## Frequency probabilities

## Frequency Probability

- Long run proportion
- Repeatable process

Notebook/data.frame view

|  | Species | Color |
| :---: | ---: | ---: |
| ------------------------ |  |  |
| 1 | virginica | purple |
| 2 | setosa | pink |
| 3 | versicolor | pink |
| $\vdots$ | $\vdots$ | $\vdots$ |
| K | setosa | pink |
| K+1 | versicolor | pink |
| $\vdots$ | $\vdots$ | $\vdots$ |

$$
\#(\text { pink })=\sum_{i=1}^{N} I\left(\text { Color }_{i}=" \text { pink" }\right)
$$

$$
P(\text { Color }=" \text { pink" })=\lim _{N \rightarrow \infty} \frac{\#(\text { pink })}{N}
$$

```
df <- function(n){
    S <- sample(c("setosa","versicolor", "virginica"), n, replace=TRUE)
    pc <- .4*(S=="setosa") + .5*(S=="versicolor") + . 2
    C <- c("purple","pink") [rbinom(n,1,pc)+1]
    data.frame(S = S, C = C)
}
```

> set.seed(1)
$>\mathrm{A}<-\mathrm{df}(50)$
> A \% >\% mutate (event = 1*(C=="pink")) \%>\% pull (event) \%>\% mean
[1] 0.44
> A <- rbind(A,df(500))
> A \%>\% mutate (event = 1*(C=="pink")) \%>\% pull (event) \%>\% mean
[1] 0.5163636
> A <- rbind (A,df(5000))
>A \% $\mathrm{A} \%$ mutate (event $=1 *(C==" p i n k ")$ ) $\%$ ( pull (event) $\%$ \% mean
[1] 0.5037838
$>\mathrm{A}<-\mathrm{rbind}(\mathrm{A}, \mathrm{df}(5000000)$ )
> A \%>\% mutate (event = 1*(C=="pink")) \%>\% pull(event) \%>\% mean
[1] 0.4997297

## Joint events

- AND: events created by combining outcomes from two or more features with the AND operator
$\#($ setosa $\&$ pink $)=\sum_{i=1}^{N} I\left(\operatorname{Species}_{i}="{\left.\text { setosa" } \& \operatorname{Color}_{i}=" p i n k "\right) ~}_{\text {" }}=\right.$
$P($ Species $="$ setosa" $\&$ Color $="$ pink" $)=\lim _{N \rightarrow \infty} \frac{\#(\text { setosa \& pink })}{N}$


## Joint events

- AND: events created by combining outcomes from two or more features with the AND operator
$\#($ setosa $\mid$ pink $)=\sum_{i=1}^{N} I\left(\right.$ Species $_{i}="$ setosa" $\left.\mid \operatorname{Color}_{i}=" \operatorname{pink} "\right)$
$P($ Species $="$ setosa" $\mid$ Color $="$ pink" $)=\lim _{N \rightarrow \infty} \frac{\#(\text { setosa } \mid \text { pink })}{N}$

```
set.seed(1)
df(500) %>%
    mutate(event = 1*(S=="setosa" & C == "pink")) %>%
    pull (event) %>%
    mean
df(500) %>%
    mutate(event = 1*(S=="setosa" | C == "pink")) %>%
    pull (event) %>%
    mean
```


## Cross Tab

## Pet Color Example

## Cell frequencies

| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| cat | 52 | 269 | 73 | 394 |
| dog | 299 | 290 | 17 | 606 |
| Column Total | 351 | 559 | 90 | 1000 |

## Pet Color Example

## Cell proportions

| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| cat | $\frac{52}{1000}$ | $\frac{269}{1000}$ | $\frac{73}{1000}$ | $\frac{394}{1000}$ |
| dog | $\frac{299}{1000}$ | $\frac{290}{1000}$ | $\frac{17}{1000}$ | $\frac{606}{1000}$ |
| Column Total | $\frac{351}{1000}$ | $\frac{559}{1000}$ | $\frac{90}{1000}$ | $\frac{1000}{1000}$ |

