

KEIF CH 1 (also, cf CH 2 easy Ref)

COMPUTING } USING PROBABILITIES (fast)

CPS M THINGS CAN HAPPEN  
i LABELS WHICH

ex 3 SIDED DIE (I know most have 6, but the last 3 don't teach anything)

i = 1, 2, 3      M = 3      u<sub>i</sub> = # ON DIE:  
⇒      i      u<sub>i</sub>  
         1      5  
         2      7  
         3      9

MEASURE PROBS: (don't know in advance)

THROW	N = 100	TIMES: { APPROX TO } N = 10	
u		# u's	[in practice, enough times so that all things can happen a lot (u = "RANDOM VARIABLE")]
5		20	
7		50	
9		30	

*This is P(u)  
i.e. fraction of trials  
= fraction of times u occurs after many trials*

$P(5) = \frac{20}{100} = 0.2$   
 $P(7) = \frac{50}{100} = 0.5$   
 $P(9) = \frac{30}{100} = 0.3$

(i.e. 20%)  
 Main idea, can use to bring some simple into a few many P's  
 ("PROB. DISTRIBUTION")  
 ⇒ EVERYTHING CAN SAY ABOUT u  
 ⇒ CAN ANSWER ANY QUESTION w/ P(i)

(1) NORMALIZATION:

$\sum_{i=1}^M P(u_i) = 1$   
 = PROB. SOMETHING HAPPENED (i.e.  $\frac{20 + 50 + 30}{100}$ )

⇒ ONLY NEED REL. PROBS

ex  $P(A) = 2 P(B) = 4 P(C) \Rightarrow P(A) = \frac{4}{7} \quad P(B) = \frac{2}{7} \quad P(C) = \frac{1}{7}$

(1) ADDING PROBS:

- ONE MOVE.
- EITHER / OR

ex PROB 5 OR 7 (ie NOT 9)

$$N = 100$$

OCCURRENCES: 20 + 50

$$P(5 \text{ OR } 7) = \frac{20 + 50}{100} = \frac{20}{100} + \frac{50}{100} = P(5) + P(7) = 0.7$$

⇒ LESS RESTRICTIVE, P. INCR.

(2) NORMALIZATION:

PROB ANYTHING HAPPENED!

OCCURRENCES: 20 + 50 + 30

$$P = \frac{20 + 50 + 30}{100} = P(5) + P(7) + P(9) = 1$$

IN GENERAL:  $\sum_{i=1}^M P(u_i) = 1$

USEFUL - ONLY NEED RELATIVE PROBS:

ex  $P(A) = 2P(B) = 4P(C) \Rightarrow P(A) = \frac{4}{7}, P(B) = \frac{2}{7}, P(C) = \frac{1}{7}$   
 (and A, B, C are only possible results)

(3) MULTIPLYING PROBS:

- MULTIPLE MOVES
- INDEPENDENT ⇒ DON'T AFFECT EACH OTHER,  
 (COUNTER-EX: PROB OF GETTING 2 ACE'S IN POKER;  
 GET 1, ONLY 3 LEFT)

- BOTH / AND

ex THROW 2 DICE, PROB OF 5 & 7 (OR 1 DIE TWICE)  
EXPT: DO LOTS OF THROWS IN PARTICULAR WAY (re. probs. to above)

1<sup>ST</sup> DIE: THROW 100 TIMES

⇒ GET SAME DIS. AS ABOVE

2<sup>ND</sup> DIE: FOR EACH THROW OF 1<sup>ST</sup>, THROW 2<sup>ND</sup> DIE  
 100 TIMES ⇒ EACH SET OF 100  
 SHOULD LOOK ~ SAME (ELSE NOT INDEP.)

(ONLY WORKS PERFECTLY FOR  $\omega \neq$  THROWS)

$$\# \text{ PAIRS: } N_I \times N_{II} = 100 \times 100$$

$$\# \text{ OF } \begin{matrix} (5 & \text{AND} & 7) \\ I & & II \end{matrix} \text{'S: } 20 \times 50$$

$$P(5 \text{ \& } 7) = \frac{20 \cdot 50}{100 \times 100} = P_I(5) \cdot P_{II}(7) = 0.1$$

⇒ MORE RESTRICTIVE, P DECR.

