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Sp 16
L3.1
E17

- 1) Normal distributions - PDFs & the Gaussian.
- 2) SDOM - standard deviation of the mean
- ~~3) weighted averages~~

3) Lab 2 Brownian Motion or Country Statistics

1) typically ^{plan for} ~~with~~ N measurements of same thing for an experiment.
 (then we might change a variable and go again, that's later)

$$x_1, x_2, x_3, \dots, x_N$$

→ our goal, then, is to develop a "best estimate" & "best width estimate" from these N

big picture
where we
we going?

We start our statistical analysis process by assuming our distribution of measures x_i has a well-defined mean & standard deviation \bar{x} & σ .

Thus the central limit theorem says that M sets of these N measures would be "normal", \Rightarrow

~~Look at subonline & 2 results~~

~~first will look at 1) increasing precision~~

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F(7)
3.2

a) consider distribution of \bar{x} measurement

26, 29, 26, 28, 27, 29, 25, 26, 25

want to look at the distribution, so we

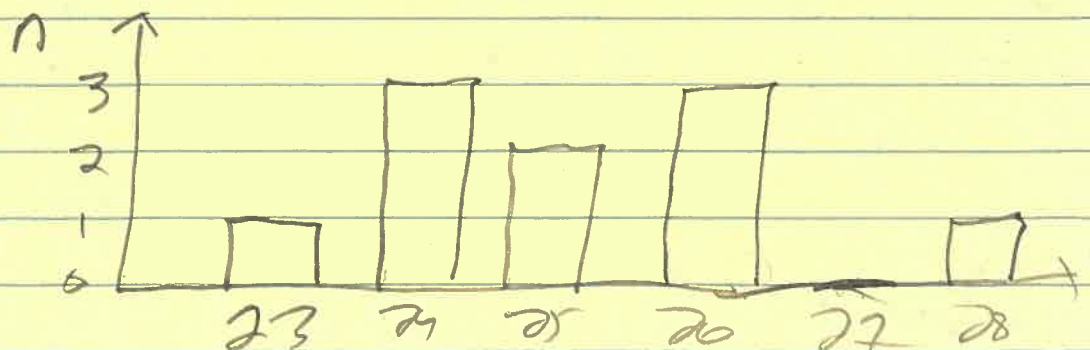
i) sort the numbers

23, 24, 24, 24, 25, 25, 26, 26, 27, 28

ii) count

23	24	25	26	27	28
1	3	2	3	1	1

iii) plot frequency of occurrence



3π
F(17)
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iv) represent as mean

$$\bar{x} = \frac{\sum x_i}{N} = \frac{\sum_{j=1}^m n_j x_j}{\sum n_j} (=N)$$

- j ranges over bins
- x_j value of bin
- n_j # in bin

v) could write $f_j = \frac{n_j}{N}$

$$\Rightarrow \bar{x} = \sum_j f_j x_j$$

b) aside about real world "bin widths"

normally measure real number with some accuracy, say 0.1 units

distribution of
50 measure looks instead like the
[already ordered]