## Pet Color Example

$$
N=1000
$$

| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| cat | 0.052 | 0.269 | 0.073 | 0.394 |
| dog | 0.299 | 0.290 | 0.017 | 0.606 |
| Column Total | 0.351 | 0.599 | 0.090 | 1 |


| Cell frequency |  |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  |  | Cell proportion |  |  |  |
| pet blue gre en red <br> Row Total     <br> cat 52 26 73 394 <br>  0.052 0.269 0.073 0.394 <br> dog 299 290 17 606 <br>  0.299 0.290 0.017 0.606 <br> Column Total 351 559 90 1000 <br>  0.351 0.599 0.090 1 |  |  |  |  |  |


| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| Cell frequency | 52 | 269 | 73 | 394 |
| Cell proportion | 0.052 | 0.269 | 0.073 | 0.394 |
| Row proportion | $\frac{52}{394}$ | $\frac{269}{394}$ | 73 <br> 394 |  |
| dog | 299 | 290 | 17 | 606 |
|  | 0.299 | 0.290 | 0.017 | 0.606 |
|  | $\frac{299}{606}$ | $\frac{290}{606}$ | $\frac{17}{606}$ |  |
| Column Total | 351 | 559 | 90 | 1000 |
|  | 0.351 | 0.599 | 0.090 | 1 |


| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| Cell frequency | 52 | 269 | 73 | 394 |
| Cell proportion | 0.052 | 0.269 | 0.073 | 0.394 |
| Row proportion | 0.132 | 0.683 | 0.185 |  |
|  | dog | 299 | 290 | 17 |
|  | 0.299 | 0.290 | 0.017 | 0.606 |
|  | 0.493 | 0.479 | 0.028 |  |
| Column Total | 351 | 559 | 90 | 1000 |
|  | 0.351 | 0.599 | 0.090 | 1 |


| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| cat | 52 | 269 | 73 | 394 |
| What is the sum of <br> row proportions? | 0.052 | 0.269 | 0.073 | 0.394 |
|  | 0.132 | 0.683 | 0.185 |  |
|  | 299 | 290 | 17 | 606 |
|  | 0.299 | 0.290 | 0.017 | 0.606 |
|  | 0.493 | 0.479 | 0.028 |  |
| Column Total | 351 | 559 | 90 | 1000 |
|  | 0.351 | 0.599 | 0.090 | 1 |


| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| Cell frequency | 52 | 269 | 73 | 394 |
| Cell proportion | 0.052 | 0.269 | 0.073 | 0.394 |
| Row proportion | 0.132 | 0.683 | 0.185 |  |
| । | $\frac{52}{351}$ | $\frac{269}{559}$ | $\frac{73}{90}$ |  |
| Column proportion | 299 | 290 | 17 | 606 |
| dog | 0.299 | 0.290 | 0.017 | 0.606 |
|  | 0.493 | 0.479 | 0.028 |  |
|  | $\frac{299}{351}$ | $\frac{290}{559}$ | $\frac{17}{90}$ |  |
| Column Total | 351 | 559 | 90 | 1000 |


| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| cat | 52 | 269 | 73 | 394 |
|  | 0.052 | 0.269 | 0.073 | 0.394 |
|  | 0.132 | 0.683 | 0.185 |  |
|  | Sum? | $\frac{52}{351}$ | $\frac{269}{559}$ | $\frac{73}{90}$ |
|  |  |  |  |  |
| dog | 299 | 290 | 17 | 606 |
|  | 0.299 | 0.290 | 0.017 | 0.606 |
|  | 0.493 | 0.479 | 0.028 |  |
|  | $\frac{299}{351}$ | $\frac{290}{559}$ | $\frac{17}{90}$ |  |
| Column Total | 351 | 559 | 90 | 1000 |