IF IGNORE ORDER?

$$P(5 \text{ \& } 7) + P(7 \text{ \& } 5) = 0.2$$

NOTE:  $P_I \neq P_{II}$  (COULD BE DIFF. DISTR FOR DIFF. QTY'S)

EX PROB THAT WIN LOTTERY? GET HIT BY LIGHTNING

(4) AVERAGE (OR "EXPECTATION VALUE")

$$\bar{u} = \mu_{\text{AVE}} \quad (\text{SOMETIMES } \langle u \rangle)$$

USUAL METHOD: ADD ALL \& DIV BY N:

$$\frac{20 \times 5 + 50 \times 7 + 30 \times 9}{100}$$

$$= \underbrace{\left(\frac{20}{100}\right)}_{P(5)} \cdot 5 + \underbrace{\left(\frac{50}{100}\right)}_{P(7)} \cdot 7 + \underbrace{\left(\frac{30}{100}\right)}_{P(9)} \cdot 9$$

$$= \sum_{i=1}^M P(u_i) \cdot u_i$$

OTHER FNS OF  $u$ :

$$\text{EX } \overline{u^2} = \frac{20 \times (5)^2 + 50 \times (7)^2 + 30 \times (9)^2}{100} = \sum_{i=1}^M P(u_i) \cdot u_i^2$$

SAME DISTR.

GENERAL:

$$\overline{f(u)} = \sum_{i=1}^M P(u_i) f(u_i)$$

PROPERTIES (from general expression)

$$\overline{f(u) + g(u)} = \overline{f(u)} + \overline{g(u)}$$

$$\overline{c f(u)} = c \overline{f(u)}$$

(5) QTYs WHICH CHARACTERIZE P:

(a) Ave  $\bar{u}$  (ALSO "MEAN")

OFTEN NEED MORE INFO:

FLUCTUATIONS: HOW MUCH DOES  $u$  JUMP AROUND?

ex 10 POLLS (treat each as measurement)

ON AVE: KERRY 51% BUSH 49% ('04) } put this in in Aug '99. before primaries  
GORE 53% BUSH 47% ('99)

BET ON IT? McCAIN 52% CLINTON 48% ('05) } put in spring '07. before primaries  
OBAMA 51% McCAIN 49% ('07)

- HOW LIKELY TO CHG. ON NEXT POLL? (ie the one that counts)

⇒ SEE HOW MUCH 10 POLLS FLUCTUATE.

SPE. ONE POLL TO NEXT JUMPS 10%? NO.

(ASIDE: CAN DECREASE FLUCTS BY USING MORE PEOPLE IN EACH POLL; IMPORTANT LATER)

⇒ [CF PICTURES OF DISTRIBUTIONS] all three have same  $\bar{u}$ , but very different distributions

(b) Ave Deviation:

$$\Delta u_i = u_i - \bar{u}$$

$$\overline{\Delta u} = \sum_i P(u_i) (u_i - \bar{u}) \quad \{P_i \equiv P(u_i)\}$$

