

- ◆ Broken stick experiment
- ◆  $D = \text{Min}[X1, X2]$
- ◆  $D = \text{Max}[X1, X2]$
- ◆  $S = X1 + X2$
- ◆ Convolution
- ◆ Functions of Random Variables

# But first, we have a winner!

- ◆ The winning submission for ESD.86, *for most blatant misuse, abuse or misinterpretation of statistics and probability in the media.*
- ◆ Submitted by Roberto Perez-Franco.
- ◆ Original article *New York Times*:  
*51% of Women Are Now Living Without Spouse,*  
*New York Times*, January 16, 2007, Section A;  
Column 1; National Desk; Pg. 1

**Today: HEARING ON 'WARMING OF PLANET'**  
**CANCELED BECAUSE OF ICE STORM**

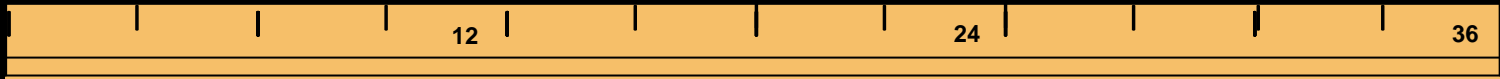


**Problem Framing,  
Formulation and  
Solution**

Break a yardstick in  
*two random places*

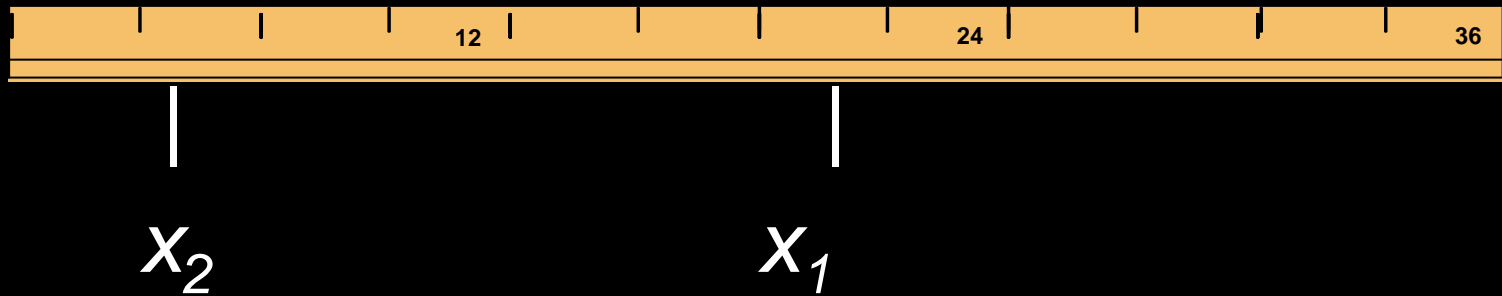
What is the probability that a  
triangle can be formed with the  
resulting three stick pieces?

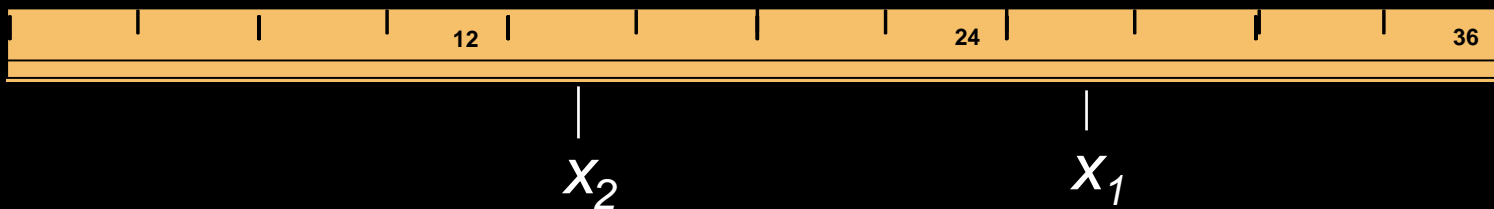
# Breaking a Stick



- ◆ Mark the stick....

