

Probability Inequalities

The

\$64,000

Question

Three Axioms

Inequalities

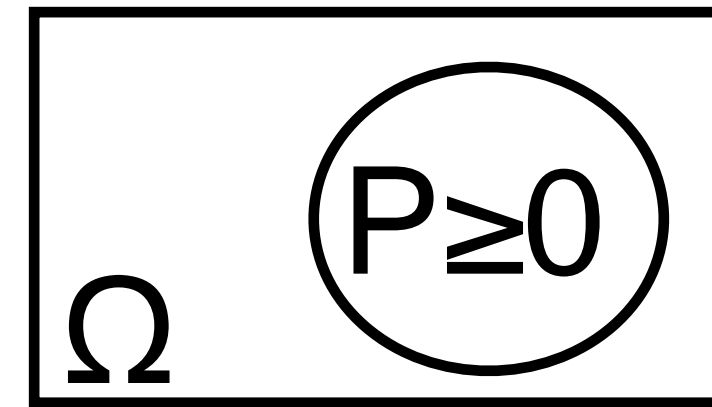
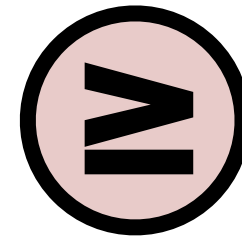
Union bound

\$1.4M question

Three Axioms

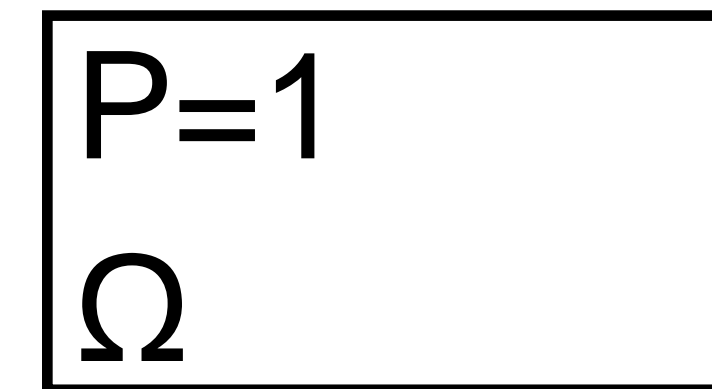
Non-negativity

$$P(A) \geq 0$$



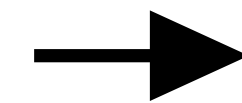
Unitarity

$$P(\Omega) = 1$$

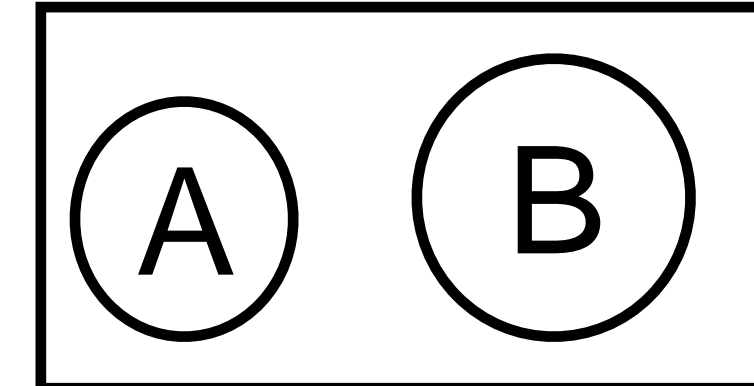
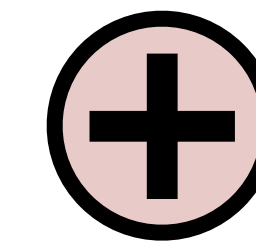


