Multinomial coefficient

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Datacenters	Ch in	Choose k of n distinct objects $\binom{n}{n_1, n_2, \cdots, n_r}$		
distinct, allfor shable distinguishable all synonyme		Datacenter	# machines	
13 different computers are to be allocated	to	A	M _A = 6	
3 datacenters as shown in the table:		В	n _{g=} 4	
How many different divisions are possible?		С	$n_c = 3$	
ļ	۹.	$\binom{13}{6,4,3} = 60,$	n = 13 060	
Ε	3.	$\binom{13}{6}\binom{7}{4}\binom{3}{3}$	= 60,060	
(С.	$6 \cdot 1001 \cdot 10$	= 60,060	
[Э.	A and B		
E	Ξ.	All of the abov	ve 🐼	
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Datacenters	Ch ir	hoose k of n distinct obj nto r groups of size n_1 ,	ects $\binom{n}{n_1, n_2, \cdots, n_r}$
		Datacenter	# machines
13 different computers are to be allocated 3 datacenters as shown in the table:	to	A	6
		В	4
How many different divisions are possible?		С	3
A E E E	A. 3. 0.	$ \begin{pmatrix} 13\\6,4,3 \end{pmatrix} = 60, \\ \begin{pmatrix} 13\\6 \end{pmatrix} \begin{pmatrix} 7\\4 \end{pmatrix} \begin{pmatrix} 3\\3 \end{pmatrix} \\ 6 \cdot 1001 \cdot 10 \\ A \text{ and } B \\ All of the above$	060 = 60,060 = 60,060
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Datacenters	Cho int	ose k of n distinct obj o r groups of size n_1 , .	ects $\binom{n}{n_1, n_2, \cdots, n_r}$
		Datacenter	# machines
13 different computers are to be allocated	to	А	6
3 datacenters as shown in the table:		В	4
How many different divisions are possible?		С	3
A. $\binom{13}{6,4,3} = 60,060$			
Strategy: Combinations into 3 groups			
Group 1 (datacenter A): $n_1 = 6$			
Group 2 (datacenter B): $n_2 = 4$			
Group 3 (datacenter C): $n_3 = 3$			
$\# divisions = \frac{13!}{6!.4!3!} = 60,060$			

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Datacenters	Choose k of n distinct obj into r groups of size n_1 , .	ects $\binom{n}{n_1, n_2, \cdots, n_r}$
Datacenters13 different computers are to be allocated 3 datacenters as shown in the table:How many different divisions are possible?A. $\begin{pmatrix} 13 \\ 6,4,3 \end{pmatrix} = 60,060$ B.Strategy: Combinations into 3 groupsStrategy:Group 1 (datacenter A): $n_1 = 6$ 1.Group 2 (datacenter B): $n_2 = 4$ 3.Group 3 (datacenter C): $n_3 = 3$ 1.	into r groups of size n_1 , . Datacenter to A B C $\binom{13}{6}\binom{7}{4}\binom{3}{3} =$ itegy: Product rule with Choose 6 computers 7 Choose 4 computers 7 Choose 3 computers 7 Choose 4 computers 7 Choose 4 computers 7 Choose 3 computers 7 Choose 4 computer 7	$\begin{array}{c} & n_r & (n_1, n_2, \cdots, n_r) \\ \hline \# \text{ machines} \\ & 6 \\ & 4 \\ & 3 \\ \hline 60,060 \\ n \text{ 3 steps} \\ \text{for A} & \begin{pmatrix} 13 \\ 6 \end{pmatrix} \\ \text{for B} & \begin{pmatrix} 7 \\ 4 \end{pmatrix} \\ \text{for C} & \begin{pmatrix} 3 \\ 3 \end{pmatrix} \\ \hline \frac{13!}{6! 4! 3!} \\ \hline \end{bmatrix}$
Lisa Yan, Chris Piech, Mehran Sahami, and Jerry Cain, CS1	L09, Spring 2024	$= \begin{pmatrix} 13 \\ 6, 4, 3 \end{pmatrix}$ Stanford University 30