# Marking the Results



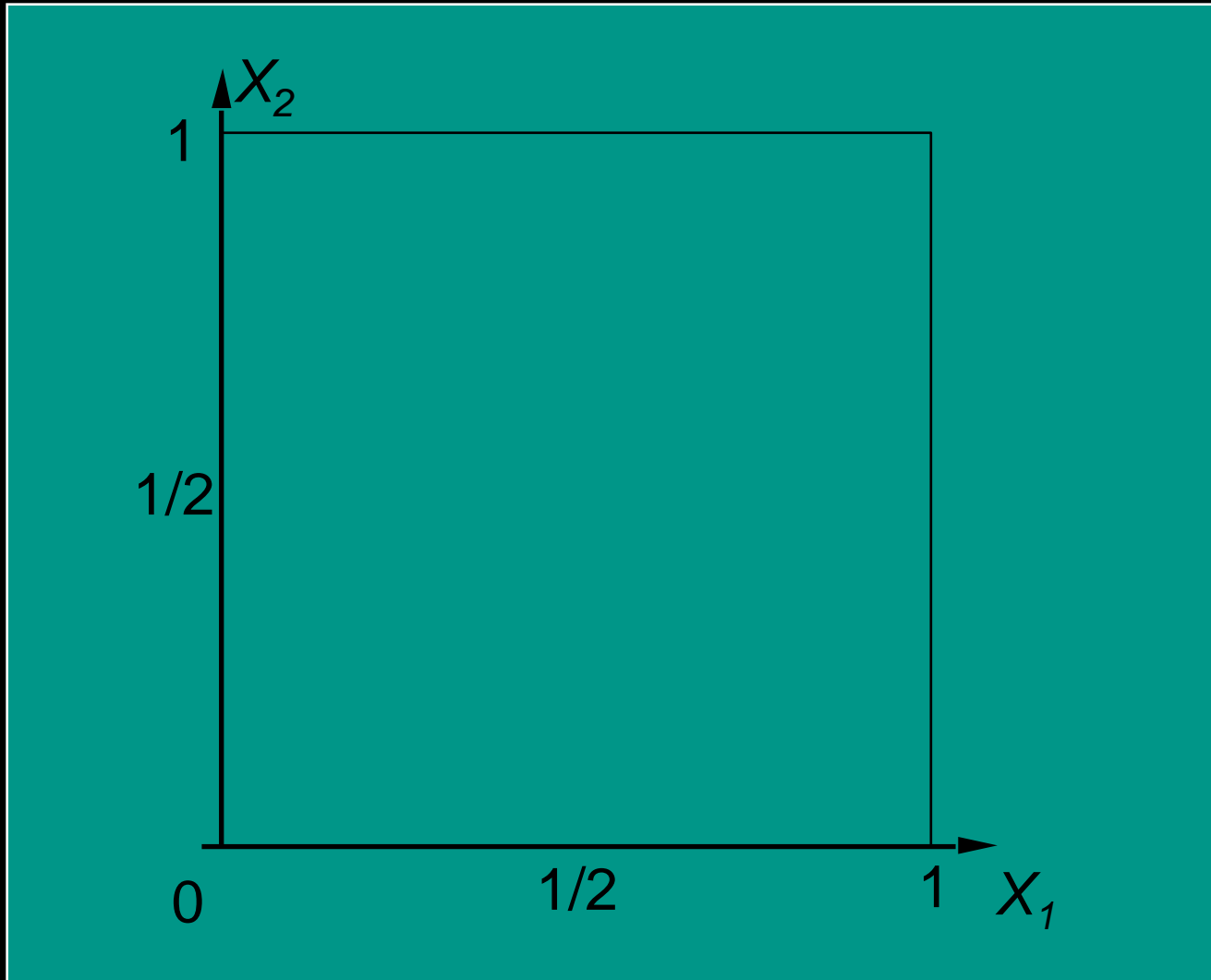


# 1. Random Variables:

$X_1$  = location of first mark

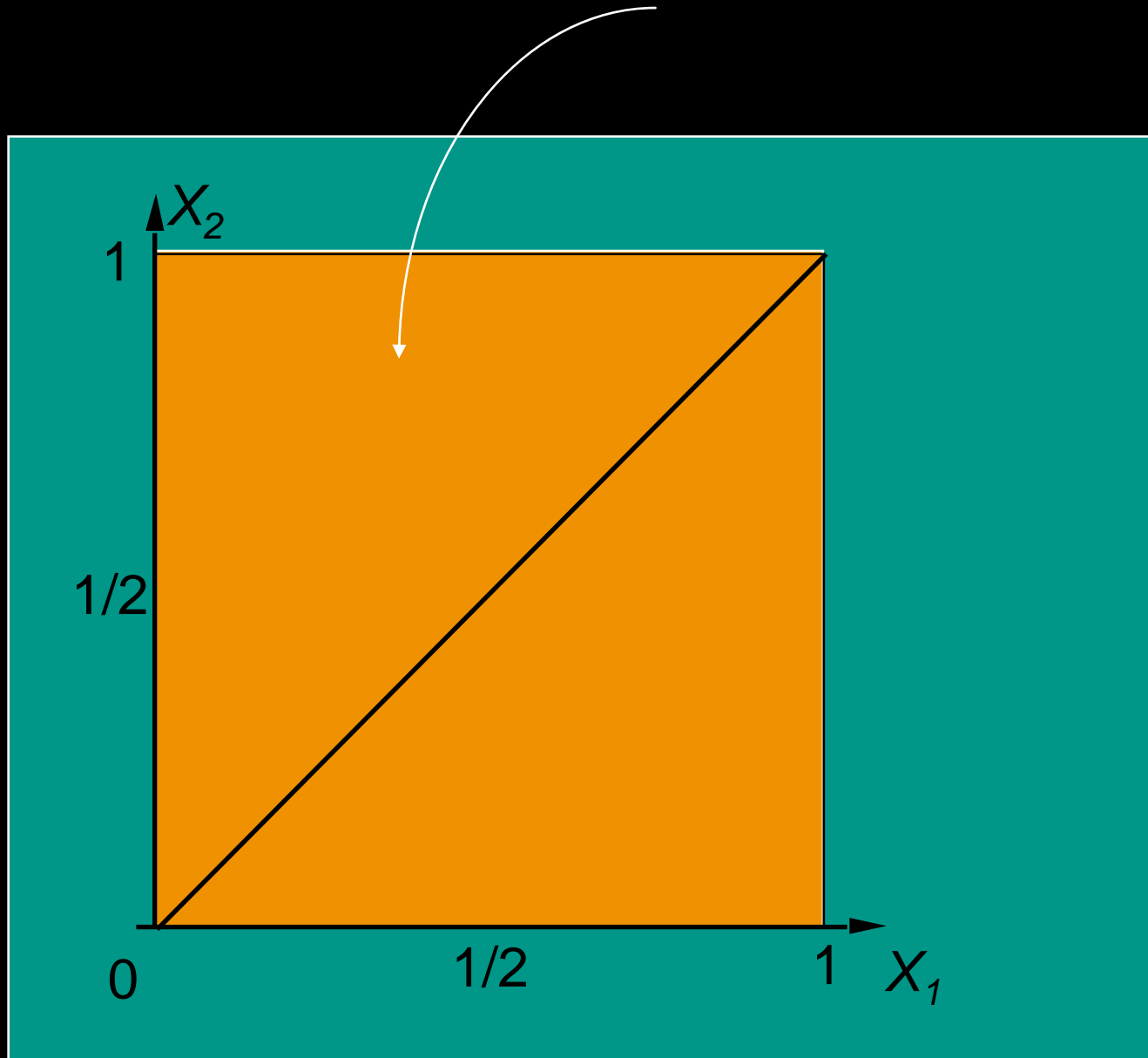
$X_2$  = location of second mark

# Step 2: Joint Sample Space



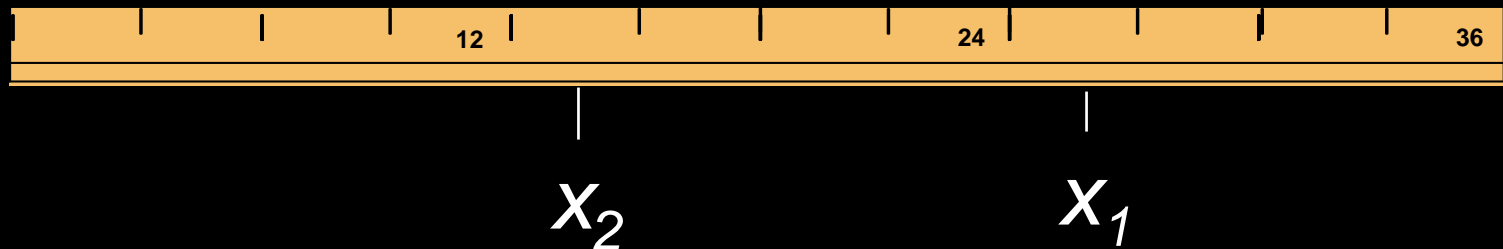


# Step 3: Probability Uniform over the Square



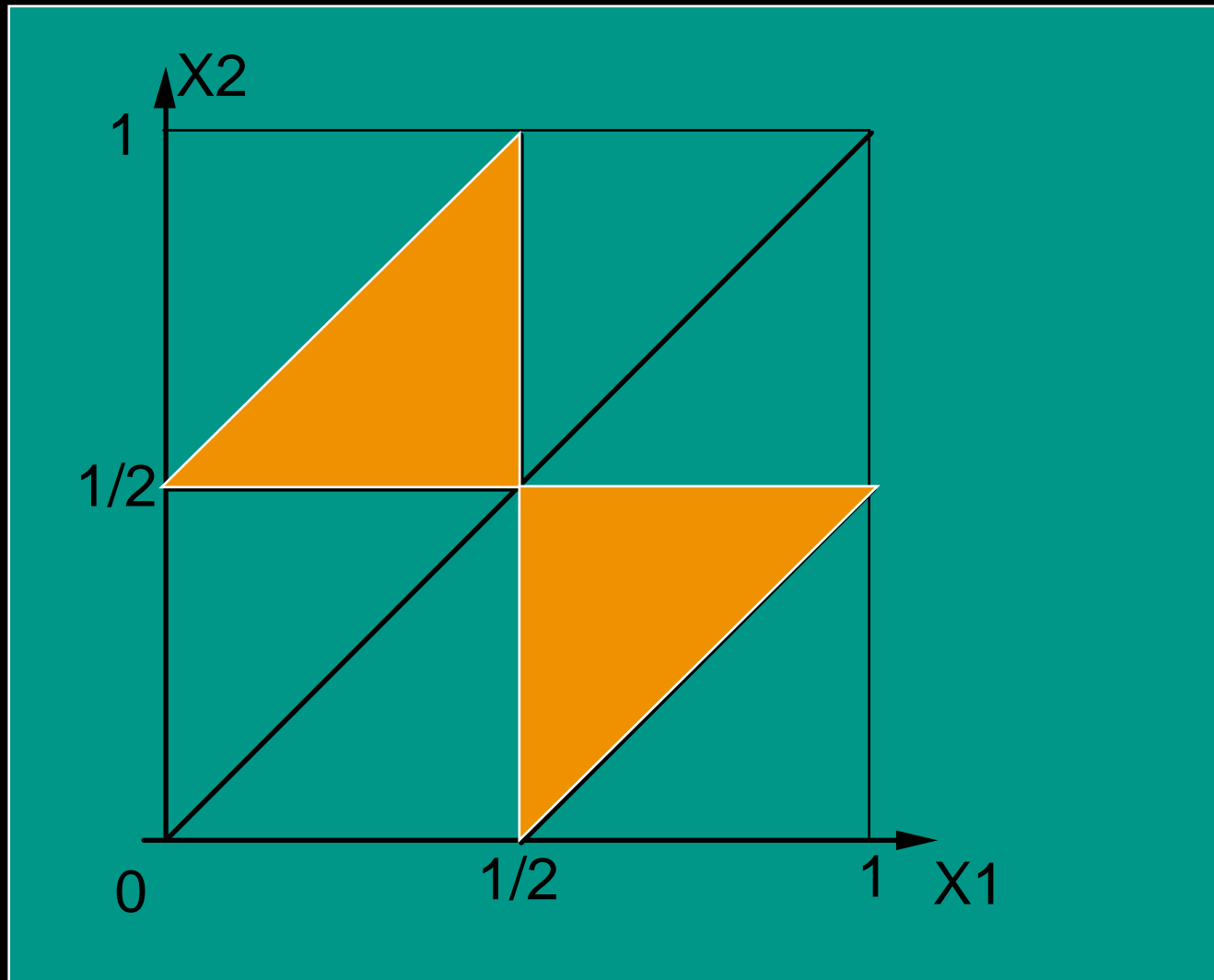
# Step 4: Carefully Work Within the Sample Space

- ◆ What conditions need to be satisfied so that a triangle can be formed?
- ◆ Suppose we consider first the case shown,  $x_1 > x_2$



# After Step 4, *HAPPINESS!*

[http://web.mit.edu/urban\\_or\\_book/www/animated-eg/stick/f1.0.html](http://web.mit.edu/urban_or_book/www/animated-eg/stick/f1.0.html)



# Functions of Random Variables

$$Y=3X-2Z$$

## 4 Steps:

1. Define the Random Variables
2. Identify the joint sample space
3. Determine the probability law over the sample space
4. Carefully work in the sample space to answer any question of interest

# 4 Steps: Functions of R.V.s

1. Define the Random Variables
2. Identify the joint sample space
3. Determine the probability law over the sample space
4. Carefully work in the sample space to answer any question of interest
  - 4a. Derive the CDF of the R.V. of interest, working in the original sample space whose probability law you know
  - 4b. Take the derivative to obtain the desired PDF

Photos of ambulance and a dispatch center removed due to copyright restrictions.

# Response Distance of an Ambulance

## ◆ 1. R.V.'s

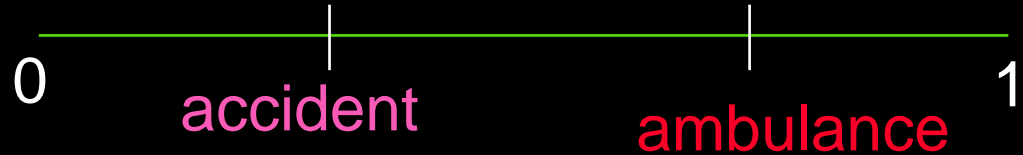
–  $X_1$  = location of the accident

–  $X_2$  = location of the ambulance

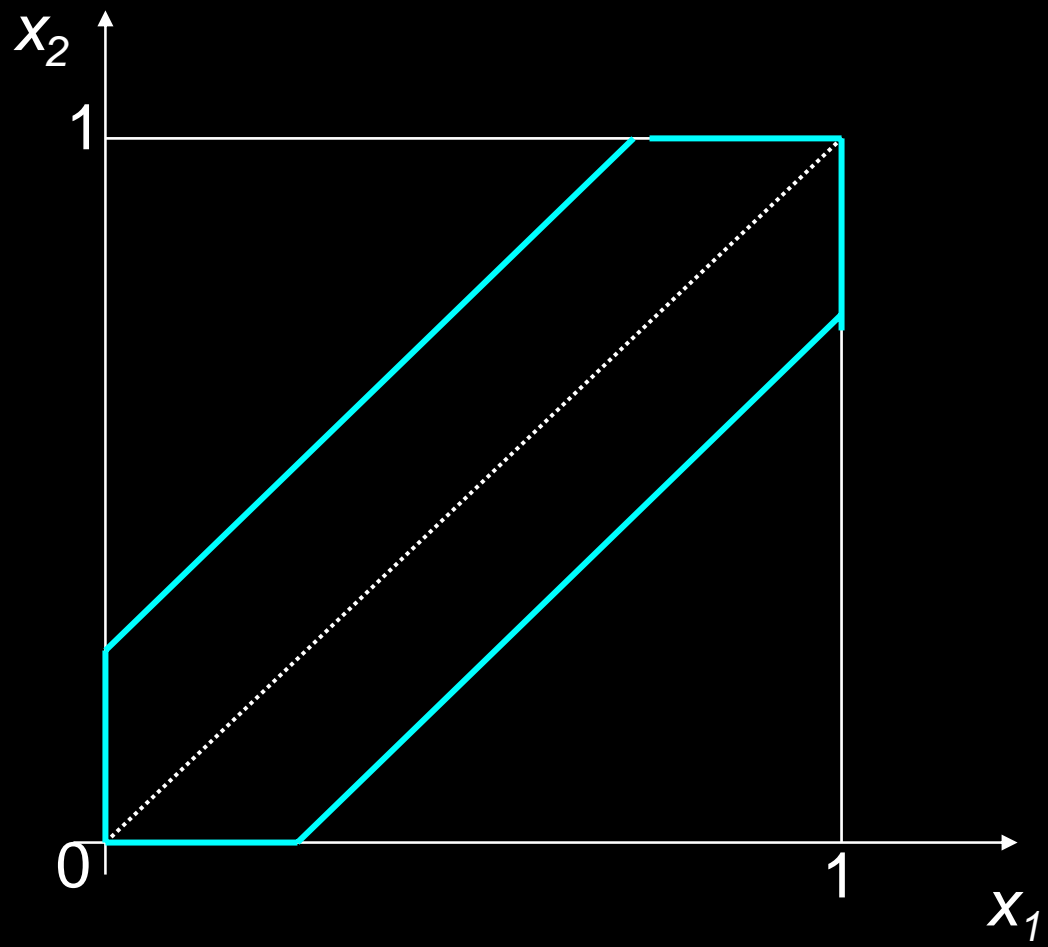
–  $D$  = response distance =  $|X_1 - X_2|$