Addition rule

A, B disjoint



$$P(A \cup B) = P(A) + P(B)$$

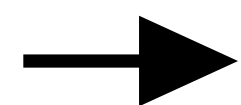


A_1, A_2, \dots disjoint



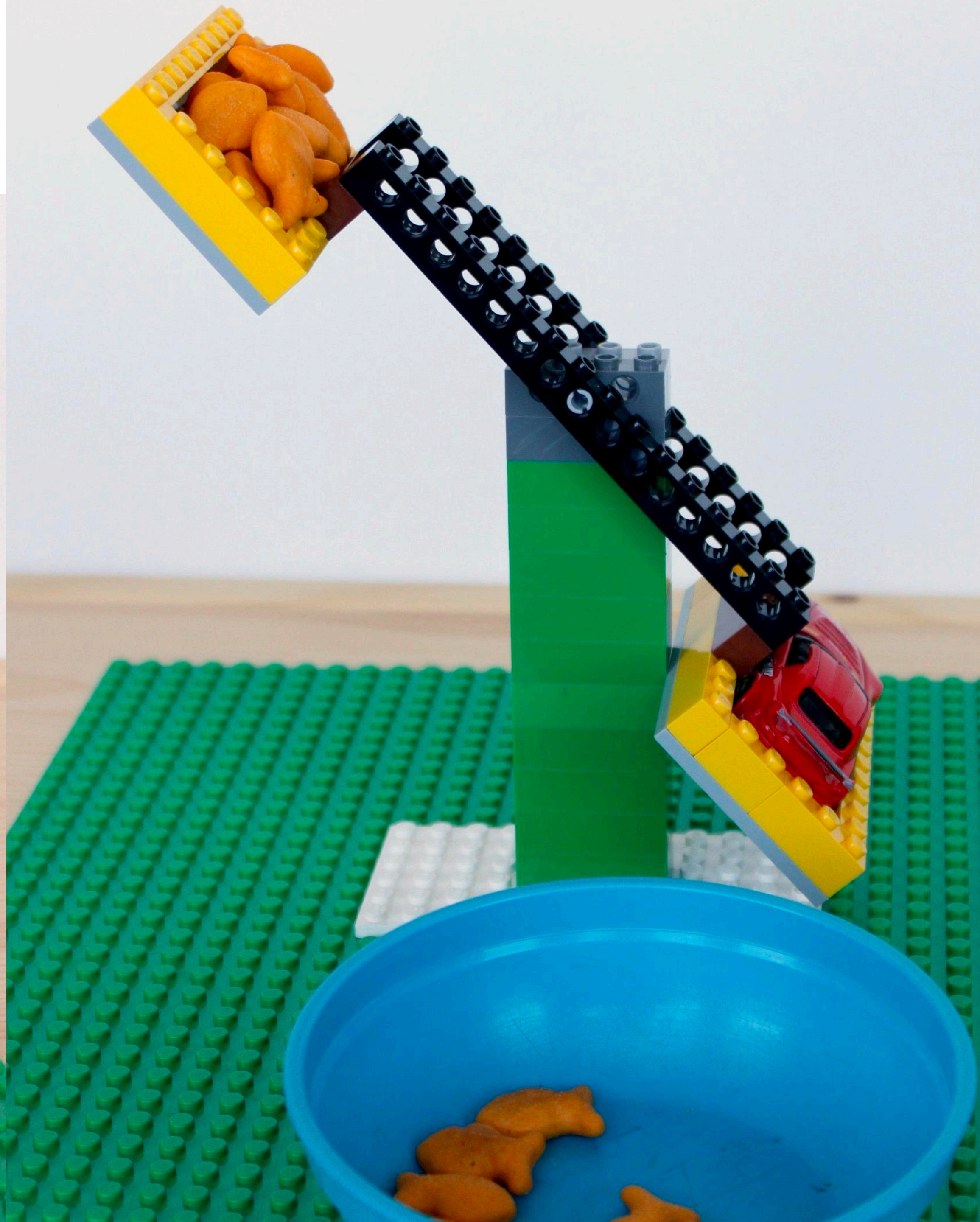
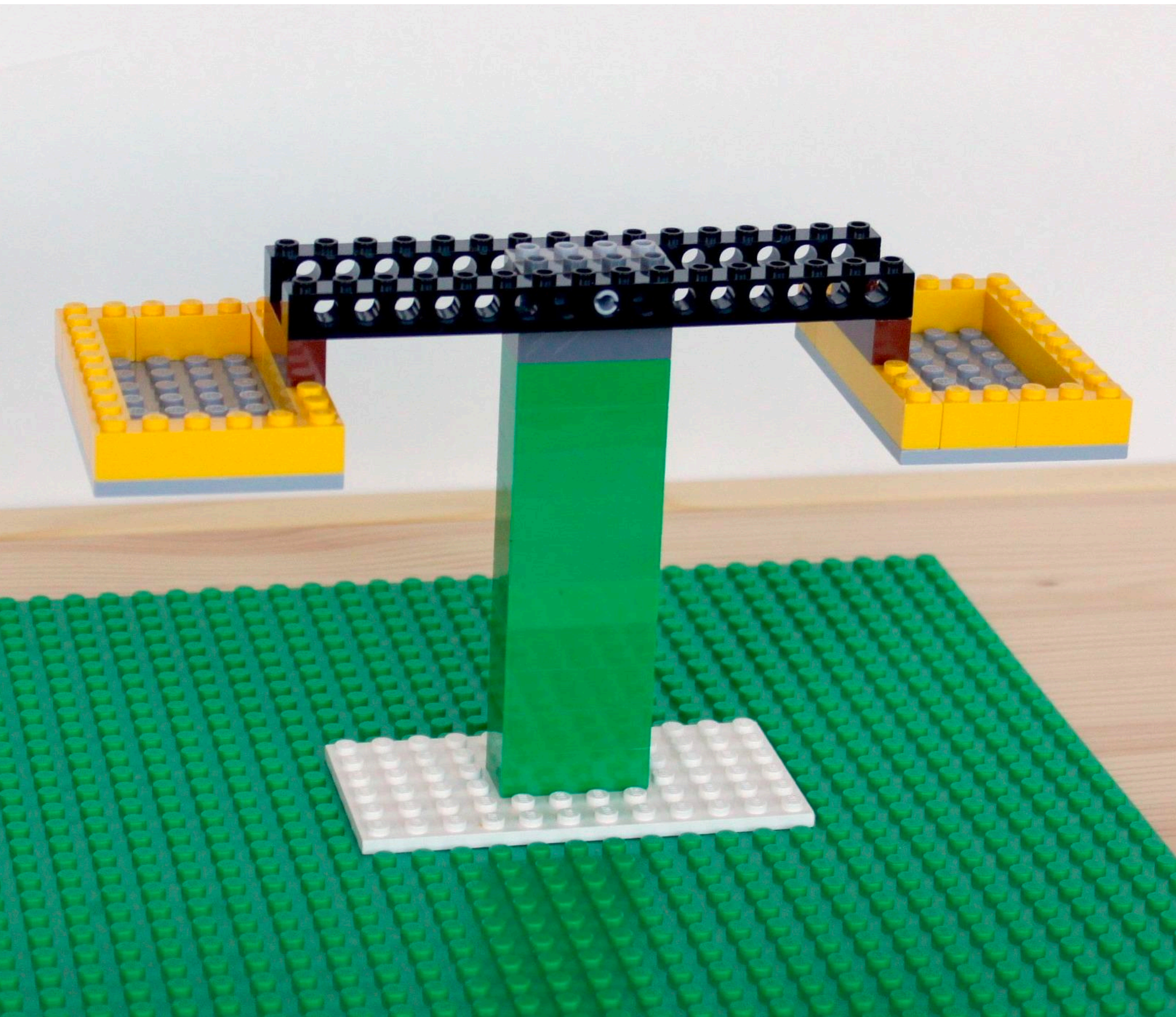
$$P(A_1 \cup A_2 \cup \dots) = P(A_1) + P(A_2) + \dots$$

Equalities



Inequalities

Inequalities



Probability of Null Event

① $P(\Omega) = 1$

What about $P(\emptyset)$?