$$= \sum_i P_i u_i - \sum_i P_i \bar{u}$$

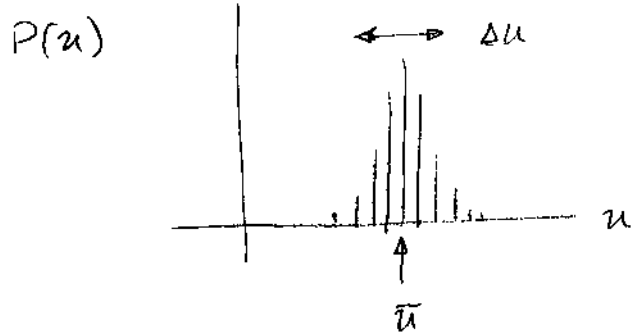
$$= \bar{u} - \bar{u} \sum P_i$$

$$\boxed{\overline{\Delta u} = 0}$$

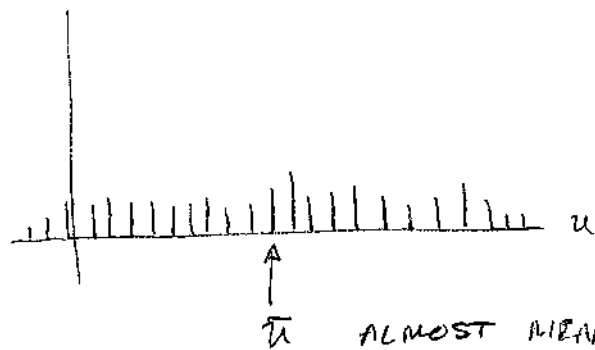
Why? as many on one side of  $\bar{u}$  as other - that's why it's ave.

NOT USEFUL

COMPARE

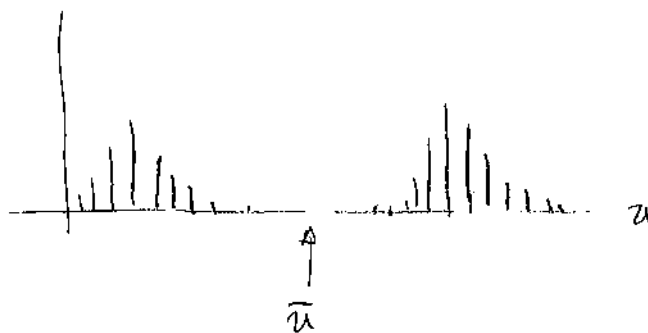


KNOW  $u \sim \bar{u} \pm \Delta u$



ALMOST MEANINGLESS  
COULD GET ANYTHING

MORE PERVERSE



NEVER GET  $\bar{u}$  IN ANY MEAS.

(c) VARIANCE :(ALSO "2<sup>ND</sup> MOMENT ABOUT MEAN", OR "DISPERSION")

⇒ USE MAGNITUDES

$$\overline{(\Delta u)^2} = \sum_i P_i (\Delta u_i)^2 = \sum_i P_i (u_i - \bar{u})^2$$

USEFUL ID:

$$= \sum_i P_i [u_i^2 - 2\bar{u}u_i + \bar{u}^2]$$

$$= \bar{u}^2 - 2\bar{u} \underbrace{\sum_i P_i u_i}_{\bar{u}} + \bar{u}^2 \underbrace{\sum_i P_i}_{1}$$

$$\boxed{\overline{(\Delta u)^2} = \overline{u^2} - \bar{u}^2}$$

$\underbrace{\hspace{10em}}_{(u-\bar{u})^2}$

ROOT - MEAN SQUARE DEVIATION (STD. DEVIATION)

$$\sqrt{\overline{(\Delta u)^2}} = \Delta^* u \quad (\text{REIF})$$

$$\equiv \sigma \quad (\text{statistic})$$

very diff  
result for  
first & second  
P's

(d) HIGHER MOMENTS .

"N<sup>TH</sup> MOMENT ABOUT MEAN"  $\overline{(\Delta u)^n} = \sum_i P_i (\Delta u_i)^n$

- SENSITIVE TO  $u$  FURTHER FROM  $\bar{u}$ 

- COULD TELL PLOT 2 FROM 3

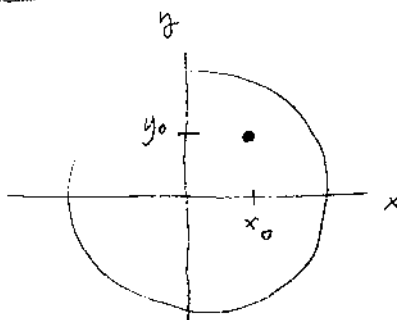
- W/ ALL  $n$ , CAN RECONSTRUCT  $P_i$ 

(NOT USUALLY NEEDED)

5:

CONTINUOUS DISTRIBUTIONS :

EX DARTBOARD



PROB DART

HITS AT PT.  $Q \equiv (x_0, y_0)$  ?