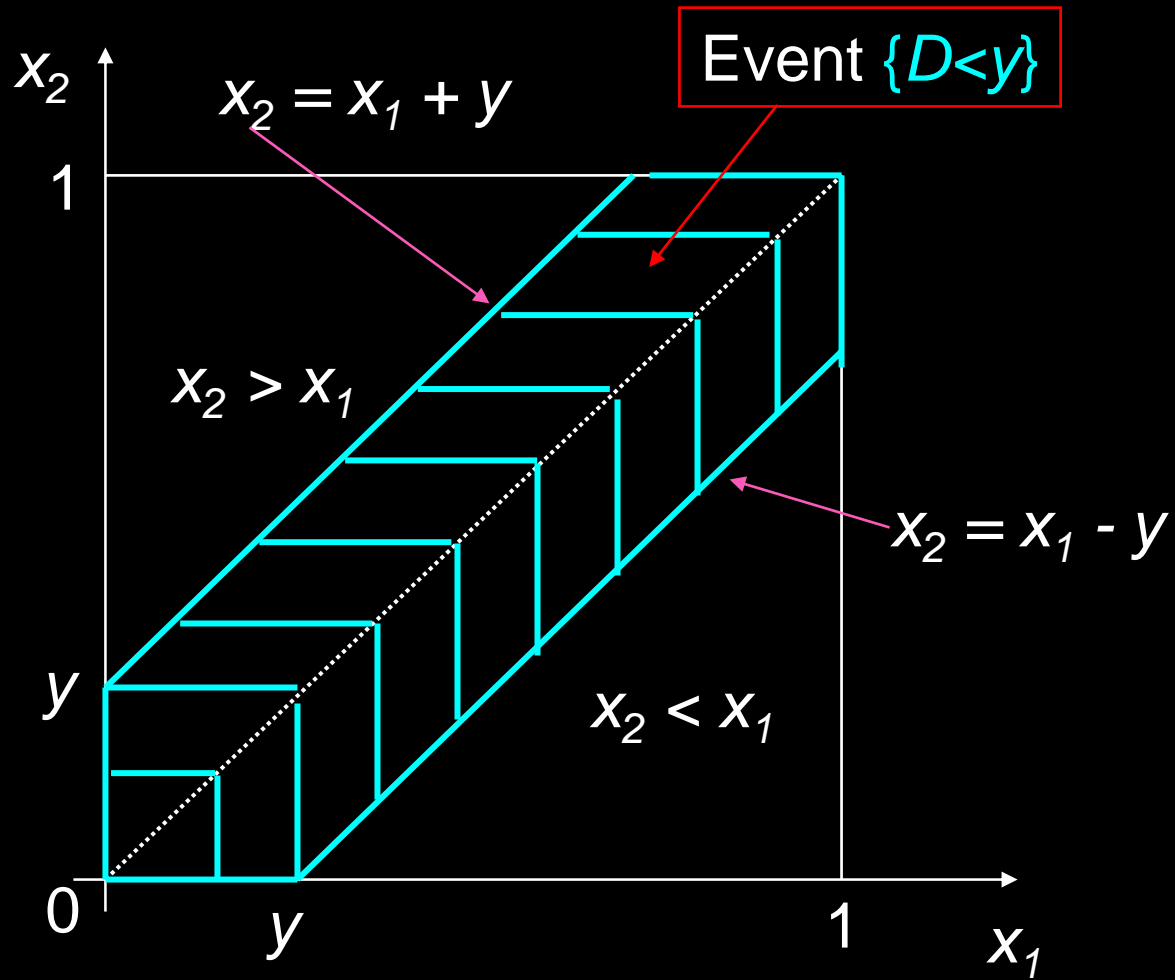
## ◆ 2. Joint sample space is unit square in $X_1 X_2$ plane

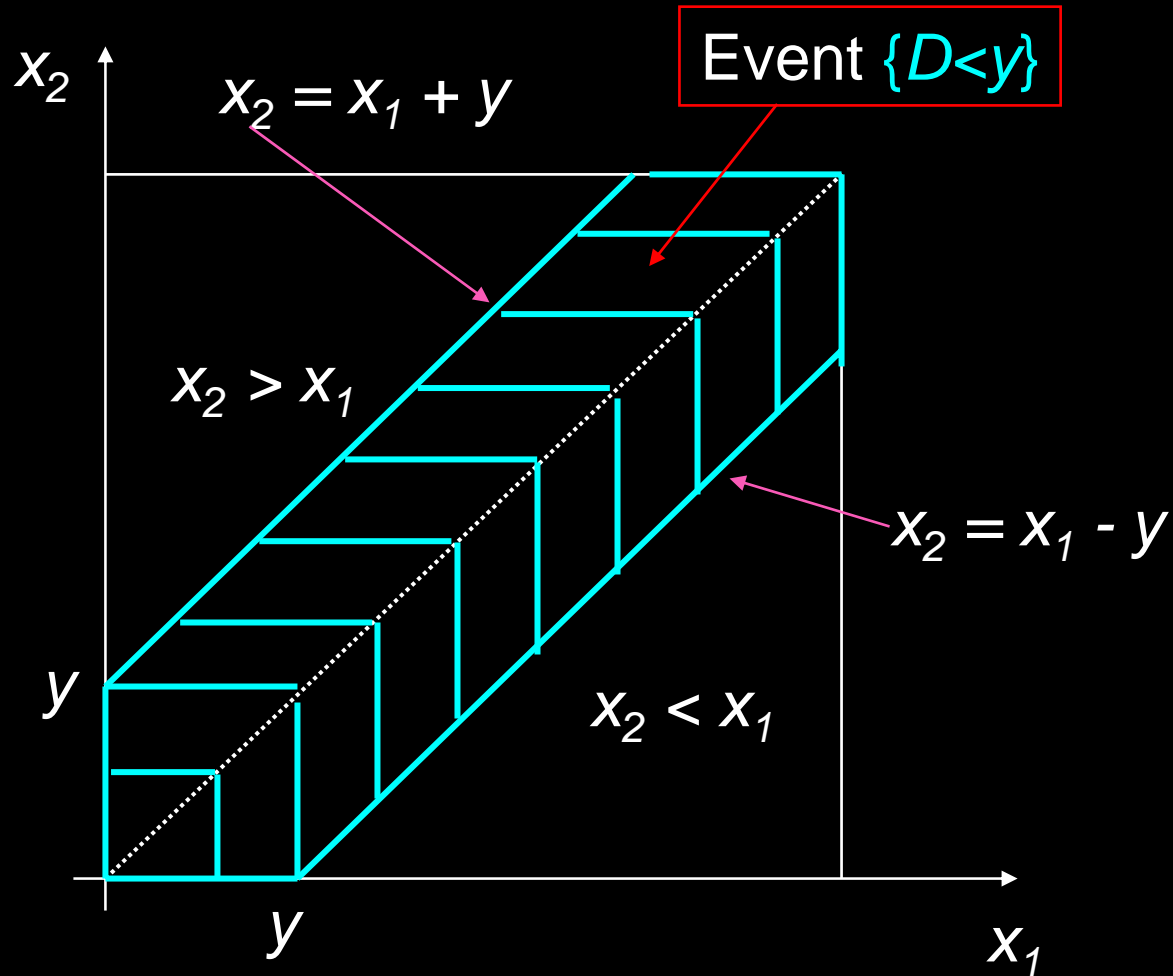
## ◆ 3. PDF over square is uniform





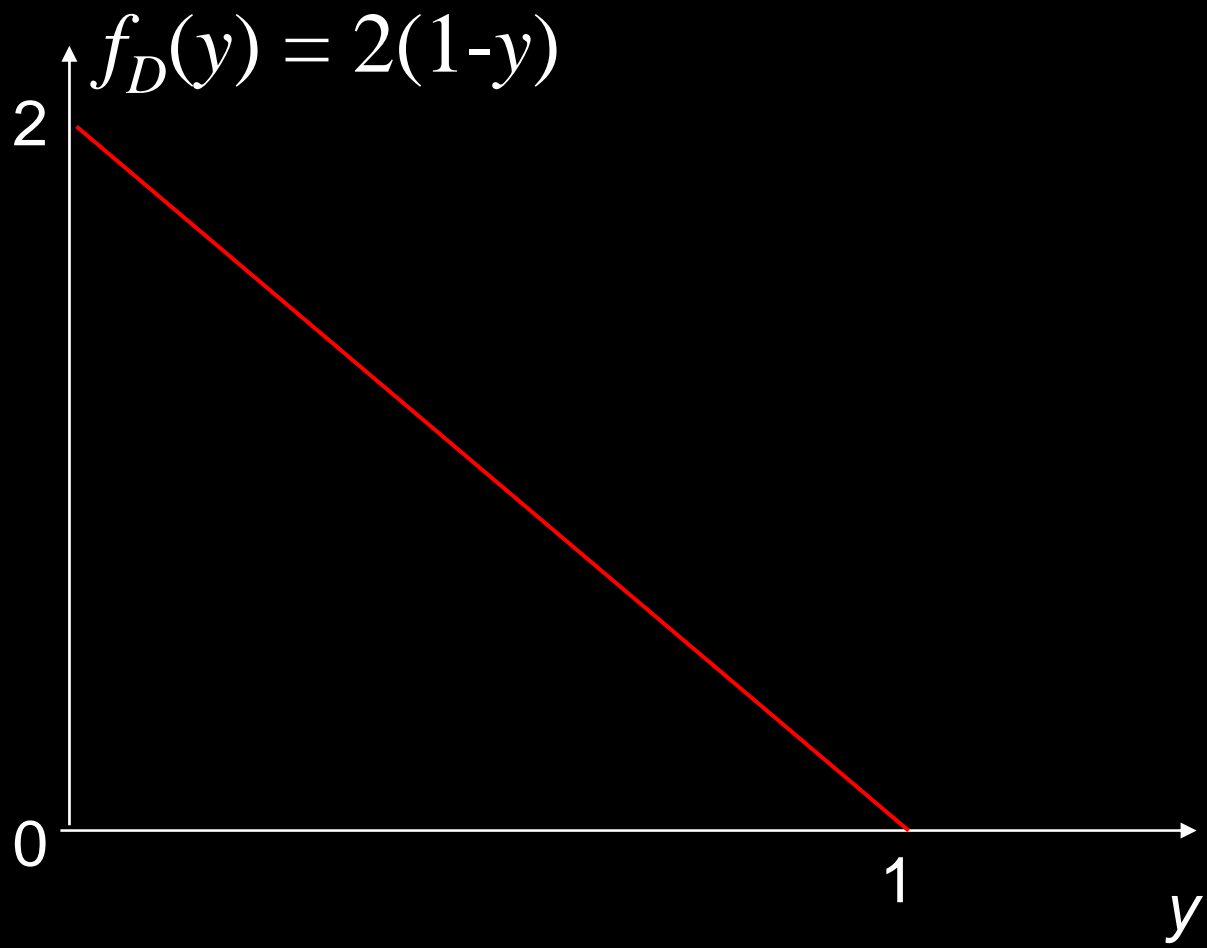






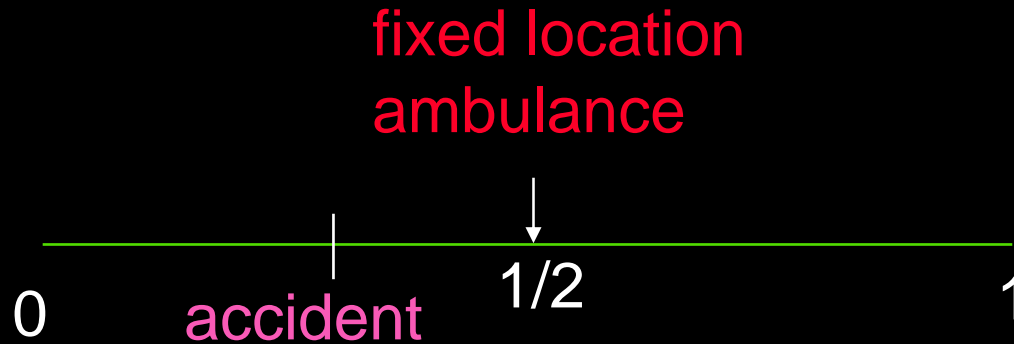
4.a  $F_D(y) = P\{D < y\} = 1 - (1-y)^2, 0 < y < 1$

4.b  $f_D(y) = 2(1-y), 0 < y < 1.$

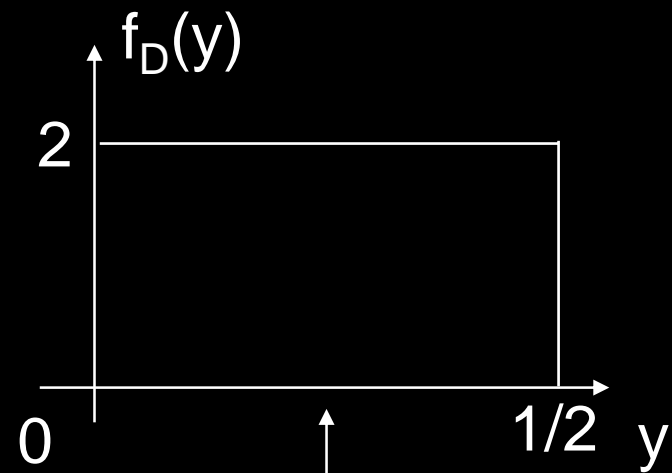
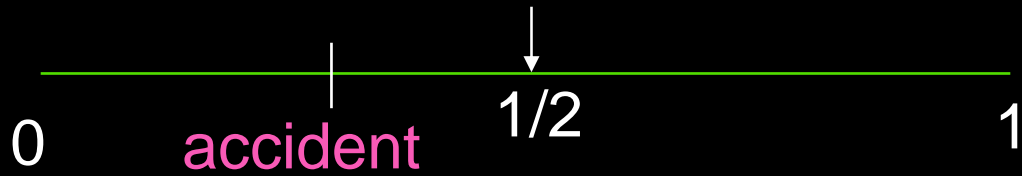


In previous problem,  $E[D] = 1/3$

What if we fix the location of the ambulance at  $X_2 = 1/2$ ?