$$\Omega = \emptyset \cup \Omega$$

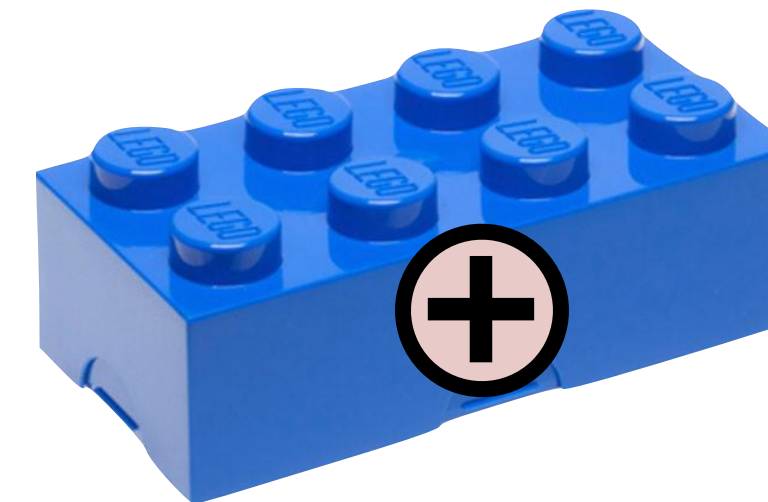
$P(\cancel{\Omega}) = P(\overset{\text{red}}{\emptyset} \overset{\text{yellow}}{\cup} \overset{\text{plus}}{\Omega}) = P(\emptyset) + P(\cancel{\Omega})$