Datacenters	Choose k of n distinct obj into r groups of size n_1 ,	ects $\binom{n}{n_1, n_2, \cdots, n_r}$
13 different computers are to be allocated 3 datacenters as shown in the table: How many different divisions are possible? A. $\binom{13}{6,4,3} = 60,060$ B. Strategy: Combinations into 3 groups Strategy: Group 1 (datacenter A): $n_1 = 6$ 1. Group 2 (datacenter B): $n_2 = 4$	Datacenter to A B C $\binom{13}{6}\binom{7}{4}\binom{3}{3} =$ ategy: Product rule with Choose 6 computers 7 Choose 4 computers 7	# machines 6 4 3 60,060 a 3 steps for A $\binom{13}{6}$ for B $\binom{7}{4}$
Group 3 (datacenter C): $n_3 = 3$	Choose 3 computers	for C $\binom{3}{3}$
Vour opproach	a will data keaina if yay	

Your approach will determine if you use binomial/multinomial coefficients or factorials.

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Probability textbooks

1. How many ways are there to choose 3 books from a set of 6 distinct books?

$$\binom{6}{3} = \frac{6!}{3! \, 3!} = 20$$
 ways

Choose k of

n distinct objects

2. Two are by the same author. What if we don't want to choose both?

A.
$$\binom{6}{3} - \binom{6}{2} = 5$$
 ways
 D. $\binom{6}{3} - \binom{4}{1} = 16$

 B. $\frac{6!}{3!3!2!} = 10$
 E. Both C and D

 C. $2 \cdot \binom{4}{2} + \binom{4}{3} = 16$
 F. Something else



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Probability textbooks

Choose k of n distinct objects $\begin{pmatrix} \gamma \\ k \end{pmatrix}$

1. How many ways are there to choose 3 books from a set of 6 distinct books?

 $\binom{6}{3} = \frac{6!}{3!3!} = 20$ ways

2. Two are by the same author. What if we don't want to choose both?



Probability textbooks *n* distinct objects How many ways are there to choose 3 books $\binom{\circ}{3} = \frac{\circ!}{3! \, 3!} = 20$ ways from a set of 6 distinct books? Two are by the same author. What if we don't want to choose both? $\binom{6}{3} - \binom{4}{7}$ absencer 15 Strategy 2: "Forbidden method" count number of illegal subsete Woolf Woolf A B C D Ke choose just one > => (4) Forbidden method: It is sometimes easier to exclude invalid cases than to account for all valid cases.

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Choose k of

Buckets and The Divider Method

Summary of Combinatorics



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Balls and urns Hash tables and distinct strings

How many ways are there to hash n distinct strings to r buckets?



Steps:

- 1. Bucket 1^{st} string $\rightarrow r$ choices
- 2. Bucket 2nd string -> r choices
- *n*. Bucket n^{th} string $\rightarrow r$ chrices

 r^n outcomes

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Summary of Combinatorics



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Servers and indistinct requests

How many ways are there to distribute n indistinct web requests to r servers?



Goal

Server 1 has x_1 requests, Server 2 has x_2 requests,

Server *r* has x_r requests (the rest)

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Bicycle helmet sales

How many ways can we assign n = 5 indistinct children to r = 4 distinct bicycle helmet styles?



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Bicycle helmet sales

1 possible assignment outcome:

Goal Order *n* indistinct objects and r - 1 indistinct dividers.



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How many ways can we assign n = 5 indistinct children to r = 4 distinct bicycle helmet styles?

Goal Order *n* indistinct objects and r - 1 indistinct dividers.

O. Make objects and dividers distinct



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How many ways can we assign n = 5 indistinct children to r = 4 distinct bicycle helmet styles?

Goal Order *n* indistinct objects and r - 1 indistinct dividers.