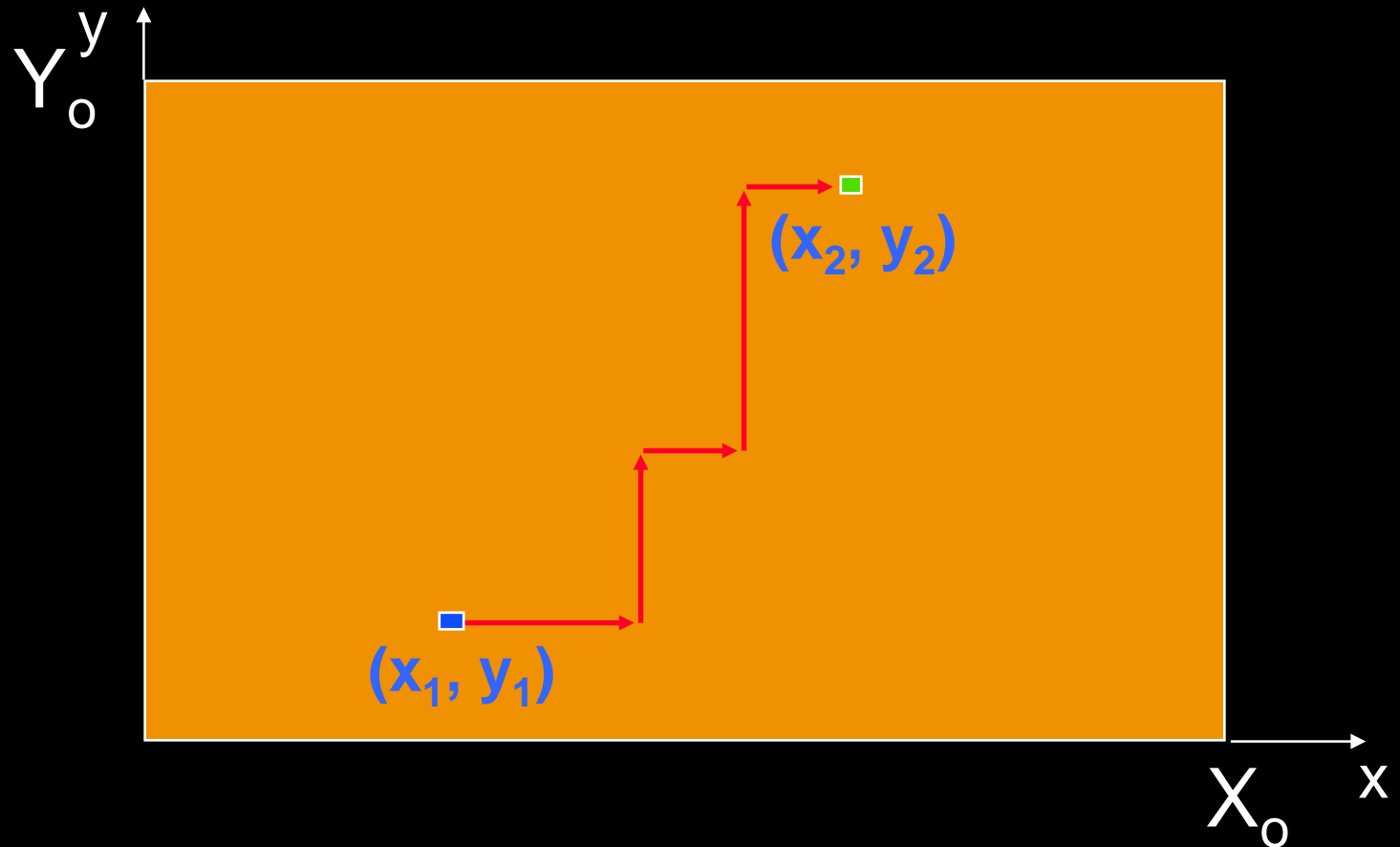


fixed location  
ambulance



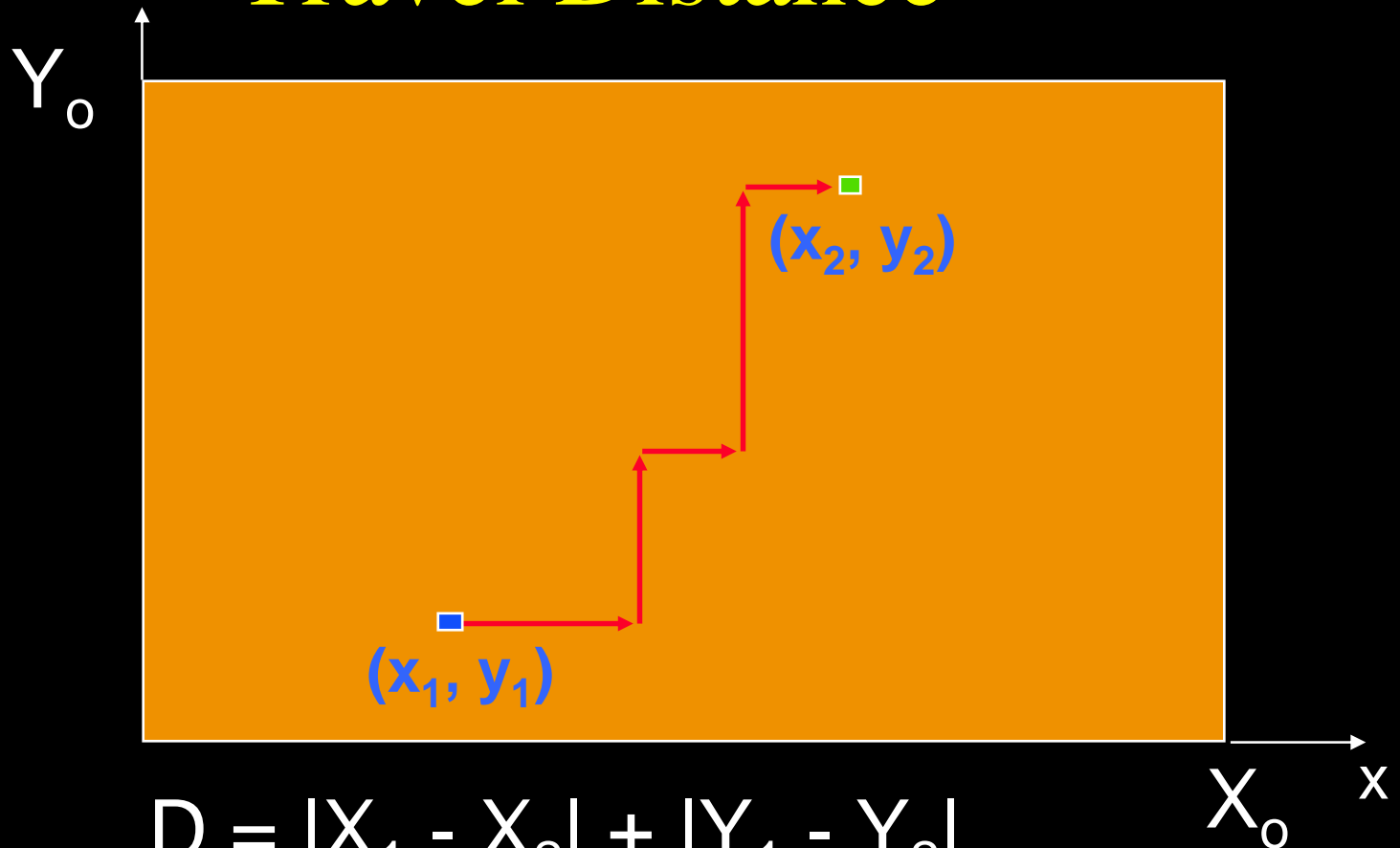
$E[D] = 1/4$ , a 25% reduction

# Rectangular Response Area



$$D = |X_1 - X_2| + |Y_1 - Y_2|$$

# Scaling to Get Expected Travel Distance



$$D = |X_1 - X_2| + |Y_1 - Y_2|$$

$$E[D] = E[|X_1 - X_2| + |Y_1 - Y_2|]$$

$$E[D] = (1/3)[X_0 + Y_0]$$



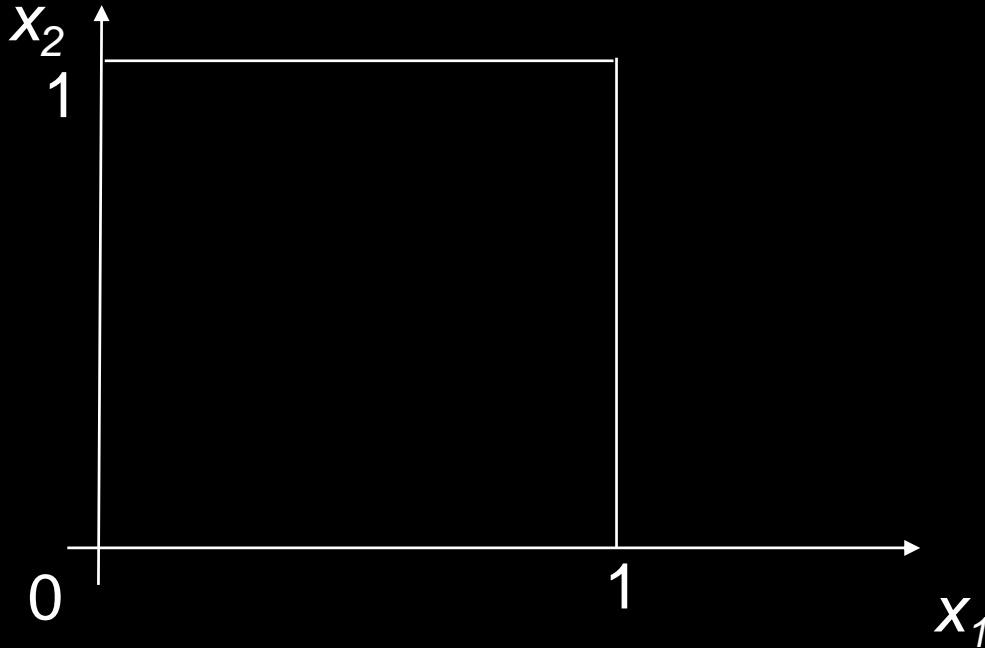
# More Examples of Functions of Random Variables



