

6	9	13	7
12	10	5	
3	1	4	14
15	8	11	2

Mathematics for Computer Science
MIT 6.042J/18.062J

Sampling & Confidence



Albert R Meyer, May 13, 2013

confidence.1

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Pairwise Independent Sampling

Theorem:

Let R_1, \dots, R_n be pairwise independent random vars with the same finite mean μ and variance σ^2 . Let

$A_n ::= (R_1 + R_2 + \dots + R_n) / n$. Then

$$\Pr[|A_n - \mu| > \delta] \leq \frac{1}{n} \left(\frac{\sigma}{\delta} \right)^2$$




Albert R Meyer, May 13, 2013

6	9	13	7
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Sampling



coliform count in Charles River
for swimming 
EPA requires
average CMD < 200
(Coliform Microbial Density)



Albert R Meyer, May 13, 2013

confidence.3

6	9	13	7
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Sampling Questions



Make 32 measurements
of CMD at random
times and locations



Albert R Meyer, May 13, 2013

confidence.4

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Sampling Questions



A few of the 32 counts turn out to be > 200 but their average is 180. Convince the EPA that avg in whole river is < 200 ?



Albert R Meyer,

May 13, 2013

confidence.5

6	9	13	7
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Sampling Questions



That is, convince EPA that the estimate based on 32 samples is within 20 of the actual average?



Albert R Meyer,

May 13, 2013

confidence.6

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Sampling parameters



c ::= actual average CMD in river
 CMD sample \leftrightarrow ran var with $\mu = c$
 n samples \leftrightarrow n mutually indep
 ran vars with $\mu = c$
 A_n ::= avg of the n CMD samples



Albert R Meyer,

May 13, 2013

confidence.7

6	9	13	7
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Pairwise Independent Sampling

$$\Pr[|A_n - \mu| > \delta] \leq \frac{1}{n} \left(\frac{\sigma}{\delta} \right)^2$$

$$n = 32, \quad \mu = c, \quad \delta = 20$$



Albert R Meyer,

May 13, 2013

confidence.8

6	9	13	7
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Pairwise Independent Sampling

$$\Pr[A_{32} - c | > 20] \leq \frac{1}{32} \left(\frac{\sigma}{20} \right)^2$$

$$n = 32, \quad \mu = c, \quad \delta = 20$$

?? don't know σ



Albert R Meyer,

May 13, 2013

confidence.9

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Bound for σ

$$\Pr[A_{32} - c | > 20] \leq \frac{1}{32} \left(\frac{\sigma}{20} \right)^2$$

$$n = 32, \quad \mu = c, \quad \delta = 20$$

suppose L is max possible
difference of samples

$$\text{worst } \sigma = \frac{L}{2} = 50$$



Albert R Meyer,

May 13, 2013

confidence.10

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Pairwise Independent Sampling

$$\Pr[A_{32} - c | > 20] \leq \frac{1}{32} \left(\frac{25}{20} \right)^2 < 0.05$$

$$\Pr[|A_{32} - c| \leq 20] > 0.95$$



Albert R Meyer,

May 13, 2013

confidence.11

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Confidence –not Probable Reality

tempting to say:

~~"the probability that~~

~~$c = 180 \pm 20$~~

~~is at least 0.95"~~

--technically wrong!



Albert R Meyer,

May 13, 2013

confidence.12

6	9	13	7
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Confidence

c is the **actual** average in the river.

c is **unknown**, but **not** a random variable!



Albert R Meyer,

May 13, 2013

confidence.13

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Confidence

The possible outcomes of our **sampling process** is a random variable. We can say that the "**probability** that our **sampling process** will yield an average that is ± 20 of the true average at least **0.95**"



Albert R Meyer,

May 13, 2013

confidence.14

6	9	13	7
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Confidence

Tell the EPA that with probability **0.95** our **estimate method** for avg CMD will be within **20** of the actual avg, c , in the river.



Albert R Meyer,

May 13, 2013

confidence.15

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Confidence

For simplicity we say that

$c = 180 \pm 20$ at the **95% confidence level**



Albert R Meyer,

May 13, 2013

confidence.17

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Confidence

Moral: when you are told that some fact holds at a **high confidence level**, remember that a random experiment lies behind this claim. Ask yourself **"what experiment?"**



Albert R Meyer,

May 13, 2013

confidence.18

6	9	13	7
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Confidence

Moral: Also ask "Why am I hearing about this particular experiment? How many others were tried and not reported?"

See <http://xkcd.com/882/>



Albert R Meyer,

May 13, 2013

confidence.19