$$P(\emptyset) = 0$$



Show

$$P(\emptyset) = 0$$



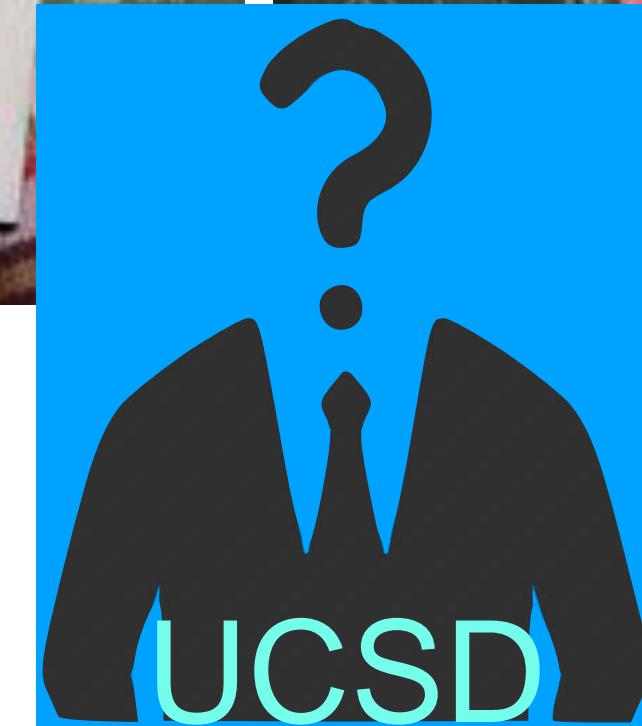
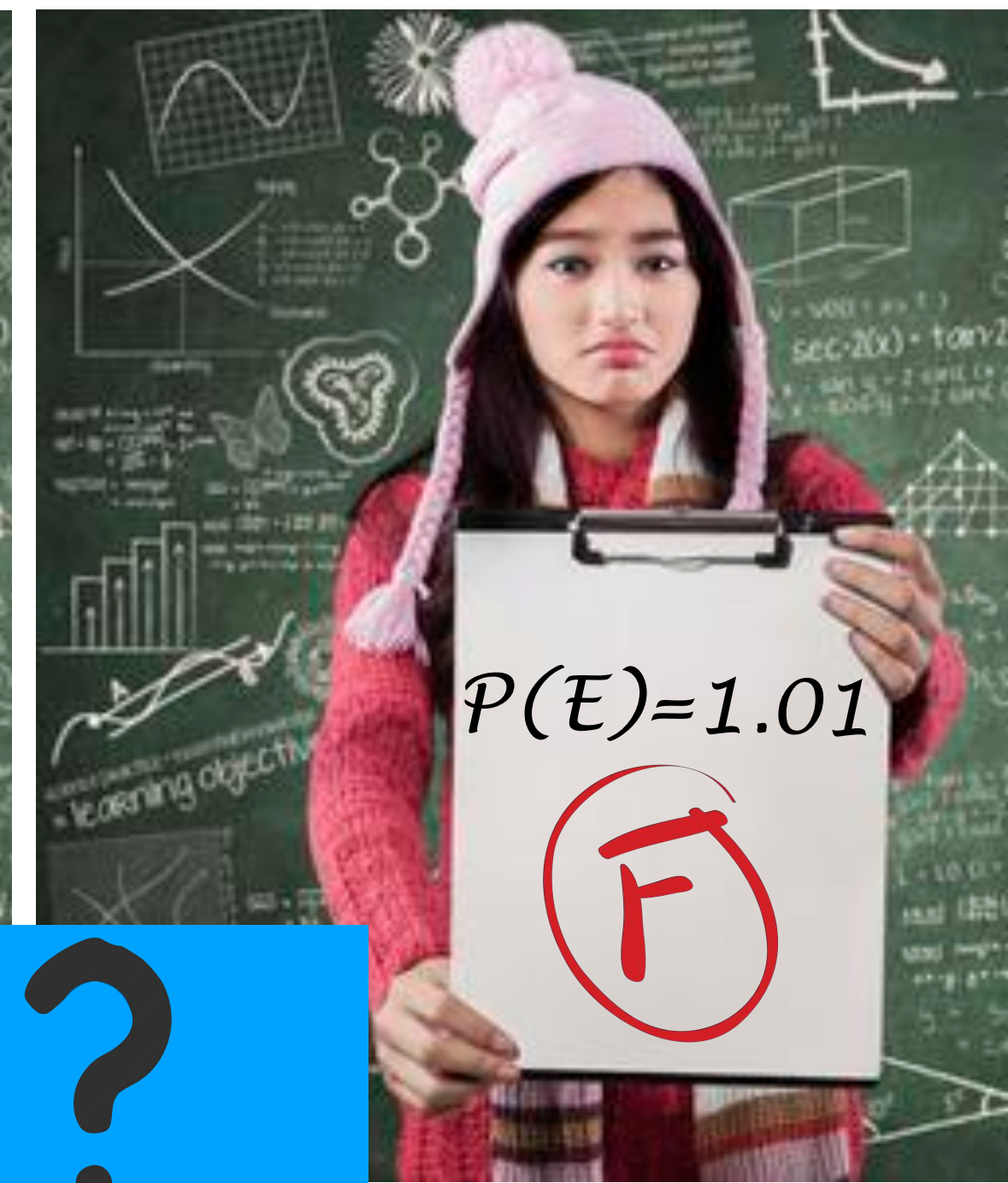
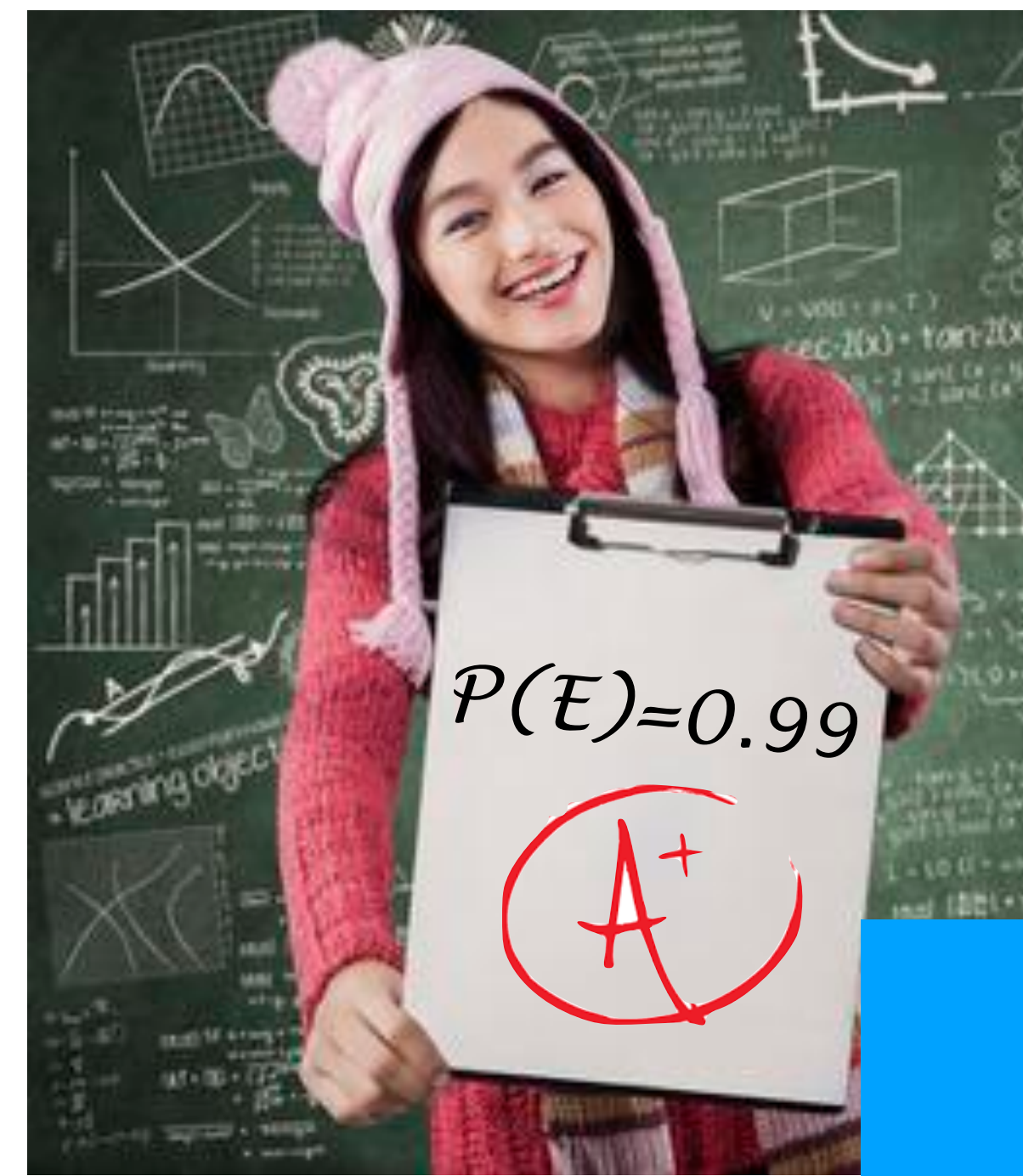
$P(\text{null}) = \overset{0}{\text{nil}}$