| pet | blue | green | red | Row Total |
| :--- | :--- | :---: | :---: | :---: | :---: |
| cat | 52 | 269 | 73 | 394 |
|  | 0.052 | 0.269 | 0.073 | 0.394 |
| Column proportions | 0.132 | 0.683 | 0.185 |  |
| sum to 1 | $\frac{52}{351}$ | $\frac{269}{559}$ | $\frac{73}{90}$ |  |
| dog | 299 | 290 | 17 | 606 |
|  | 0.299 | 0.290 | 0.017 | 0.606 |
|  | 0.493 | 0.479 | 0.028 |  |
|  | $\frac{299}{351}$ | $\frac{290}{559}$ | $\frac{17}{90}$ |  |
|  | 351 | 559 | 90 | 1000 |


| pet |  | blue | green | red | Row Total |
| :---: | :--- | :---: | :---: | :---: | :---: |
| cat |  | 52 | 269 | 73 | 394 |
|  | Cell proportion | 0.052 | 0.269 | 0.073 | 0.394 |
|  | Row proportion | 0.132 | 0.683 | 0.185 |  |
|  | Col proportion | 0.148 | 0.481 | 0.811 |  |
| dog |  | 299 | 290 | 17 | 606 |
|  | 0.299 | 0.290 | 0.017 | 0.606 |  |
|  | 0.493 | 0.479 | 0.028 |  |  |
|  | 0.852 | 0.519 | 0.189 |  |  |
| Column Total | 351 | 559 | 90 | 1000 |  |
|  | 0.351 | 0.599 | 0.090 | 1 |  |

\# Many different ways to \# generate cross tabs in R
xtabs(~pet+color, data = df1)
table(df1\$pet, df1\$color)
gmodels::CrossTable(
df1\$pet
, df1\$color
, prop.chisq = FALSE
)

Cell Contents


Total Observations in Table: 1000



Total Observations in Table: 100000


## Cell Contents

Total Observations in Table: 10000000


## Pet Color Example

$$
\text { limit as } N \rightarrow \infty
$$

| pet | blue | green | red | Row Total |
| :--- | :---: | :---: | :---: | :---: |
| cat | 0.0634621 | 0.2730758 | 0.0634621 | 0.4 |
| dog | 0.3 | 0.2863499 | 0.01365008 | 0.6 |
| Column Total | 0.3634621 | 0.5594257 | 0.07711218 | 1 |

limit as $N \rightarrow \infty$

| pet | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: |
| cat | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| Cell prob | $P$ (cat \& blue) | $P($ cat \& green $)$ | $P($ cat \& red) | $P$ (cat) |
| Row prob | $P$ (blue \| cat) | $P$ (green \\| cat) | $P($ red \| cat) |  |
| Col prob | $P$ (cat \| blue) | $P($ cat \| green) | $P($ cat \| red) |  |
| dog | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| Cell prob | $P($ dog \& blue $)$ | $P(\operatorname{dog} \&$ green $)$ | $P(\mathrm{dog} \& \mathrm{red})$ | $P(\mathrm{dog})$ |
| Row prob | $P$ (blue \| dog) | $P$ (green \| dog) | $P($ red \| dog) |  |
| Col prob | $P(\mathrm{dog} \mid$ blue $)$ | $P(\mathrm{dog} \mid$ green $)$ | $P(\mathrm{dog} \mid$ red $)$ |  |
| Column Total | $\begin{gathered} \infty \\ \mathrm{P} \text { (blue) } \end{gathered}$ |  | $\begin{gathered} \infty \\ \mathrm{P} \text { (red) } \\ \hline \end{gathered}$ | $\infty$ |