23.7, 23.8, 23.9, 23.9, 27.6, etc

~~~~~  
0.1    0.1    0.0    0.7

look

at  
spaces  
in data

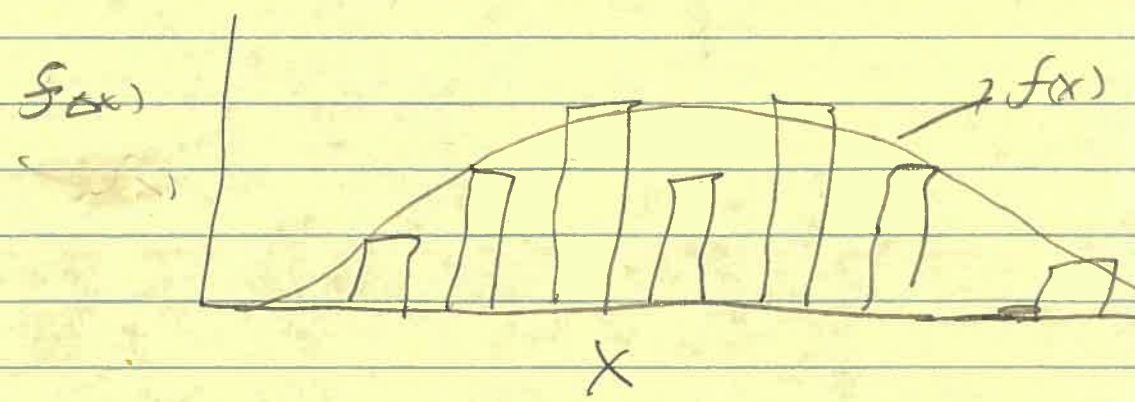
pick some reasonable average of gaps  
or "bin widths"

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~~4-17-20~~  
 6-2-21

(i) were working towards a statistical description of data distribution

$f(x)$  a probability distribution-fn  
 (it is data dependent)

so will start from



limit as  $\Delta x \rightarrow 0, N \rightarrow \infty$  is  $f(x)$

$\rightarrow$  then  $f(x) dx$  is the <sup>fraction</sup> fraction of samples between  $x$  and  $x+dx$

or more properly formally

$$\int_a^b f(x) dx = \text{fraction of samples between } a \text{ + } b$$

d) need to normalize s.t.

$$\int f(x) dx = 1$$

3.5  
 12.5  
 3.5

e) now, with our  $f(x)$  properly normalized we can state that:

these two things define our data distribution somewhat well

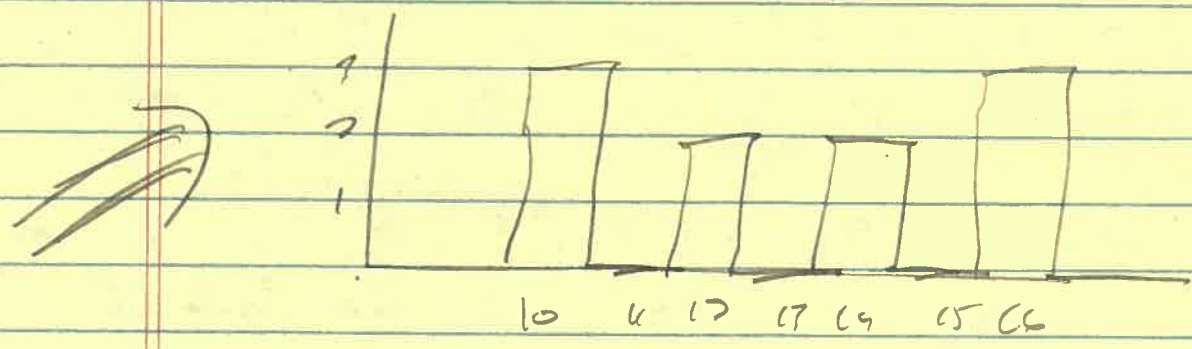
i)  $\bar{x} = \int_{-\infty}^{\infty} x f(x) dx$  "expectation value"

ii)  $\sigma^2 = \int_{-\infty}^{\infty} (x - \bar{x})^2 f(x) dx$  "variance"

f) Central Limit Theorem

Step

Start with any distribution with well-defined mean and variance



can set a sample size  $N$

and take  $N$  samples (examples) of above

set  $N=4 \Rightarrow [10, 10, 14, 16] \Rightarrow \bar{x}_i = 12.5$

keep doing this, then plot freq. dist of examples

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3.2

get something that looks like a "normal distribution"

further, if we increase sample size  $N$  and look at freq-distr looks more normal

CLT says that as  $N \rightarrow \infty$  freq distr.  $\rightarrow$  "Normal" with well-defined mean & variance.

end step

note, we started with any distribution and only assumed it had a well defined mean and variance

important

It might not, itself, be "normal"

g) but what does it mean to be "normal"?

implies that  $f(x) = \text{Gaussian} = e^{-\frac{x^2}{2\sigma^2}}$   
or  $e^{-\frac{(x-\mu)^2}{2\sigma^2}}$

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L3.7

for now we'll call  $b$  the "width func"  
and  $\bar{x}$  the "maximally probable value"

→ would typically need to normalize this  
 $f(x)$  s.t.

$$\int_{-\infty}^{\infty} f(x) dx = 1$$

h.) ERF

so the probability of finding ~~an~~ a sample  
between  $\mu - b$  &  $\mu + b$  is

$$\text{Prob}(\mu - b, \mu + b) = \int_{\mu - b}^{\mu + b} \frac{1}{\sqrt{2\pi} b} e^{-\frac{(x - \mu)^2}{2b^2}} dx$$

can let  $z \equiv \frac{x - \mu}{b} \Rightarrow$

$$\text{Prob} = \int_{-1}^1 \frac{1}{\sqrt{2\pi}} e^{-\frac{z^2}{2}} dz$$

called the "error func" or ERF

look up when in book

Just mention

2) SDom

have established, given certain (reasonable) assumptions,  $\bar{x} = \bar{x}$  and  $b_0 = b$

still working w/  $N$   $x_i$ , what is "reliability" of  $\bar{x} = \bar{x}$ ?

to consider, take data at  $\bar{x}_k = \frac{\sum_{i=1}^N x_{i,k}}{N}$   $k=1, \dots, M$  (sets)  
dist. of  $\bar{x}_k$  over  $M$  "sets"

we note that if  $x_1, x_2, \dots, x_N$  is normally distributed then  $\bar{x}$  is normally distributed (simple fn of  $x_i$ )