$$0 \leq P(A) \leq 1$$

$$\textcircled{\geq} P(A) \geq 0$$

Show $P(A) \leq 1$

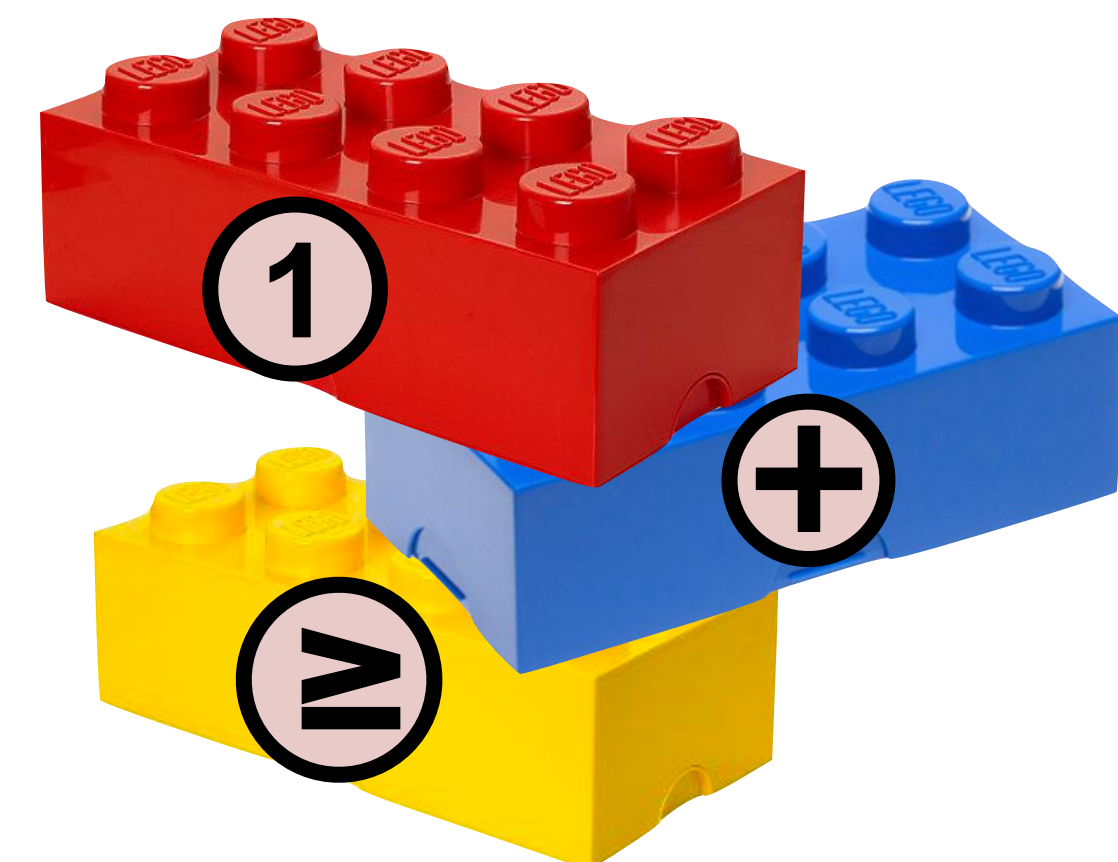
$$A \cup A^c = \Omega$$



$$\textcircled{\geq} P(A) \leq P(A) + P(A^c) = P(A \cup A^c) = P(\Omega) \textcircled{1} = 1$$

$$P(A) \leq 1$$

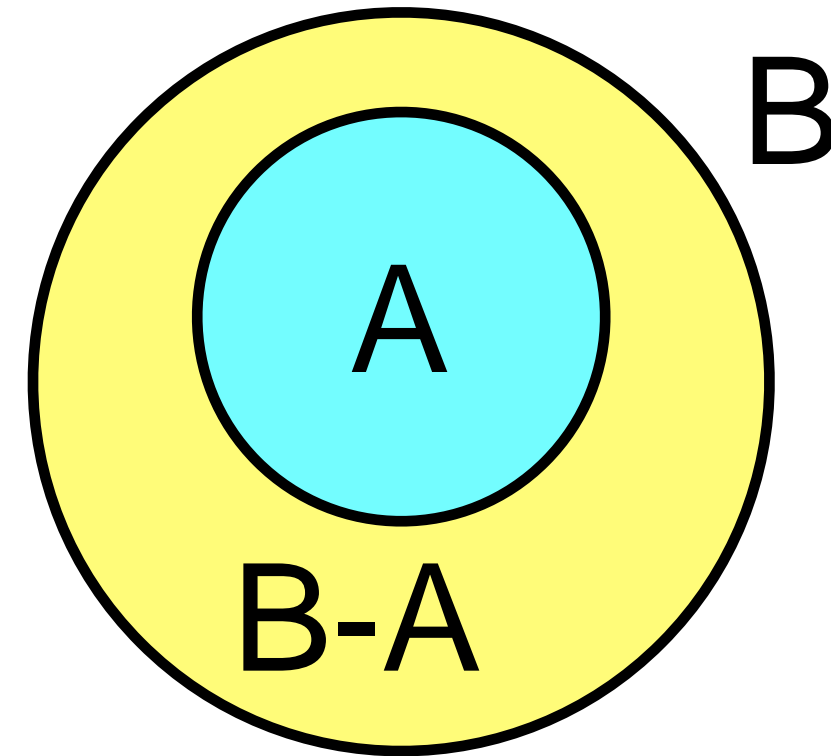
Probability always between 0 and 1



Subset

$$A \subseteq B$$

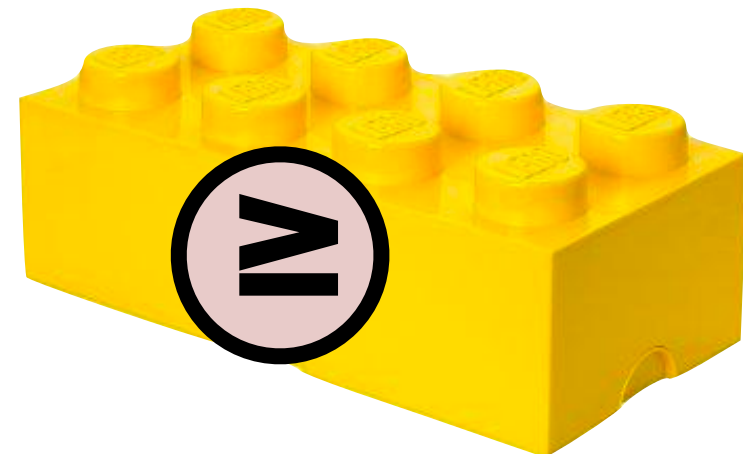
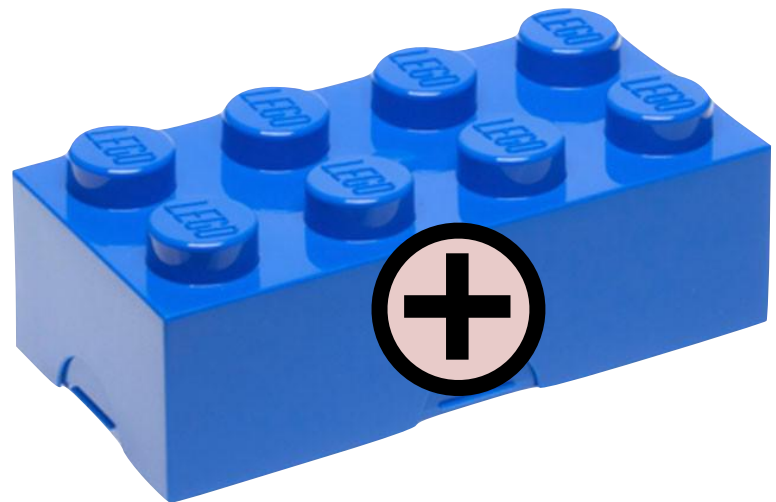
$$P(A) \leq P(B)$$



$$A \subseteq B$$

$$B = A \cup (B-A)$$

$$P(B) = P(\overset{\text{red}}{A} \overset{\text{yellow}}{\cup} (B-A)) \overset{+}{=} P(A) + P(B-A) \overset{\geq}{\geq} P(A)$$



Obvious?