limit as $N \rightarrow \infty$

| pet |  | blue | green | red | Row Total |
| :--- | :--- | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | $P($ cat \& blue $)$ | $P($ cat \& green $)$ | $P($ cat \& red $)$ | $P($ cat $)$ |
|  | Row prob | $P($ blue \| cat $)$ | $P($ green \| cat $)$ | $P($ red \| cat $)$ |  |
|  | Col prob | $P($ cat \| blue $)$ | $P($ cat \| green $)$ | $P($ cat \| red $)$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | $P($ dog \& blue $)$ | $P($ dog \& green $)$ | $P($ dog \& red $)$ | $P($ dog $)$ |
|  | Row prob | $P($ blue \| dog $)$ | $P($ green \| dog $)$ | $P($ red \| dog $)$ |  |
|  | Col prob | $P($ dog \| blue $)$ | $P($ dog \| green $)$ | $P(\operatorname{dog} \mid$ red $)$ |  |
| Column Total | P(blue $)$ | $\mathrm{P}($ green $)$ | $\mathrm{P}($ red $)$ | 1 |  |

## Marginal

Probability
limit as $N \rightarrow \infty$

| pet | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |
| Cell prob | $P$ (cat \& blue) | $P($ cat \& green) | $P$ (cat \& red) | $P$ (cat) |
| Row prob | $P$ (blue \| cat) | $P$ (green \| cat) | $P$ (red \| cat) |  |
| Col prob | $P$ (cat \| blue) | $P$ (cat \| green) | $P($ cat \| red) |  |
| dog |  |  |  |  |
| Cell prob | $P($ dog \& blue $)$ | $P(\operatorname{dog} \&$ green $)$ | $P(\operatorname{dog} \& \mathrm{red})$ | $P(\mathrm{dog})$ |
| Row prob | $P$ (blue \| dog) | $P$ (green \| dog) | $P$ (red \| dog) |  |
| Col prob | $P($ dog \| blue) | $P($ dog \| green $)$ | $P(\mathrm{dog} \mid \mathrm{red})$ |  |
| Column Total | P (blue) | P (green) | P (red) | 1 |

## Marginal Probability

limit as $N \rightarrow \infty$

| pet | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: |
| cat |  |  | $\begin{gathered} P(\text { cat \& red }) \\ P(\text { red \| cat }) \\ P(\text { cat } \mid \not 又 d) \\ \hline \end{gathered}$ | $P$ (cat) |
| Cell prob | $P$ (cat \& blue) | $P($ cat \& green $)$ |  |  |
| Row prob | $P$ (blue \| cat) | $P$ (green \| cat) |  |  |
| Col prob | $P$ (cat \| blue) | $P($ cat \| green) |  |  |
| dog |  |  |  | $P(\mathrm{dog})$ |
| Cell prob | $P($ dog \& blue $)$ | $P(\operatorname{dog} \&$ green $)$ | $P(\mathrm{~d} g$ \& red) |  |
| Row prob | $P$ (blue \| dog) | $P$ (green \| dog) | (red \| dog) |  |
| Col prob | $P($ dog \| blue) | $P($ dog $\mid$ green $)$ | $P(\operatorname{dog} \mid \mathrm{red})$ |  |
| Column Total | P (blue) | P (green) | P (red) | 1 |

## Cell Probability

limit as $N \rightarrow \infty$ Joint Probability

Marginal
Probability


## Cell Probability

limit as $N \rightarrow \infty$ Joint Probability

Marginal
Probability


## Conditional Probabilities

| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  | $P$ (cat) |
|  | Cell prob | $P$ (cat \& blue) | $P($ cat \& green) | $P($ cat \& red) |  |
|  | Row prob | $P$ (blue \| cat) | $P$ (green \| cat) | $P$ (red \| cat) |  |
|  | Col prob | $P$ (cat \| blue) | $P$ (cat \| green) | $P($ cat $\mid$ red $)$ |  |
| dog |  |  |  |  | $P(\mathrm{dog})$ |
|  | Cell prob | $P($ dog \& blue $)$ | $P($ dog \& green $)$ | $P($ dog \& red $)$ |  |
|  | Row prob | $P$ (blue \| dog) | $P$ (green \| dog) | $P$ (red \| dog) |  |
|  | Col prob | $P(\mathrm{dog} \mid$ blue $)$ | $P($ dog \| green $)$ | $P(\mathrm{dog} \mid \mathrm{red})$ |  |
| Colu | mn Total | P (blue) | P (green) | P (red) | 1 |