# 1. Define the Random Variables

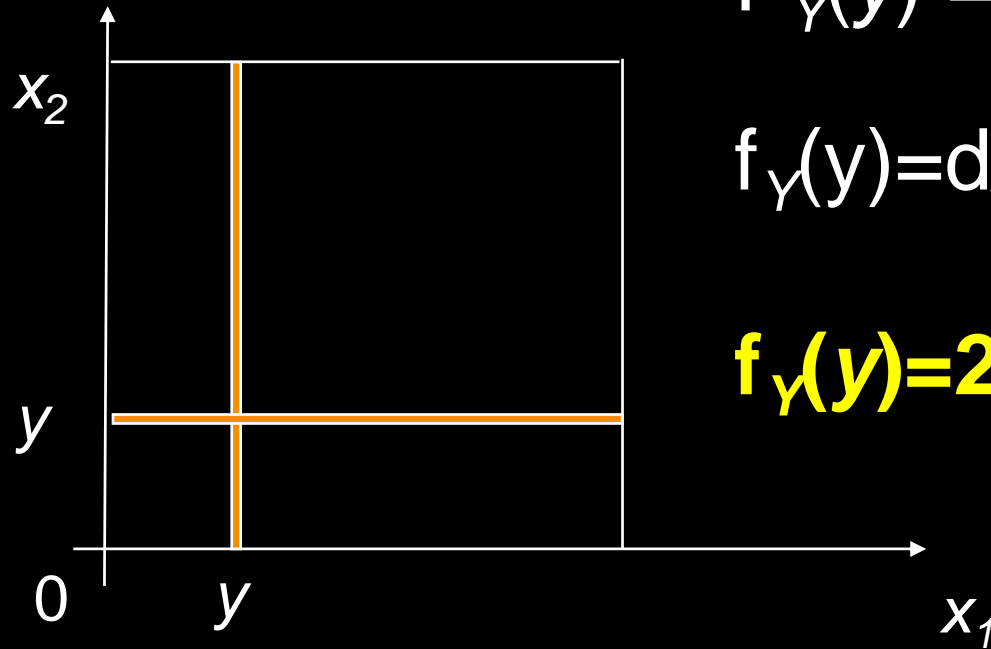
$Y = \text{MIN}\{X_1, X_2\}$ , where  $X_1$  and  $X_2$  are iid uniform over  $[0,1]$

- Identify the joint sample space



3. Determine the probability law over the sample space - uniform

4. Carefully work in the sample space to answer any question of interest.



$$F_Y(y) = P\{Y < y\} = 1 - (1 - y)^2$$

$$f_Y(y) = d/dy [F_Y(y)]$$

$$f_Y(y) = 2(1 - y), \quad 0 < y < 1$$

**4a. Derive the CDF of the R.V. of interest, working in the original sample space whose probability law you know**

**4b Take the derivative to obtain the desired PDF**

*Now suppose*

$Y = \text{MIN}\{X_1, X_2, X_3, \dots, X_N\}$ , where  $X_i$  are iid uniform over  $[0, 1]$

$$F_Y(y) = P\{Y < y\} = 1 - P\{Y > y\}$$

$$F_Y(y) = 1 - (1 - y)^N$$

$$f_Y(y) = (d/dy) F_Y(y) = N(1 - y)^{N-1}; \quad N = 1, 2, \dots$$
$$0 < y < 1$$



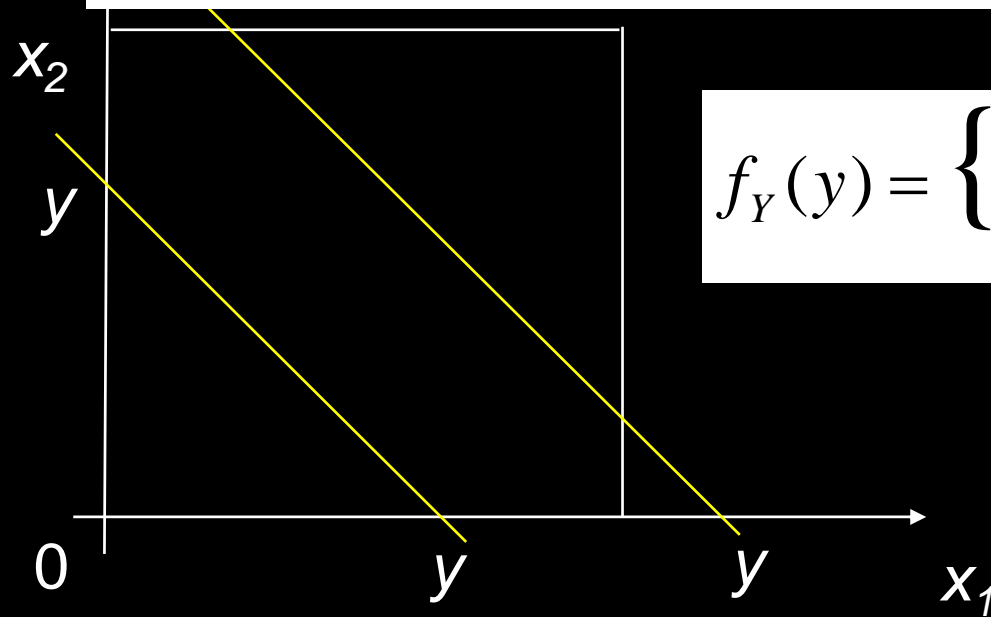
# Sums of Random Variables



Now let

$Y = X_1 + X_2$ , where  $X_1$  and  $X_2$  are iid uniform over  $[0, 1]$

$$F_Y(y) = P\{Y \leq y\} = \begin{cases} y^2/2 & 0 \leq y \leq 1 \\ 1 - (2-y)^2/2 & 1 \leq y \leq 2 \end{cases}$$



$$f_Y(y) = \begin{cases} y & 0 \leq y \leq 1 \\ 2-y & 1 \leq y \leq 2 \end{cases}$$

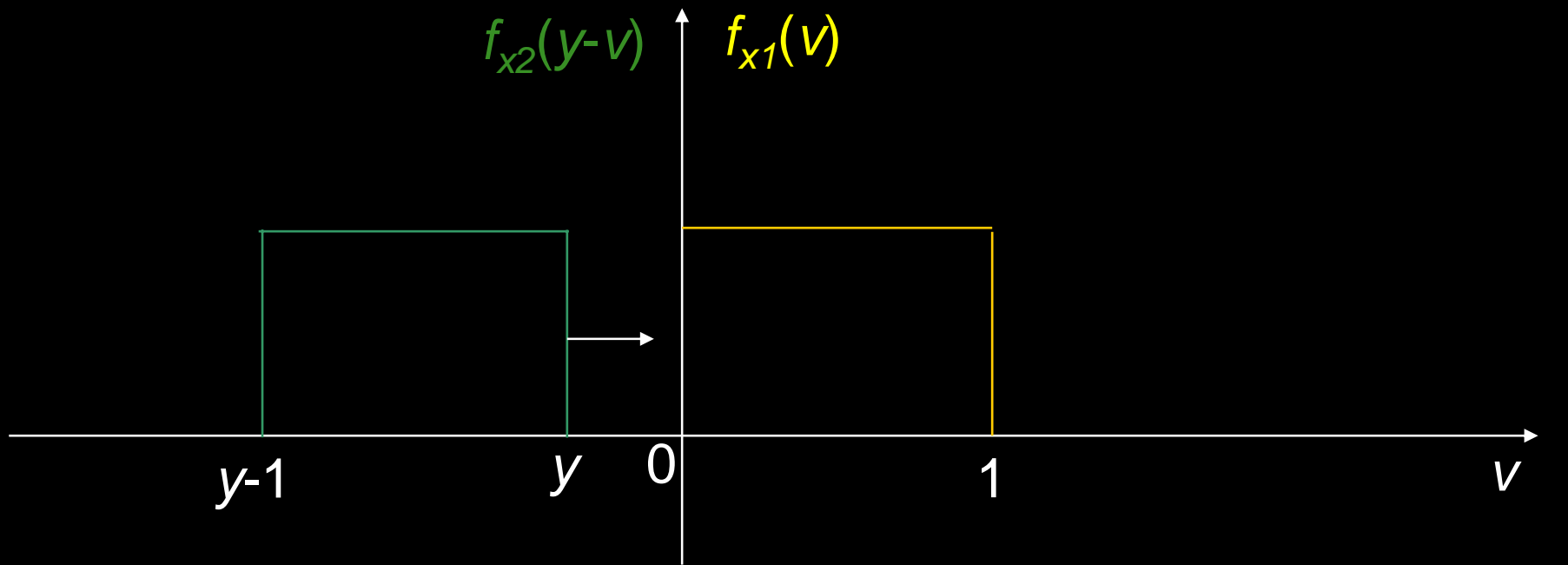
$$f_Y(y)dy = \int_{v=0}^{v=1} f_{x_1}(v) f_{x_2}(y-v) dv dy$$

Convolution

$$f_Y(y) = \begin{cases} y & 0 \leq y \leq 1 \\ 1-y & 1 \leq y \leq 2 \end{cases}$$