Union

$$\max(P(A), P(B)) \leq P(A \cup B) \leq P(A) + P(B)$$

Left \leq

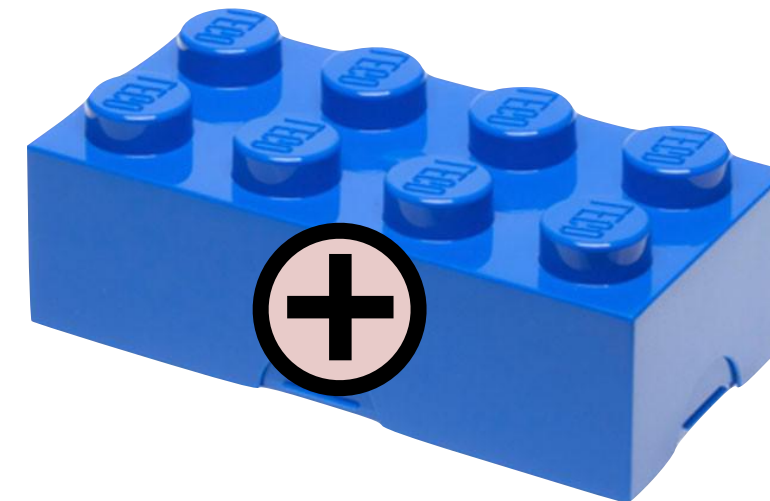
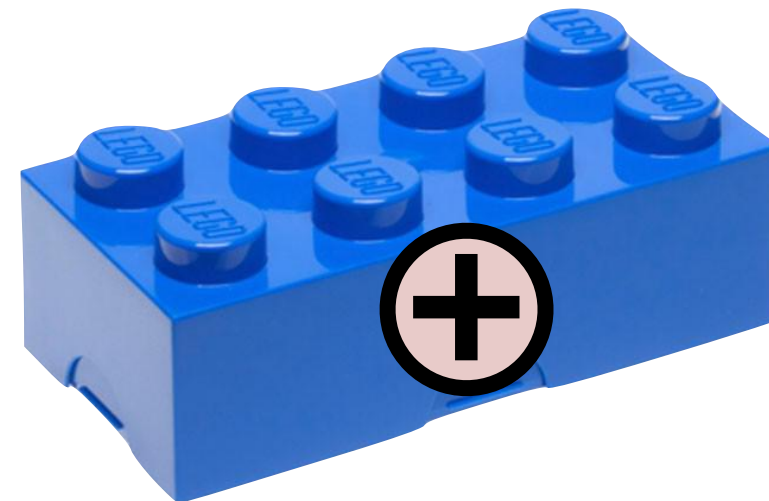
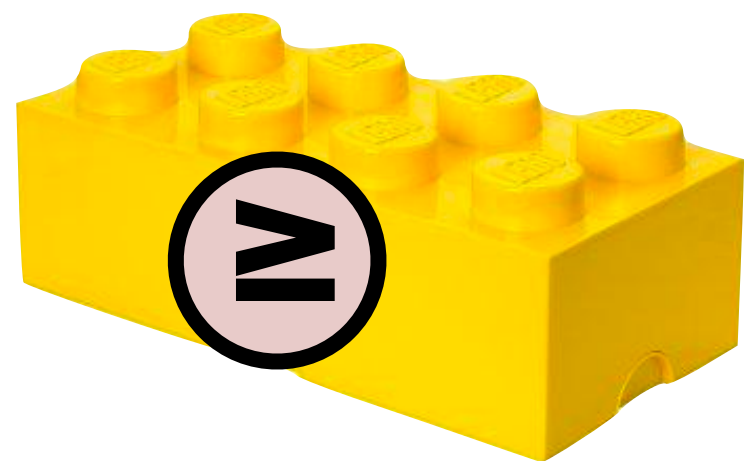
$$A, B \subseteq A \cup B$$

$$P(A), P(B) \leq P(A \cup B)$$

Right \leq



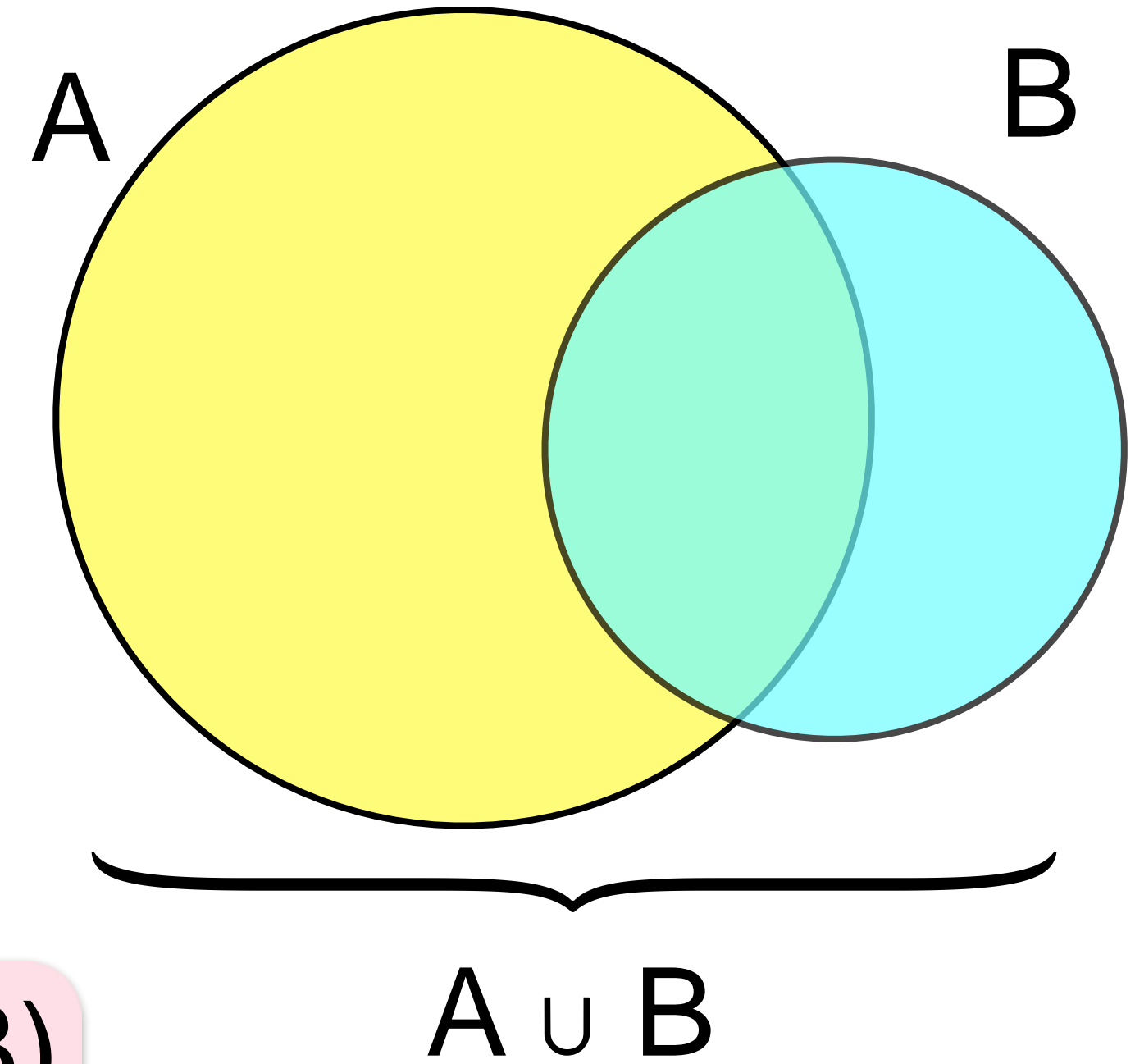
$$P(A \cup B) = P(A) + P(B) - P(A \cap B)$$



