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# finding things out

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## problems:

- ① seeing through randomness
- ② knowing when you have

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# solutions

- ① seeing through randomness:
  - ✓ large numbers
  - ✓ averaging
  
- ② knowing when you have
  - ✓ measuring variability
  - ✓ statistical significance

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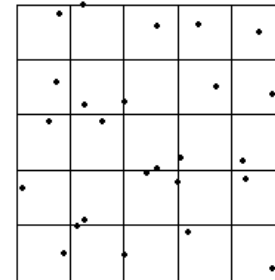
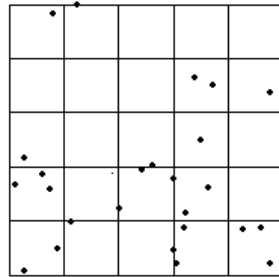
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# large numbers

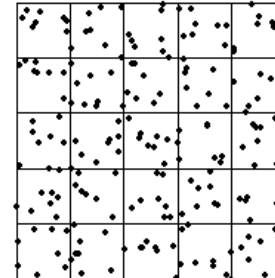
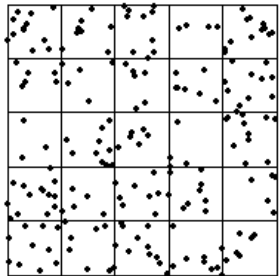
really random

too uniform

25 drops



200 drops



- more drops  $\Rightarrow$  less difference

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# summing

- add up several races
- some random effects cancel
- overall difference:  
    large:  $83-76 = 7$
- proportionate difference:  
    small:  $7/83 < 10\%$
- average scores close:  
     $8.3-7.6 = 0.7$

<u>heads</u>	<u>tails</u>
5	10
10	7
8	10
10	4
10	7
9	10
10	3
10	5
6	10
5	10
<u>83</u>	<u>76</u>

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# fairness and independence

- fairness:  
each outcome has same probability  
i.e. probability of head =  $1/2$
- independence:  
each toss has same probability

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# fairness affects average

- number of heads  $\approx n \times \text{prob}(\text{head})$
- but not exact . . .  
    . . . the world is very random

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# unbiased coin

10 series of 20 tosses,  $\text{prob}(\text{head})=0.5$ :

1:	T T T H H H T H H H T H H H T T H T H H	12
2:	H T T T T H T H H H T H H T T H H T H H	11
3:	H H T T T T T H H T T H H T H H T H T T	9
4:	T H T T T H H H H H T H T H H T H H H H	13
5:	H T T T T H T T T H H T H H H H T T T T	8
6:	T T T T H T T T H H H H T T H T T T H H	8
7:	T T T T H H H T T H T H T H T H H T T T	8
8:	T H H H T H T T H H T H T H H T H T T H	11
9:	H T T T T T T T T H H T T T H T H H H H	8
10:	H H H T T H H H H T T T H H T H T T T H	11
	average	<hr/> 9.9 $\sigma = 1.9$

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# biased coin

prob(head) = 0.8:

1:	HHHHHHHHHHHTHHHHHHHHHTH	18
2:	THHTHHHHHHHHHHHHHHHH	17
3:	TNNHTHTHHHHHHHHHHHHHT	16
4:	HTHHHHHHHHHHHTHHHHHTHHH	17
5:	HHHTHHHHHHHHHHHHHTHHH	18
6:	HHHTHHHHHTHHHTHTHHHHHT	15
7:	HTTTHTHTHHHHHTHTHHHH	13
8:	HHTTHTHTHHHHHTHHHTTHTH	12
9:	HHHHHHHHHHHHHHHHHTHHH	19
10:	HTHHHHHHHHHHHHHHHTHHHH	18
	average	<hr/> 16.3 $\sigma = 2.3$



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# independence affects variability

- independence: context doesn't matter  
e.g.  $\text{prob}(\text{head after head}) = \text{prob}(\text{head after tail})$
- positive correlation:  
things vary together  
e.g.  $\text{prob}(\text{head after head}) > \text{prob}(\text{head after tail})$
- negative correlation:  
things vary in opposite way  
e.g.  $\text{prob}(\text{head after head}) < \text{prob}(\text{head after tail})$

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# positive correlation

$p(H) = p(T)$ , but  $p(H \text{ after } H) > p(H \text{ after } T)$

1:	HTTTTTTTTTTTTTTTTTTT	1
2:	TTHHHHHHTHHHHHHHTHHTTT	13
3:	HHHHHTTTHHHHHHTTHTTTHH	14
4:	HTHHTTTHHHHHHHHHHHHTT	15
5:	HHHHHTHHHTTTTTTTTTTTT	9
6:	TTHTTTTTTHTHHHTTHHHH	9
7:	TTTTTTTTTHTTHTTTTTTTT	2
8:	HHHHHTTTTTTTTTTTTTTHH	7
9:	TTTTTHTHHHHHHHHHTHTHH	12
10:	HHHHHHHTTTTHHHHTTHTH	14
	average	<hr/> 9.6 $\sigma = 5.0$

- long runs of heads and tails
- high variability of head count

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# negative correlation

$p(H) = p(T)$ , but  $p(H \text{ after } H) < p(H \text{ after } T)$

1:	TTHHTHHTHHTHTHTTHTH	10
2:	TTHHTHTHTHTTHTHHTHHT	10
3:	HTHTTHHTTHTHTHTHTHTH	10
4:	THTHHTTHTHTTHTHTHTTH	9
5:	HTHTHTHTHTHHTTHTTHT	10
6:	THTHHTTHTHTHTHTHTHTH	10
7:	TTHHTTHTHTHTHTHTHTHH	10
8:	HTHTHTTHTHHTTHTTTHHHT	10
9:	HHHTHHHTHTHTTTHHHTHHT	13
10:	THHHHTHTTHTTTHHTTHTHT	10
	average	<hr/> 10.2 $\sigma = 1.0$

- alternating heads and tails
- low variability of head count