0. Make objects and dividers distinct



1. Order n distinct objects and r - 1distinct dividers

$$(n + r - 1)!$$

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How many ways can we assign n = 5 indistinct children to r = 4 distinct bicycle helmet styles?

Goal Order *n* indistinct objects and r - 1 indistinct dividers.

0. Make objects and dividers distinct



- 1. Order n distinct objects and r - 1distinct dividers
- 2. Make *n* objects indistinct



 $\frac{1}{n!}$

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How many ways can we assign n = 5 indistinct children to r = 4 distinct bicycle helmet styles?

Goal Order *n* indistinct objects and r - 1 indistinct dividers.

0. Make objects and dividers distinct



1. Order n distinct objects and r - 1distinct dividers

2. Make *n* objects indistinct



3. Make r - 1 dividers indistinct

1

(r-1)!





The divider method

The number of ways to distribute n indistinct objects into r buckets is

equivalent to the number of ways to permute n + r - 1 objects such that n are indistinct objects, and

r-1 are indistinct dividers:

Total =
$$(n + r - 1)! \times \frac{1}{n!} \times \frac{1}{(r-1)!}$$

= $\binom{n + r - 1}{r - 1}$ outcomes

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buckets are distinct and ordered

Venture capitalists

Divider method $\binom{n+r-1}{r-1}$ (*n* indistinct objects, *r* buckets)

You have \$10 million to invest in 4 companies (in units of \$1 million).

- 1. How many ways can you fully allocate your \$10 million?
- 2. What if you want to invest at least \$3 million in company 1?
- 3. What if you don't have to invest all your money?



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Venture capitalists. #1



You have \$10 million to invest in 4 companies (in units of \$1 million).

1. How many ways can you fully allocate your \$10 million?



Venture capitalists. #2

Divider method $\binom{n+r-1}{r-1}$ (*n* indistinct objects, *r* buckets)

You have \$10 million to invest in 4 companies (in units of \$1 million).

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Venture capitalists. #3

Divider method $\binom{n+r-1}{r-1}$ (*n* indistinct objects, *r* buckets)

You have \$10 million to invest in 4 companies (in units of \$1 million).

- 1. How many ways can you fully allocate your \$10 million?
- What if you want to invest at least \$3 million in company 1?

What if you don't have to invest all your money?



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Summary of Combinatorics



Combinatorial Proofs

Combinatorial Proofs

A **combinatorial proof**—sometimes called a **story proof**—is a proof that counts the same thing in two different ways, forgoing any tedious algebra.

Combinatorial proofs aren't as formal as CS103 proofs, but they still need to convince the reader something is true in an absolute sense.

An algebraic proof of, say, $\binom{n}{k} = \binom{n}{n-k}$ is straightforward if you just write combinations in terms of factorials.

A combinatorial proof makes an identity like $\binom{n}{k} = \binom{n}{n-k}$ easier to believe and understand *intuitively*.

Combinatorial Proof:

Consider choosing a set of k CS109 CAs from a total of n applicants. We know that there are $\binom{n}{k}$ such possibilities. Another way to choose the k CS109 CAs is to **disqualify** n – k applicants. There are $\binom{n}{n-k}$ ways to choose which n – k don't get the job. Specifying who is on CS109 course staff is the same as specifying who isn't. That means that $\binom{n}{k}$ and $\binom{n}{n-k}$ must be counting the same thing.

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Combinatorial Proofs

Let's provide another combinatorial proof, this time proving that

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

This is easy to prove algebraically (provided k and n are positive integers, with $k \le n$). A combinatorial/story proof, however, is more compelling!

Combinatorial Proof:

Consider n candidates for college admission, where k candidates can be accepted, and precisely one of the k is selected for a full scholarship. We can first choose the lucky recipient of the full scholarship and then select an additional k – 1 applicants from the remaining n – 1 applicants to round out the set of admits. Or we can select which k applicants are accepted and then choose which of those k gets the full ride.

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