$$P(A \cup B) \leq P(A) + P(B)$$

Union bound

Very useful



\$1,400,000 Question

Linda is 31 years old, single, outspoken, and very bright. She majored in philosophy. As a student, she was deeply concerned with issues of discrimination and social justice, and also participated in anti-nuclear demonstrations.

Which is more probable?

- 1 Linda is a bank teller
- 2 Linda is a bank teller and is active in the feminist movement

Please answer in the poll below



The Linda Problem

Psychological Review

VOLUME 90 NUMBER 4 OCTOBER 1983

Extensional Versus Intuitive Reasoning:
The **Conjunction Fallacy** in Probability Judgment

Amos Tversky
Stanford University

Daniel Kahneman
University of British Columbia, Vancouver,
British Columbia, Canada



88 UBC Students

85% Bank teller & activist more likely

B - Bank teller

A - Active in feminist movement

$P(B)$ vs. $P(B \cap A)$

$B \supseteq B \cap A$

$P(B) \geq P(B \cap A)$

Irrational concept of probability

Related Questions

Several conjunction fallacy problems

Björn Borg Preeminent tennis player of late '70's

6 French opens Wimbledon '76-'80



1980 Suppose Borg reaches the '81 Wimbledon Finals

More
likely?

A Borg will lose first set

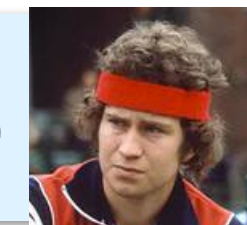
B Borg will lose first set but win match

72% chose B

Again $B \subseteq A$

$P(B) \leq P(A)$

1981 Reached final Won first set Lost match to



1983 Age 26 Retired



The Ultimate Reward

T & K

Many probability-perception studies

1996

Tversky passed away

2002

Kahneman



best known

“for integrating insights from psychological research into economic science, especially regarding human judgment and decision-making under uncertainty”



Economics
Nobel Prize



Criticism

Multiple choice and ranking questions often disjoint

Coffee or Tea

Tea hot or cold

Rank Mon, Tue, or Wed

Often, when not explicitly disjoint, we still interpret them as such

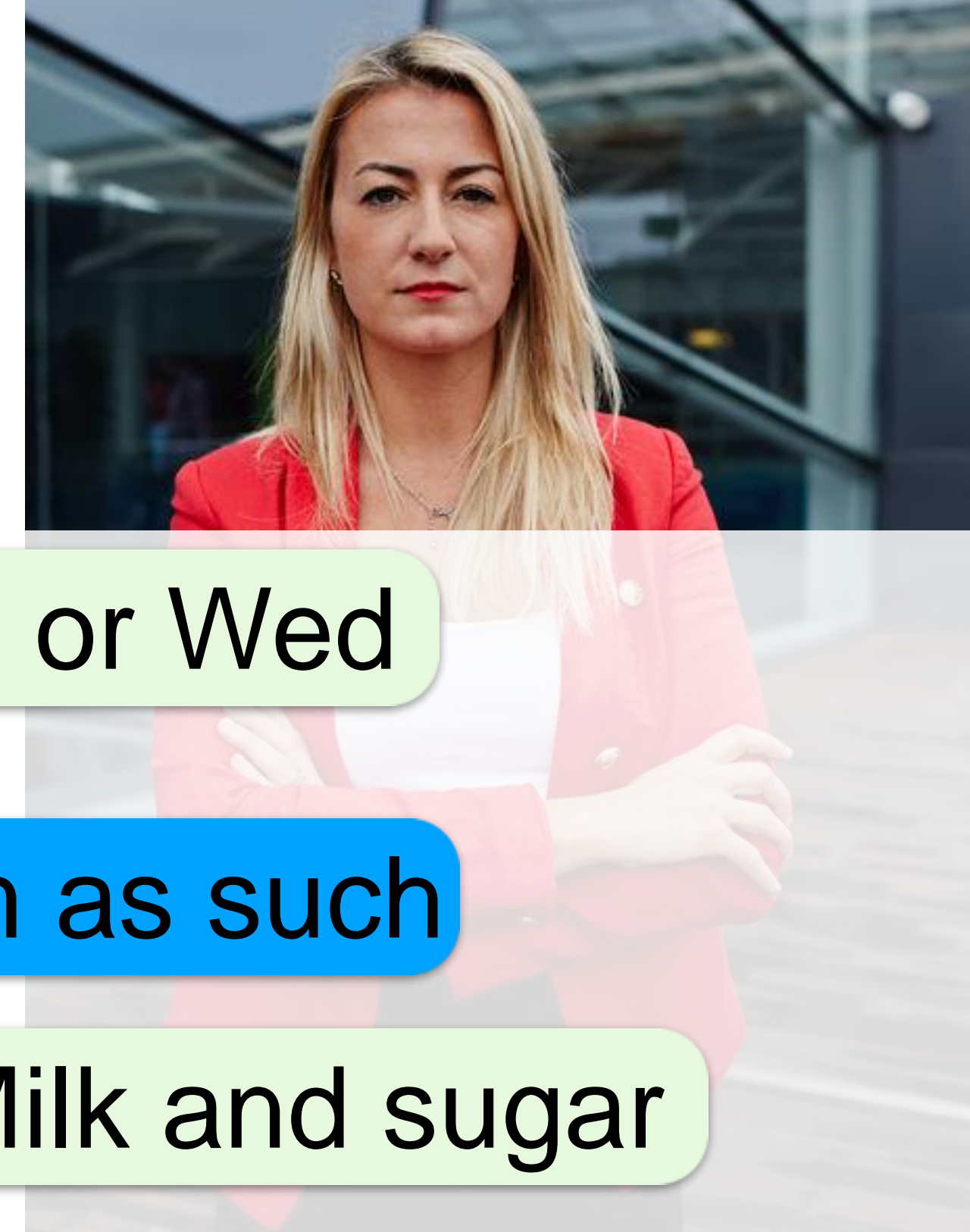
With milk or with milk and sugar → Milk **only** or Milk and sugar