(darts chosen from set that hit somewhere on board)

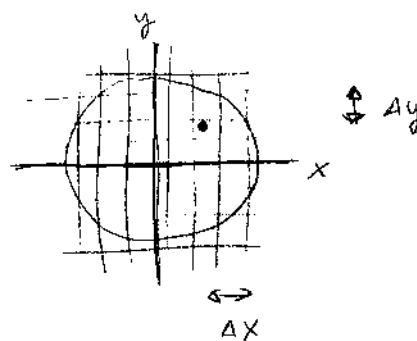
$P(Q) = 0$  (HAVE  $\infty \neq$  PTS)  $\Rightarrow$  NOT MEANINGFUL

CHOICES

(A) MAKE GRID SIZE  $\Delta x, \Delta y$

LABEL CELLS BY CENTERS  $Q_i$

GIVE  $P(Q_i)$  (ie count all w/in cell)  
"binning"



WELL-DEFINED, BUT  $P_i$  DEPENDS ON GRID  $\rightarrow$  redo if chg. grid  
(but suspect accuracy of dart thrower is indep. of grid)

(B) DEFINE PROB. DENSITY  $P(x, y)$

- AS DECREASE  $\Delta x, \Delta y \Rightarrow P(Q_i)$  DECREASES  
(SMALLER AREA)

-  $P(x_i, y_i) = \lim_{\Delta x, \Delta y \rightarrow 0} \frac{P(Q_i)}{\Delta x \Delta y}$   
(prob per area)  
 $\Rightarrow$  dimensions?

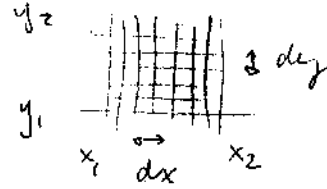
(can have well-defined limit  $\rightarrow$  if half the area, expect  $P$  might decrease by  $\sim \frac{1}{2}$ ) (for small  $\Delta A$ )

don't really need  $\rightarrow 0$ ;  
it's enough to be very small vs scale at which  $P$  changes

THEN

(a)  $\int P(x, y) dx dy =$  PROB HITS FROM  $x$  to  $x+dx$   
 $y$  to  $y+dy$

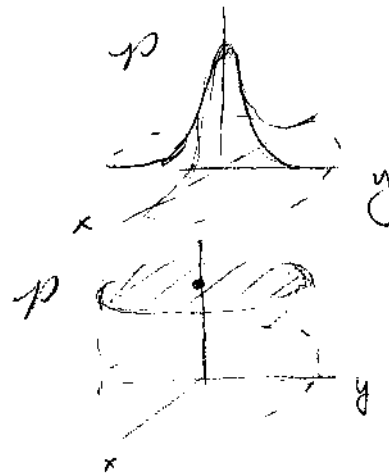
(b) PROB FROM  $x_1$  TO  $x_2$   
 $y_1$  TO  $y_2$



ACCEPT ANY  $dx dy$   
 $\Rightarrow$  ADD PROBS  $P(x, y) dx dy$

$$\Rightarrow \int_{x_1}^{x_2} dx \int_{y_1}^{y_2} dy P(x, y)$$

ex GOOD DART THROWER:



POOR

same ave,  
 bigger deviation

NORMALIZATION:

$$\int dx dy P(x, y) = 1$$

(oo, oo) dart thrower:  $P = \frac{1}{A} = \frac{1}{\pi R^2}$

NOTE: IMPORTANCE OF SPECIFYING SET DRAW ELEMENTS FROM  
 (a) DARTS ON BOARD ( $\approx$  constraints on your system)

(b) ALL DARTS (big diff. of lousy dart thrower)

{ REIF: prob. that <sup>particular</sup> seed yields red flower  $\rightarrow$  not meaningful  
 diff of  $\in$  (a) roses

(b) all plants, flowering & not }



AVES. (OF CONTIN. QTY'S)

DISCRETE  $\bar{u} = \sum_{i=1}^M P(u_i) u_i$

CONTINUOUS (IN X)