Convolution

$$f_Y(y)dy = \int_{v=0}^{v=1} f_{x_1}(v)f_{x_2}(y-v)dvdy$$

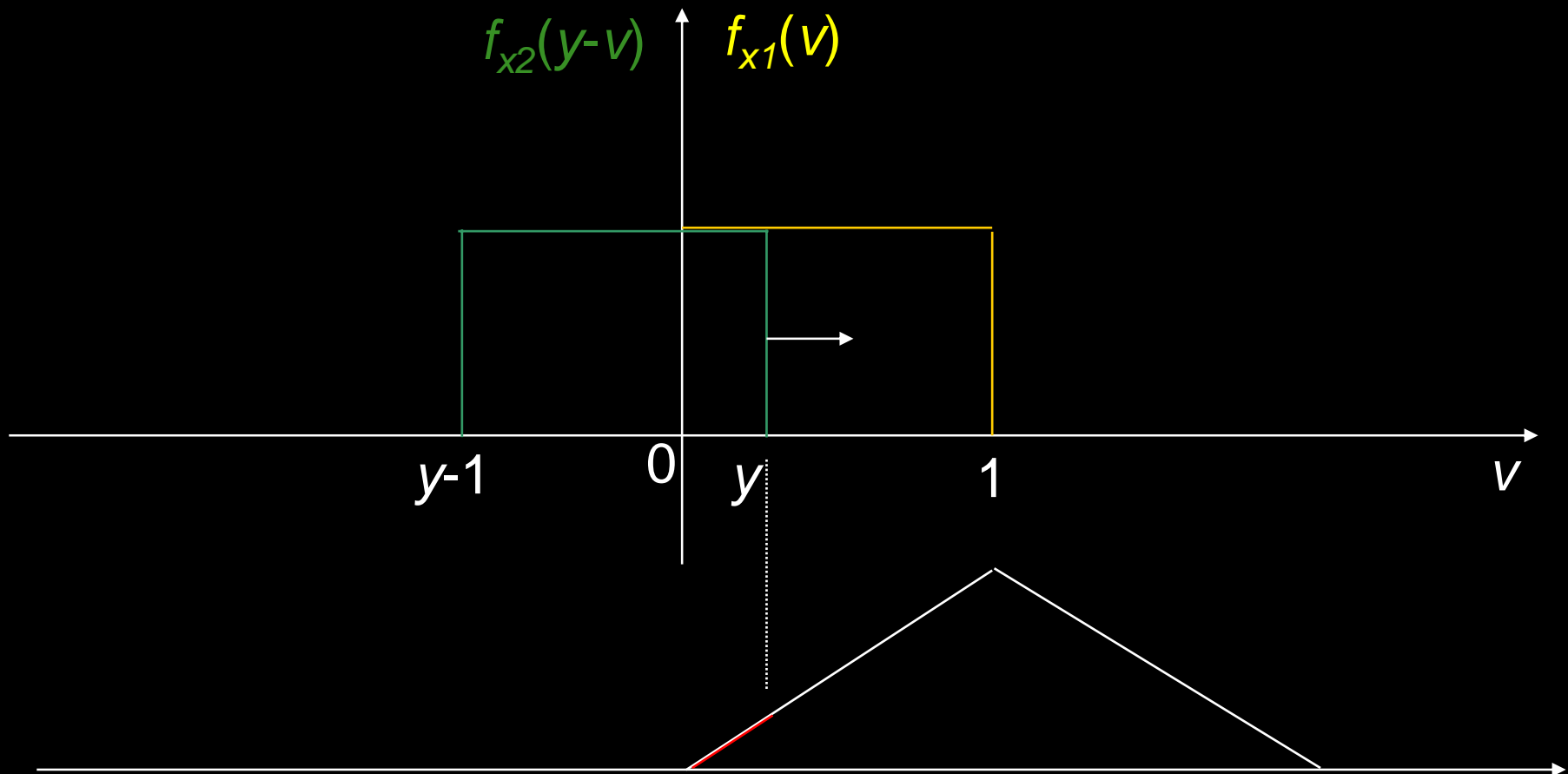




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Convolution

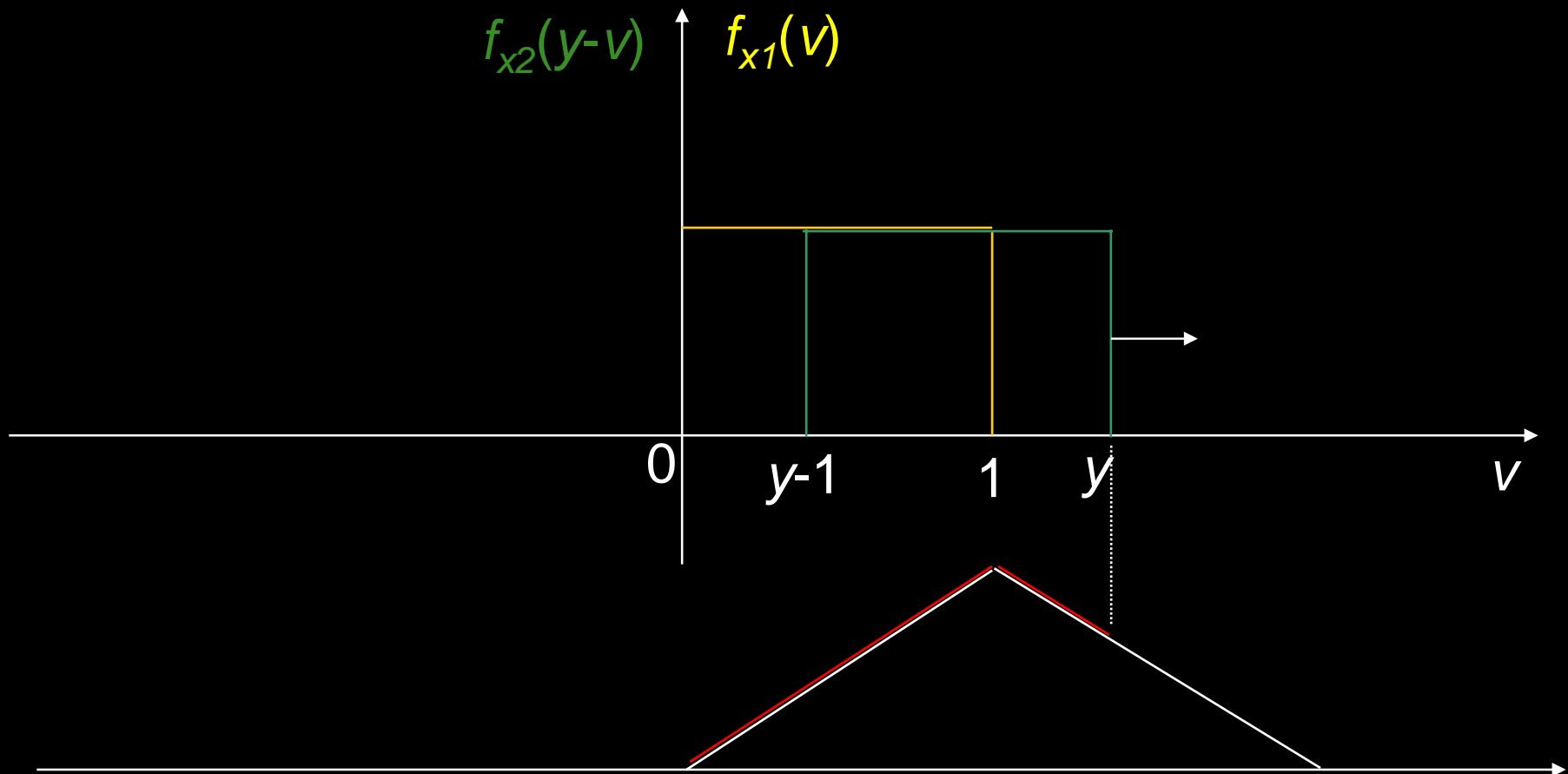
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$$f_Y(y) = \begin{cases} y & 0 \leq y \leq 1 \\ 1-y & 1 \leq y \leq 2 \end{cases}$$

Convolution

$$f_Y(y)dy = \int_{v=0}^{v=1} f_{x_1}(v)f_{x_2}(y-v)dvdy$$



# A Quantization Problem

# Barges in Action



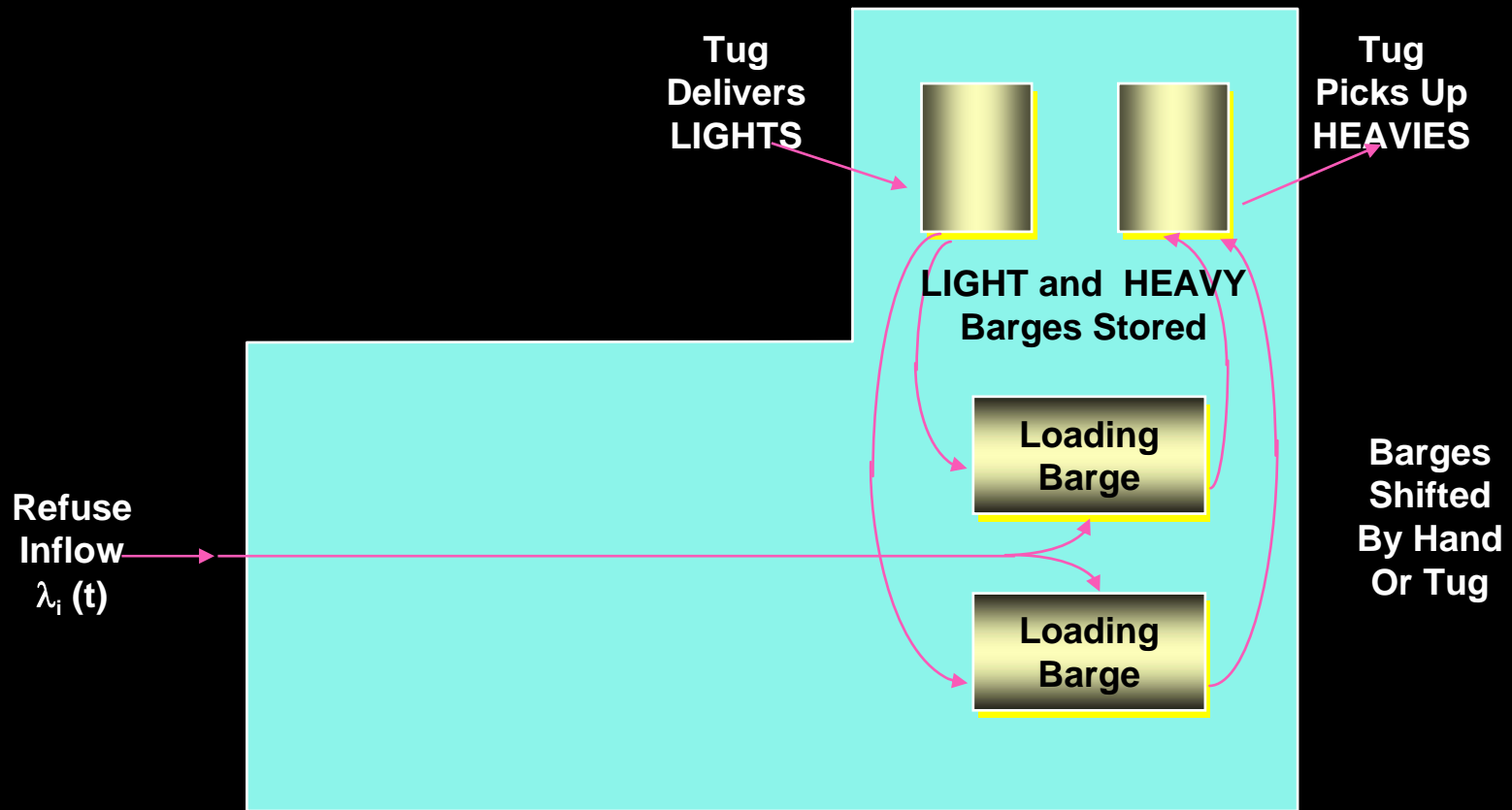
Photo courtesy of Eddie Codel.  
<http://www.flickr.com/photos/ekai/15899569/>

# Marine Transfer Station



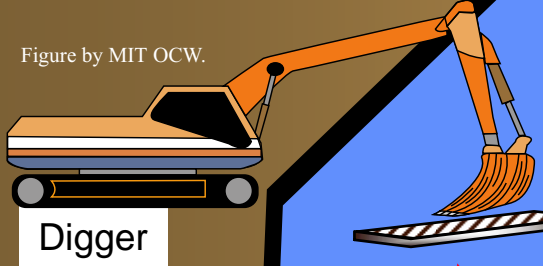
Courtesy of Dattner Architects. Used with permission.

# NYC Marine Transfer Station

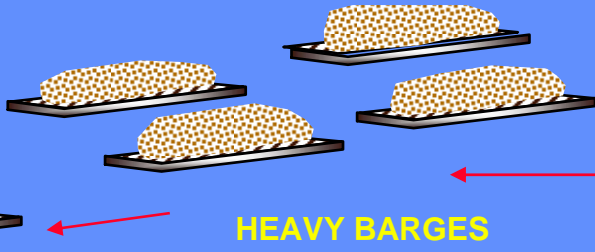


# Fresh Kills Landfill

Figure by MIT OCW.

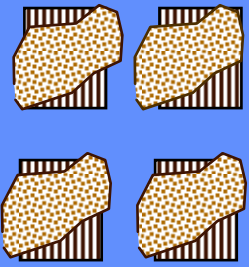


Digger



HEAVY BARGES

UNLOADING BARGE



HEAVY BARGES

UNLOADING BARGE

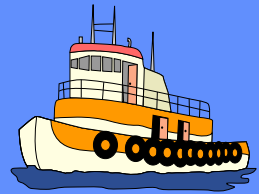


Figure by MIT OCW.

TUG DELIVERS HEAVIES

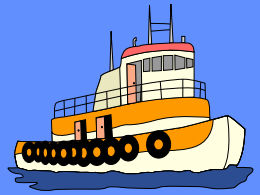


Figure by MIT OCW.

TUGS PICK UP LIGHTS

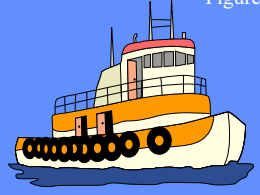
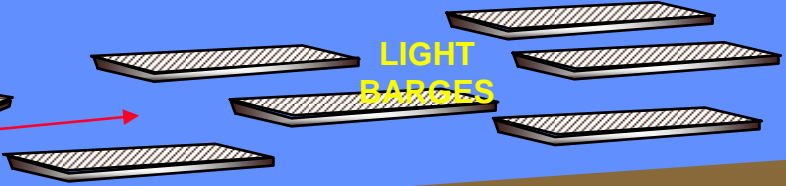


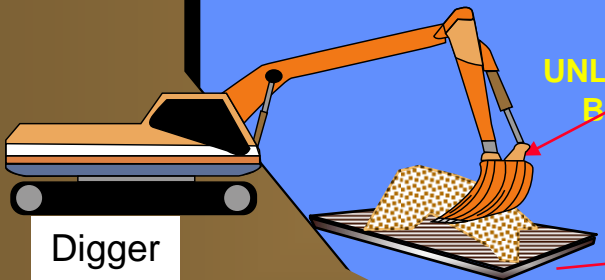
Figure by MIT OCW.