Meet Monday or Monday and Tuesday → Mon **only** or Mon and Tue

Students may have similarly interpreted the Linda question

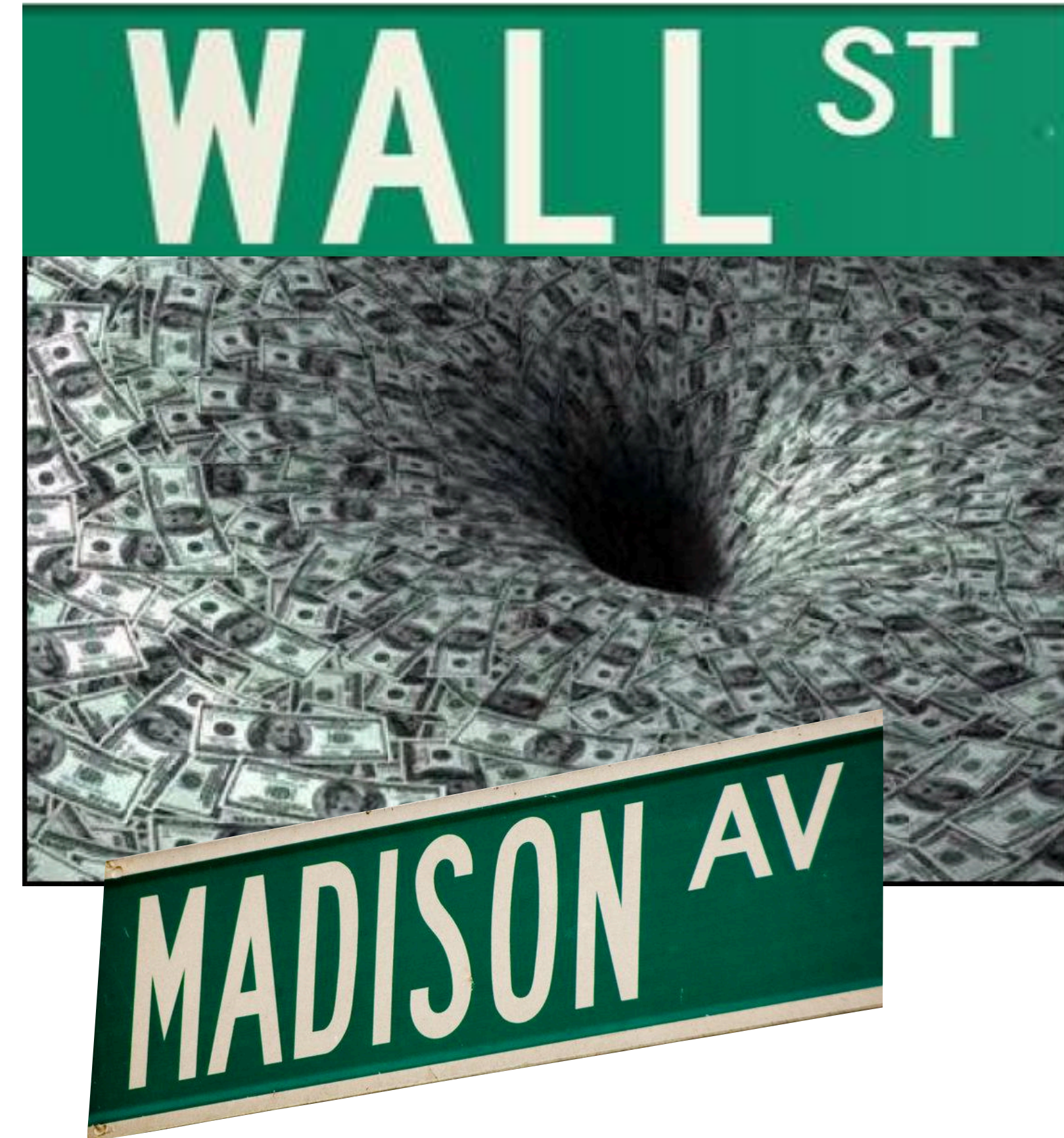
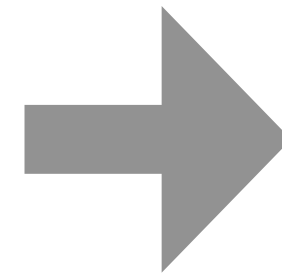
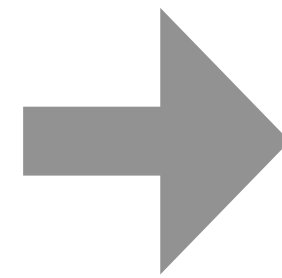
Teller or Teller and activist → Teller **only** or Teller and activist

Simply thought Linda more likely active in movement than not



Bottom Line

Humans only moderately good at estimating probability



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\$1.4M question



Conditional
Probability