## RULE: All probabilities are between 0 and 1

$$
0 \leq P \leq 1
$$

| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  | $P$ (cat) |
|  | Cell prob | $P$ (cat \& blue) | $P($ cat \& green) | $P($ cat \& red $)$ |  |
|  | Row prob | $P$ (blue \| cat) | $P$ (green \| cat) | $P$ (red \| cat) |  |
|  | Col prob | $P$ (cat \| blue) | $P($ cat \\| green) | $P($ cat \| red $)$ |  |
| dog |  |  |  |  | $P(\operatorname{dog})$ |
|  | Cell prob | $P($ dog \& blue $)$ | $P($ dog \& green $)$ | $P($ dog \& red $)$ |  |
|  | Row prob | $P$ (blue \| dog) | $P$ (green \| dog) | $P$ (red \| dog) |  |
|  | Col prob | $P(\operatorname{dog} \mid$ blue $)$ | $P(\operatorname{dog} \mid$ green $)$ | $P($ dog $\mid$ red $)$ |  |
| Column Total |  | P (blue) | P (green) | P(red) | 1 |

RULE: Probabilities of all possible outcomes sum to 1.

$$
\sum_{i=1}^{J} P_{i}=1
$$


$P($ cat $\&$ blue $)+P($ cat $\&$ green $)+P($ cat $\&$ red $)$
$+P($ dog $\&$ blue $)+P(\operatorname{dog} \&$ green $)+P(\operatorname{dog} \&$ red $)$


$$
P(\text { cat } \mid \text { blue })+P(\operatorname{dog} \mid \text { blue })=1
$$


$P($ blue $\mid \operatorname{dog})+P($ green $\mid \operatorname{dog})+P($ red $\mid \operatorname{dog})=1$


$$
P(\text { cat })+P(\mathrm{dog})=1
$$



Law of total probability: Cell probabilities on the same row sum to the marginal probability.
$P(\operatorname{dog} \&$ blue $)+P(\operatorname{dog} \&$ green $)+P(\operatorname{dog} \& r e d)=P(\operatorname{dog})$

| pet |  | blue | green | red | Row Total |
| :--- | :--- | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | $P($ cat \& blue $)$ | $P($ cat \& green $)$ | $P($ cat \& red $)$ | $P($ cat $)$ |
|  | Row prob | $P($ blue \| cat $)$ | $P($ green \| cat $)$ | $P($ red \| cat $)$ |  |
|  | Col prob | $P($ cat \| blue $)$ | $P($ cat \| green $)$ | $P($ cat \| red $)$ |  |
| dog |  |  |  |  |  |
|  |  |  |  |  |  |
|  | Cell prob | $P($ dog \& blue $)$ | $P($ dog \& green $)$ | $P($ dog \& red $)$ | $P(\operatorname{dog})$ |
|  | Row prob | $P($ blue \| dog $)$ | $P($ green \| dog $)$ | $P($ red \| dog $)$ |  |
|  | Col prob | $P($ dog \| blue $)$ | $P($ dog \| green $)$ | $P(\operatorname{dog} \mid$ red $)$ |  |
| Column Total | $\mathrm{P}($ blue $)$ | $\mathrm{P}($ green $)$ | $\mathrm{P}($ red $)$ | 1 |  |

Law of total probability: Cell probabilities in the same column sum to the marginal probability.

$$
P(\text { cat } \& \text { green })+P(\text { dog } \& \text { green })=P(\text { green })
$$

| pet | blue | green | red | Row Total |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | $P$ (cat \& blue) | $P($ cat \& green $)$ | $P($ cat \& red $)$ | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | $P($ dog \& blue $)$ | $? ? ?$ | $P($ dog \& red $)$ | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | $? ? ?$ | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |

## Question: Is there enough information to fill in the rest of the table?

| pet |  | blue | green | red | Row Total |
| :--- | :--- | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | $? ? ?$ | 0.3 | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | $? ? ?$ | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |

## Question: Is there enough information to fill in the rest of the table?

| pet |  | blue | green | red | Row Total |
| :--- | :--- | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | $? ? ?$ | 0.3 | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | ??? | $? ? ?$ | $? ? ?$ | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | $? ? ?$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | ??? | $? ? ?$ | $? ? ?$ | 1 |  |


| pet |  | blue | green | red | Row Total |
| :--- | :--- | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | $0.2+0.1+0.1=0.4$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | $0.1+0.2+0.3=0.6$ |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | $? ? ?$ | $? ? ?$ | $? ? ?$ | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | ??? | $? ? ?$ | $? ? ?$ | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | $? ? ?$ | $? ? ?$ | $? ? ?$ | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  | 0.4 |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | 0.1 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $\frac{0.1}{0.6}$ | $\frac{0.2}{0.6}$ | $\frac{0.3}{0.6}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | $? ? ?$ | $? ? ?$ | $? ? ?$ | 1 |  |


| pet | blue | green | red | Row Total |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $\frac{0.1}{0.6}$ | $\frac{0.2}{0.6}$ | $\frac{0.3}{0.6}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | $0.2+0.1=0.3$ | $0.1+0.2=0.3$ | $0.1+0.3=0.4$ | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $\frac{0.1}{0.6}$ | $\frac{0.2}{0.6}$ | $\frac{0.3}{0.6}$ |  |
|  | Col prob | $? ? ?$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | 0.3 | 0.3 | 0.4 | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $\frac{0.2}{0.3}$ |  | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $\frac{0.1}{0.6}$ | $\frac{0.2}{0.6}$ | $\frac{0.3}{0.6}$ |  |
|  | Col prob | $\frac{0.1}{0.3}$ | $? ? ?$ | $? ? ?$ |  |
| Column Total | 0.3 | 0.3 | 0.4 | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $\frac{0.2}{0.3}$ | $\frac{0.1}{0.3}$ | $? ? ?$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $\frac{0.1}{0.6}$ | $\frac{0.2}{0.6}$ | $\frac{0.3}{0.6}$ |  |
|  | Col prob | $\frac{0.1}{0.3}$ | $\frac{0.2}{0.3}$ | $? ? ?$ |  |
| Column Total | 0.3 | 0.3 | 0.4 | 1 |  |


| pet |  | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |  |
|  | Cell prob | 0.2 | 0.1 | 0.1 | 0.4 |
|  | Row prob | $\frac{0.2}{0.4}$ | $\frac{0.1}{0.4}$ | $\frac{0.1}{0.4}$ |  |
|  | Col prob | $\frac{0.2}{0.3}$ | $\frac{0.1}{0.3}$ | $\frac{0.1}{0.4}$ |  |
| dog |  |  |  |  |  |
|  | Cell prob | 0.1 | 0.2 | 0.3 | 0.6 |
|  | Row prob | $\frac{0.1}{0.6}$ | $\frac{0.2}{0.6}$ | $\frac{0.3}{0.6}$ |  |
|  | Col prob | $\frac{0.1}{0.3}$ | $\frac{0.2}{0.3}$ | $\frac{0.1}{0.4}$ |  |
| Column Total | 0.3 | 0.3 | 0.4 | 1 |  |


| pet | blue | green | red | Row Total |
| :---: | :---: | :---: | :---: | :---: |
| cat |  |  |  |  |
| Cell prob | ??? | ??? | ??? | 0.3 |
| Row prob | 0.2 | 0.5 | ??? |  |
| Col prob | ??? | ??? | ??? |  |
| dog |  |  |  |  |
| Cell prob | ??? | ??? | ??? | ??? |
| Row prob | 0.3 | ??? | 0.6 |  |
| Col prob | ??? | ??? | ??? |  |
| Column Total | ??? | ??? | ??? | ??? |

## Question: Is there enough information to fill in the rest of the table?