2<sup>nd</sup>, each  $x_i$  has the same true value  $\bar{x}$

$$\text{so } \bar{x} = \frac{\bar{x} + \bar{x} + \bar{x} \dots}{N} = \text{true value}$$

Now take a stab online @ results

So measuring  $M$  sets doesn't change  $\bar{x} = \bar{x}$  (of c.)

Q: what is width estimate of  $\bar{x}$ ? (add errors in  $\bar{x}$  in quadrature)

$$\sigma_{\bar{x}} = \sqrt{\left(\frac{\partial \bar{x}}{\partial x_1} \Delta x_1\right)^2 + \left(\frac{\partial \bar{x}}{\partial x_2} \Delta x_2\right)^2 + \dots + \left(\frac{\partial \bar{x}}{\partial x_N} \Delta x_N\right)^2}$$

but

$$\Delta x_1 = \Delta x_2 = \Delta x_N = \Delta x$$



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and:  $\frac{\partial \bar{x}}{\partial x_1} = \frac{\partial \bar{x}}{\partial x_2} = \dots = \frac{\partial \bar{x}}{\partial x_N} = \frac{1}{N}$

$$\Rightarrow \sigma_{\bar{x}} = \sqrt{\left(\frac{1}{N} \sigma_x\right)^2 + \dots + \left(\frac{1}{N} \sigma_x\right)^2}$$
$$= \frac{\sigma_x}{\sqrt{N}} \quad \text{SDOM}$$

(what we see in reporting error)

### 3) Brownian Motion

- say we put 25 micron sphere in deionized water at room temp

- what would we see? (under)

" " " " with 40x mag? (still naked)

- what would we see if made movies with 40x digital microscope

(still naked)  
(depend on frame rate)

- lets make frame rate 0.25 fps <sup>Q</sup> (ask for what the news)

(show movie)

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we note: (ask for this)

- spheres appear to move
- "motion" is called Born-Motio
- there may be other factors affecting their motion (query)

Why do this?

$$\overline{\Delta x^2} = 2 D_{ax} \Delta t$$

(also  $\overline{\Delta y^2} = 2 D_{ay} \Delta t$   
 $\overline{\Delta r^2} = 4 D_{ar} \Delta t$ )

- first, why  $\Delta x$  ( $\Delta y$ , or)?

- next what does  $\overline{\Delta x^2}$  mean?

note that  $\sigma_{\Delta x}^2 = \overline{\Delta x^2} - (\overline{\Delta x})^2$

what do expect  $\overline{\Delta x}$  to be for BM?

mention it should be 0, but this might be 'experiment zero' =>

thus  $(\overline{\Delta x})^2 \ll \overline{\Delta x^2}$   
 $\overline{\Delta x^2} \approx \sigma_{\Delta x}^2$

- what is  $\sigma_{\Delta x}$ ? could we vary it?  
 how is that useful?

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Q1) question: what is  $D$ ?  
(the 'diffusion-constant' first  
hypothesized by Einstein

with  $DS = k_B T$   $T = ?$ , units?

and  $f = 6\pi\eta R$  (drag factor, calculable)

$\Rightarrow$  If we can estimate  $D$  + its error ( $\delta D$ )  $\Leftarrow$   
then we can "  $k_B$  + its error

In the lab we will:

1) make movies of spheres undergoing BM

2) analyze these, first using Logger Pro

3) get LP data  $\Rightarrow$  python (or MC)

4) ? calc  $\Delta x$ ,  $\overline{\Delta x^2}$  vs  $\overline{\Delta t^2}$   
 $\Downarrow$  random (data quality)

5) ? do statistics

6) ? est  $D$  +  $\delta D$

7) calc  $k_B$  +  $\delta k_B$

8) 'Time Evolution'

ask  
students  
to  
complete  
last