(APPROX)

DISCRETE VERSION:

1d

$\Delta x$   
 $\longleftrightarrow$   
 $\begin{matrix} | & | & | & | & | & | \\ x_0 & x_1 & x_2 & \dots & x_M \\ \vdots & & \vdots & & \vdots \\ x_i & & & & x_f \end{matrix}$   $\bar{x} = \sum_{n=0}^{M-1} P(x_n) x_n$

$\Delta x \rightarrow 0$ :  $P(x_n) \equiv \frac{P(x_n)}{\Delta x}$  OR  $P = \mathcal{P} \Delta x$

$\bar{x} = \sum_{n=0}^{M-1} \Delta x \mathcal{P}(x_n) \cdot x_n$

$\uparrow$  slip just fine

$P(x) dx = \text{prob. } x \text{ betw } x \text{ \& } x+dx$   
 mult by  $x$  & sum

$\Delta x \rightarrow 0 \rightarrow \int_{x_i}^{x_f} dx \mathcal{P}(x) \cdot x$  cf OM  
prob between  $x$  &  $x+dx$

Also  $\overline{f(x)} = \int_{x_i}^{x_f} dx \mathcal{P}(x) f(x)$

2d:  $\overline{f(x,y)} = \int_{x_i}^{x_f} \int_{y_i}^{y_f} dx dy \mathcal{P}(x,y) f(x,y)$

RTC

# PROB. DIST'S WITH SEVERAL VARIABLES

(skip)

SPS HAVE 2 VARIABLES  $u$  &  $v$  WHICH CAN HAVE VALUES

$$u_i, v_j \quad i = 1, \dots, M$$

$$j = 1, \dots, N$$

CAN GIVE PROB THAT BOTH  $u_i$  &  $v_j$  OCCUR:

$$P(u_i, v_j)$$

(1) NORM: 
$$\sum_{i=1}^M \sum_{j=1}^N P(u_i, v_j) = 1$$

(2) PROB THAT  $u_i$  OCCURS FOR ANY  $v$ :

$$P_u(u_i) = \sum_{j=1}^N P(u_i, v_j) \quad (\text{SUM OVER ALL } v \text{'S CONSISTENT})$$

(NOTE  $\sum_{u_i} P_u(u_i) = 1 \quad \checkmark$ )

(3)  $\overline{F(u, v)} = \sum_{i, j} P(u_i, v_j) F(u_i, v_j)$

(4) IF  $F(u)$  INDEP OF  $v$ :

$$\begin{aligned} \overline{F(u)} &= \sum_i \sum_j P(u_i, v_j) F(u_i) \\ &= \sum_i P_u(u_i) F(u_i) \end{aligned}$$

(skip)

SPECIAL CASE:  $U_i$  &  $U_j$  STATISTICALLY INDEPENDENT

$\equiv$  PROB FOR  $U_i$  OCCURRING DOESN'T DEP. ON  $U_j$

THEN CAN WRITE SEP. PROB FOR BOTH:

$$P(U_i, U_j) = P_{U_i}(U_i) \cdot P_{U_j}(U_j) \quad (\text{BOTH NORMALIZED})$$

EX DEPENDENT: DIE WITH ODD SIDES BLUE  
EVEN " RED

LET  $U = 1, \dots, 6$   
 $C = R, B$

COMBS	
U	C
1	B
2	R
3	B etc

$$P(1, R) = 0$$

$$P(1, B) = \frac{1}{6}$$

$$P(U < 4, B) = \frac{2}{6} = \frac{1}{3}$$

INDEP: 1 DIE, & 1 COIN (B & R)

COMBS	
1	B
1	R
2	B
2	R
etc	

$$P(1, R) = P(1) \cdot P(R) = \frac{1}{6} \cdot \frac{1}{2} = \frac{1}{12}$$

$$P(1) \cdot P(B) = \frac{1}{12}$$

$$P(U < 4, B) = \frac{3}{6} \cdot \frac{1}{2} = \frac{1}{4}$$