LIGHT BARGES



Digger

REFUSE UNLOADED



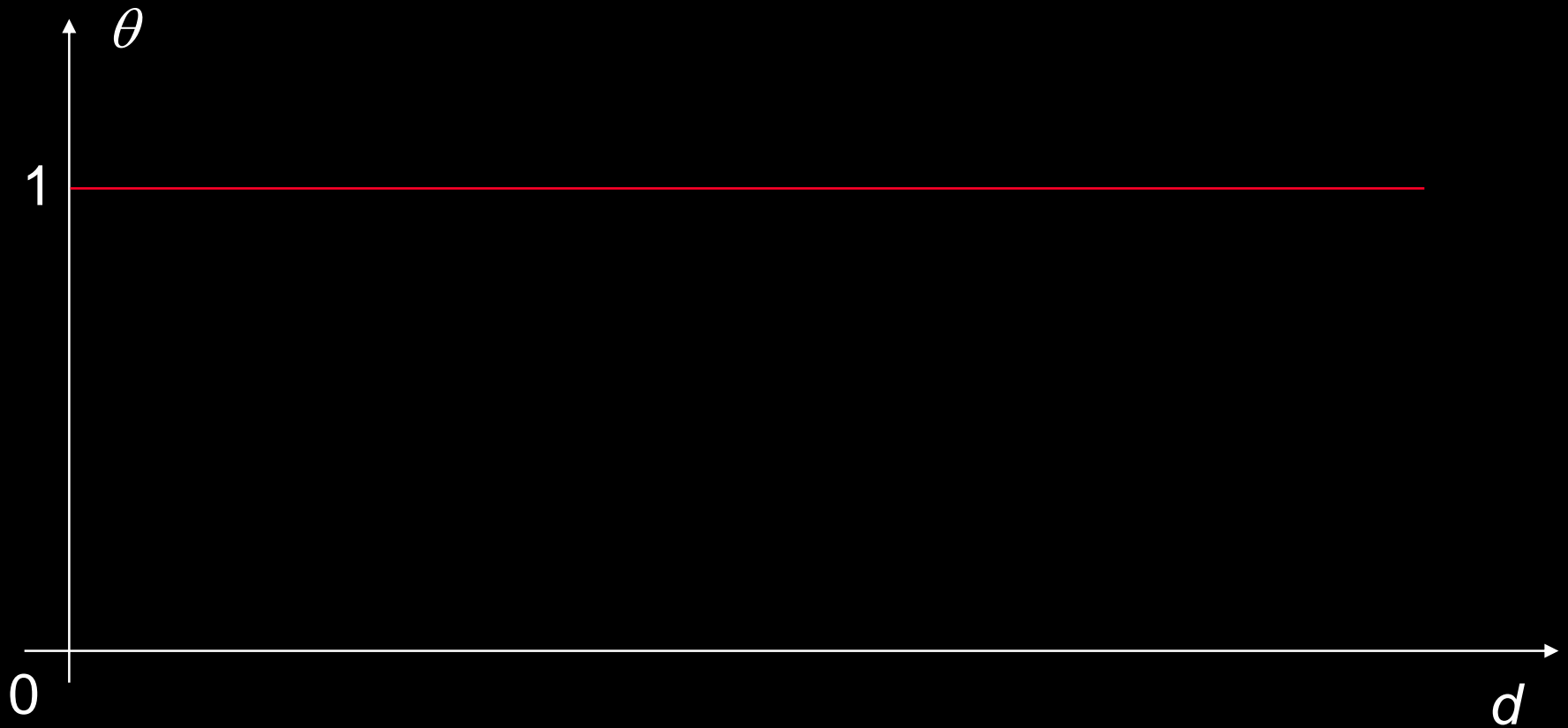
REFUSE UNLOADED

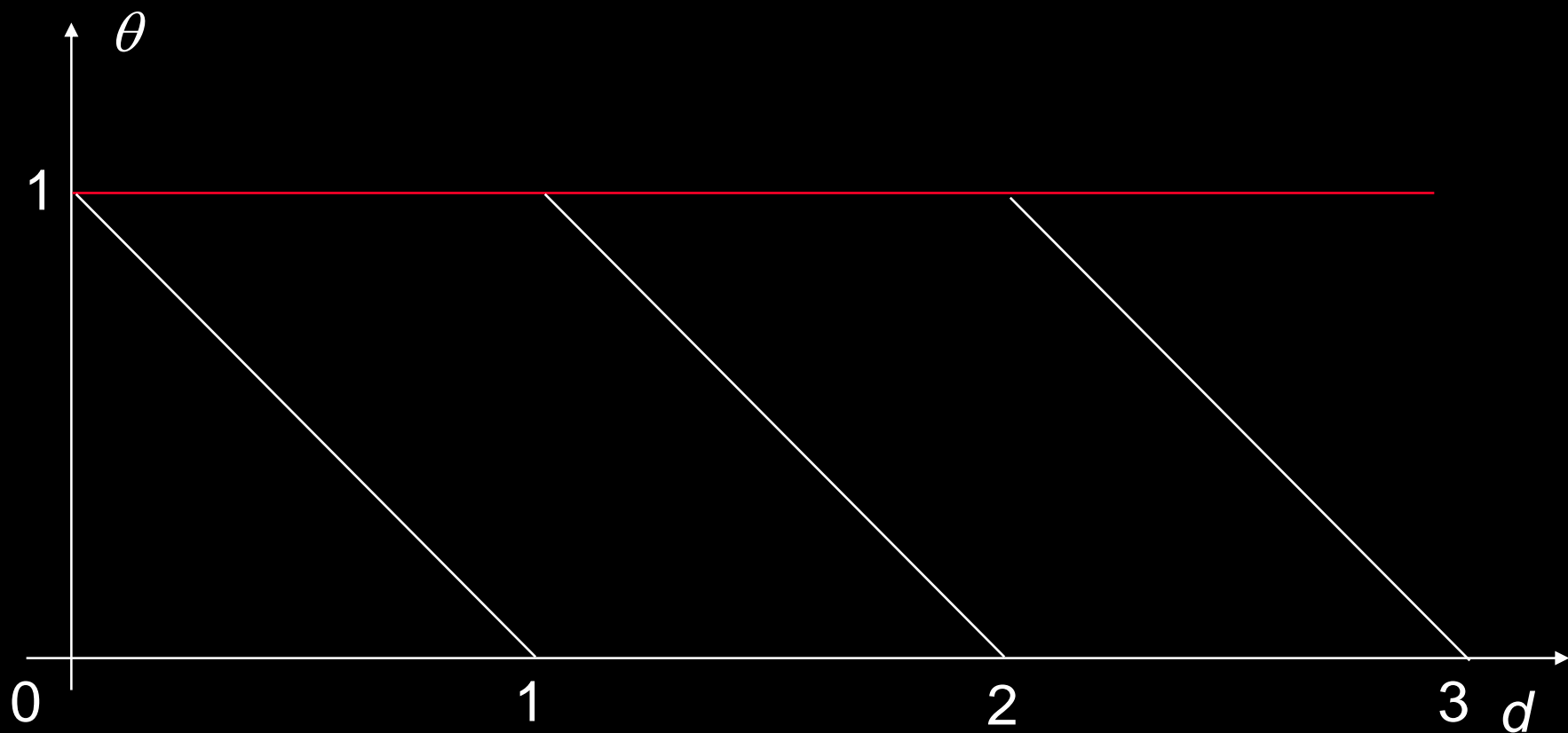
# 1. The R.V.'s

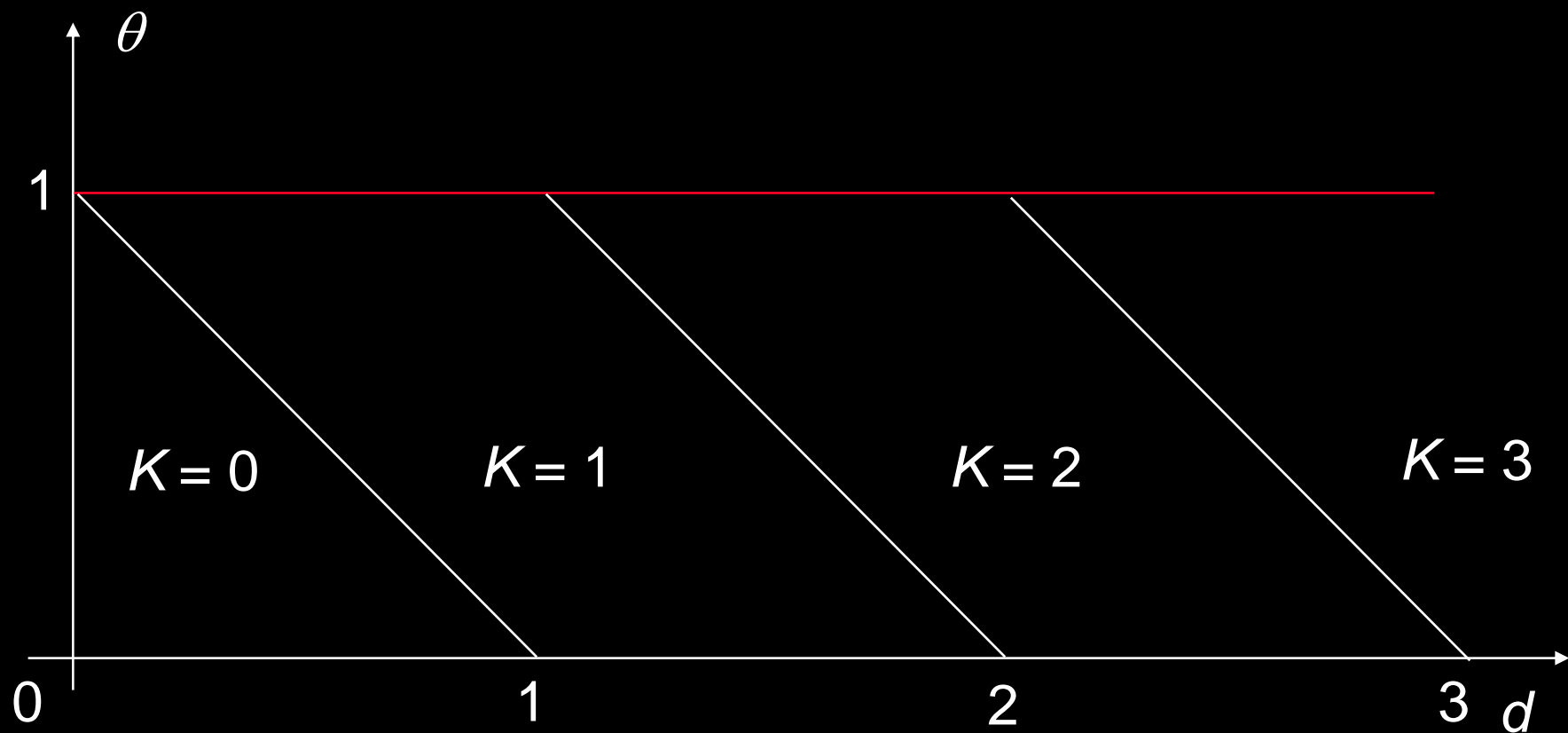
- ◆  $D$  = barge loads of garbage produced on a random day (continuous r.v.)
- ◆  $\Theta$  = fraction of barge that is filled at beginning of day ( $0 < \Theta < 1$ )
- ◆  $K$  = total number of completely filled barges produced by a facility on a random day ( $K$  integer)
- ◆  $K = \lceil D + \Theta \rceil$  = integer part of  $D + \Theta$



## 2. The Sample Space



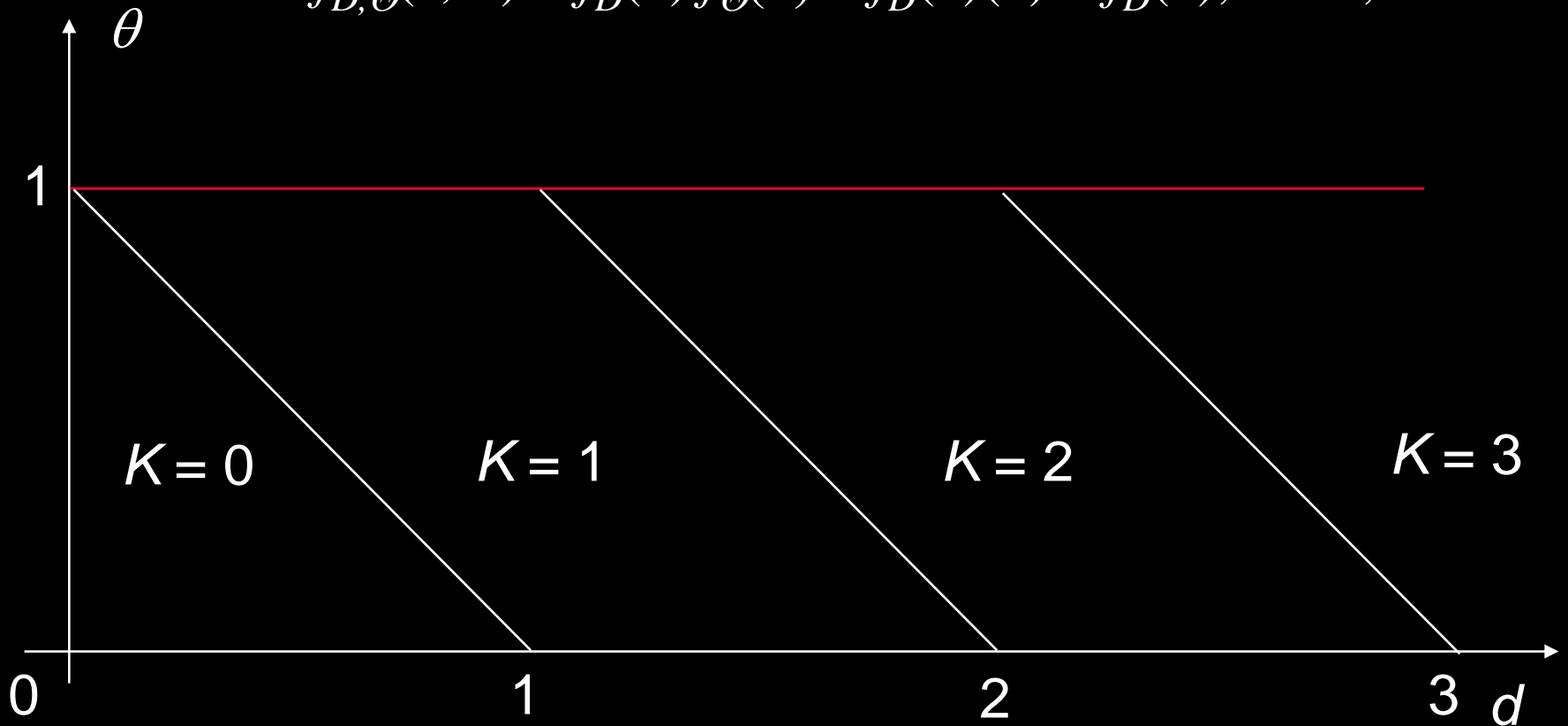




### 3. Joint Probability Distribution

- a)  $D$  and  $\Theta$  are independent.
- b)  $\Theta$  is uniformly distributed over  $[0, 1]$

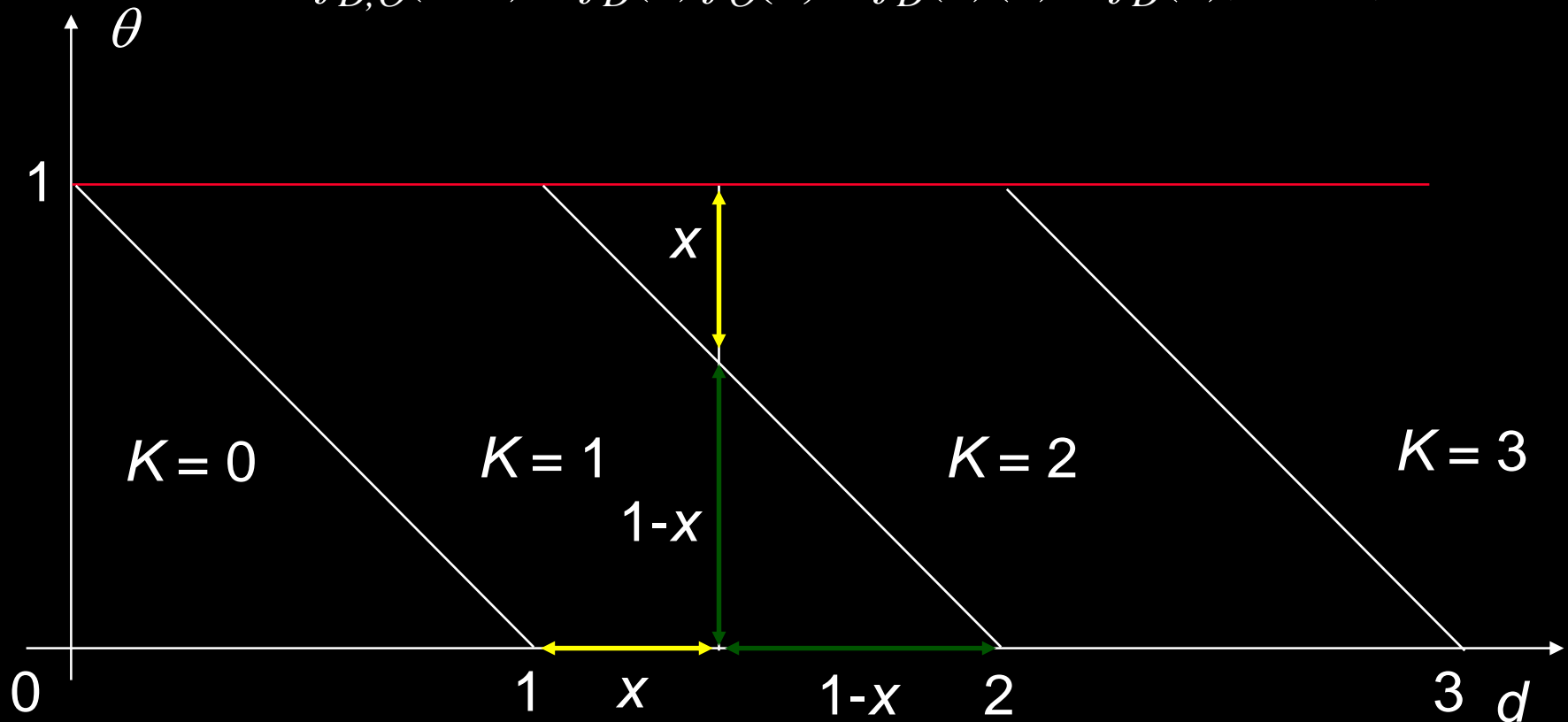
$$f_{D,\Theta}(d, \theta) = f_D(d) f_{\Theta}(\theta) = f_D(d)(1) = f_D(d), \quad d > 0, 0 < \theta < 1$$



### 3. Joint Probability Distribution

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## 4. Working in the Joint Sample Space

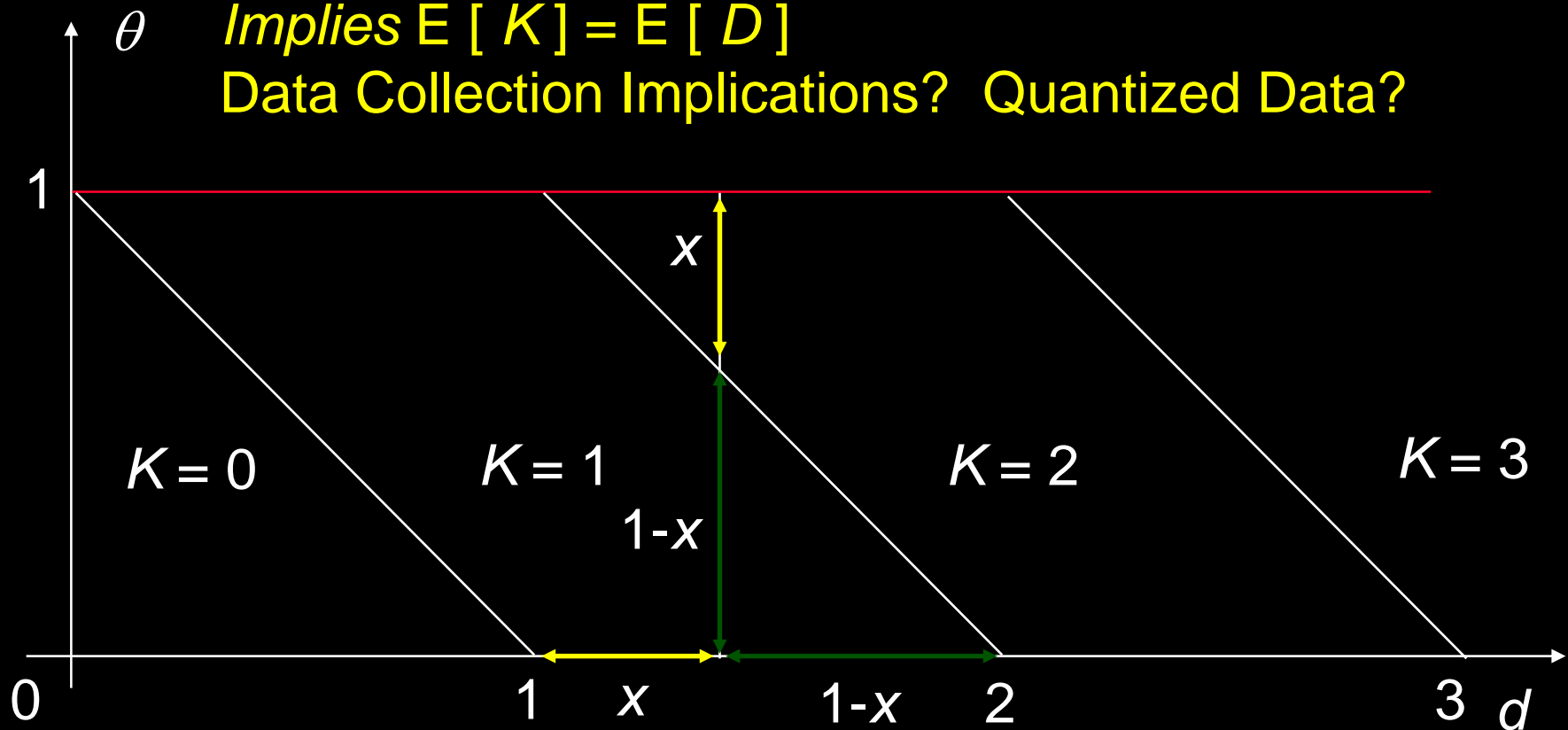
Look at  $E[K | D = d]$

Let  $d = i + x$   $0 < x < 1$

$$E[K | D = i + x] = i(1 - x) + (i + 1)x = i + x = d$$

**Implies  $E[K] = E[D]$**

**Data Collection Implications? Quantized Data?**



# What Have We Learned Today?

## 4 Steps: Functions of R.V.s

1. Define the Random Variables
2. Identify the joint sample space
3. Determine the probability law over the sample space
4. Carefully work in the sample space to answer any question of interest
  - 4a. Derive the CDF of the R.V. of interest, working in the original sample space whose probability law you know
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