



Demystifying Sample Size Estimation

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Overview

- Underlying concepts
- Getting ready to estimate sample size
- Calculating sample size

Why estimate 'Sample Size'?

- **Too small**

- ✓ Cannot find a real effect – waste of time/resources
- ✓ Leads to imprecision

- **Too large**

- ✓ Waste of resources
- ✓ Unethical

Determinants of sample size

1. Significance level
 2. Power
 3. Effect size of intervention
 4. Variability
- Fixed**
- Variable**

Others: Event rate, one-sided vs. two-sided hypothesis, etc.

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Hypothesis testing: 4 possible outcomes

		TRUTH	
		Intervention better than control	Intervention same as control
STUDY FINDING	Intervention better than control	Correct	α error (Type 1)
	Intervention same as control	β error (Type 2)	Correct

Type I error (Alpha)

- Probability of obtaining a significant result by CHANCE (*false-positive*)
- Alpha=0.05 means investigator has set 5% probability that a significant difference will occur by chance

Alpha error & Sample size



**To reduce alpha error (chance effect),
INCREASE the sample size**

Beta error & Power

- **Beta**
 - ✓ Probability of NOT finding a difference when it actually exists (*false-negative*)
- **Power**
 - ✓ Ability to detect a difference when it exists
 - ✓ $1 - \text{Beta}$
- Power=**80%** means investigator has set **80%** probability of detecting a treatment effect

Example

Radiologists

- Mean = 125
- SD = 15
- Sample size = 10

Orthopedicians

- Mean = 120
- SD = 15
- Sample size = 10

<http://www.graphpad.com/quickcalcs/ttest1/?Format=SD>

Example

Radiologists

- Mean = 125
- SD = 15
- Sample size = 100

Orthopedicians

- Mean = 120
- SD = 15
- Sample size = 100

<http://www.graphpad.com/quickcalcs/ttest1/?Format=SD>

Power and alpha

- **Not** always fixed
 - ✓ Power : 80 to 90%
 - ✓ Alpha : 0.05 to 0.01
- Potentially useful drug for a lethal disease

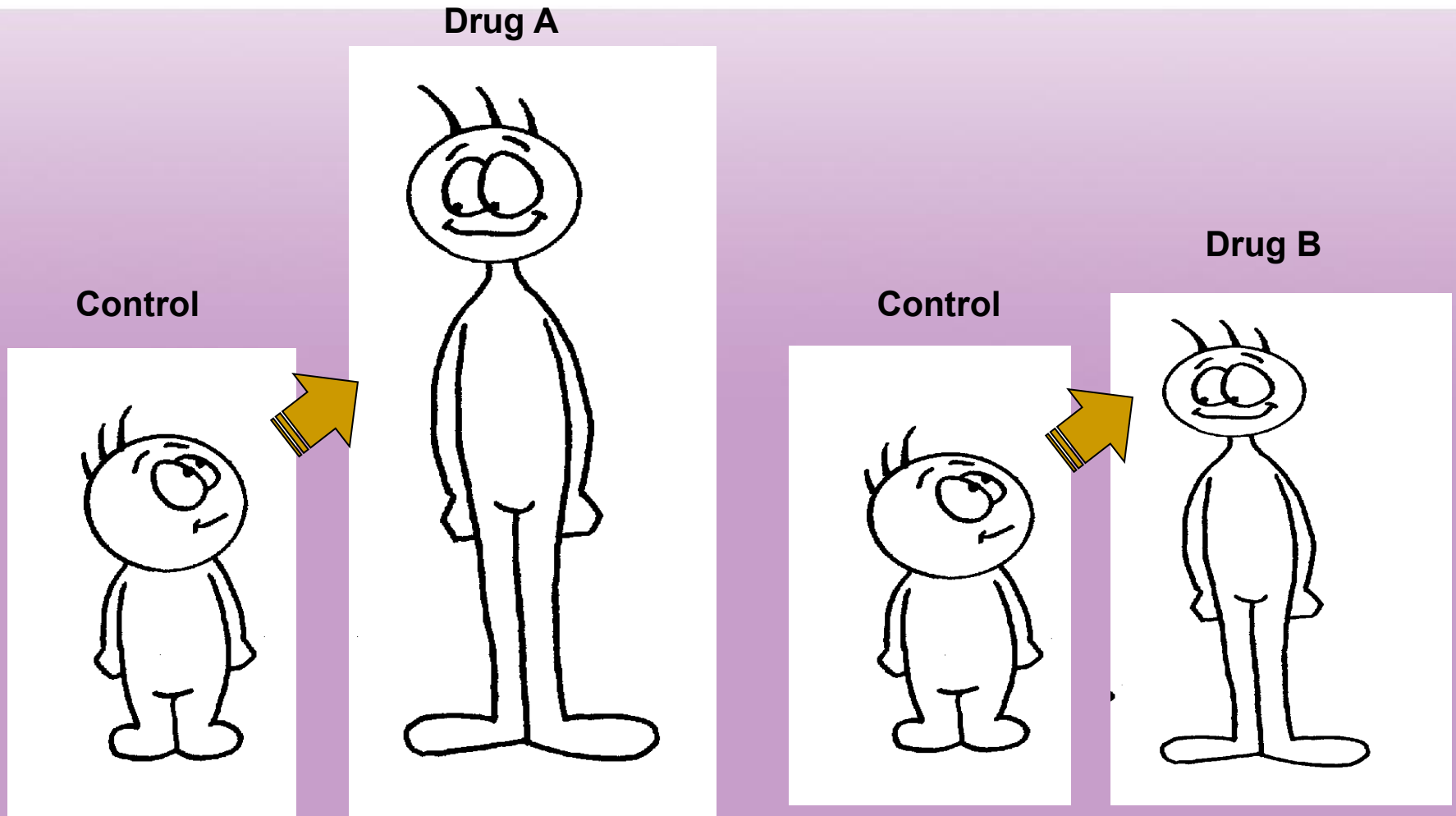
vs.

a drug with many side effects used for a common illness

Determinants of sample size

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- Others: Event rate, one-sided vs. two-sided hypothesis, etc.

Effect size



Sample size would be less in ?

Effect size

Graphical Representation of Power

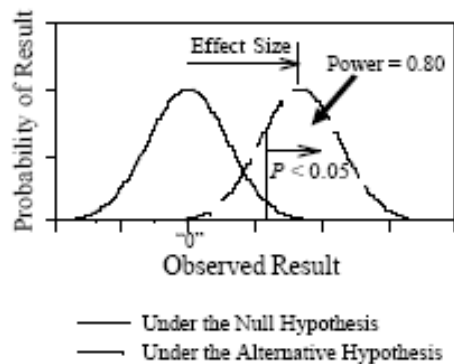


Figure 3.

Larger Effect Size: Larger Power

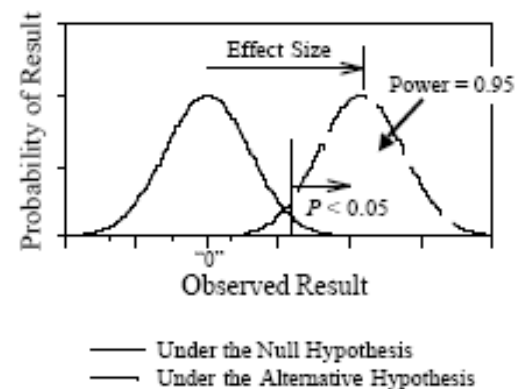
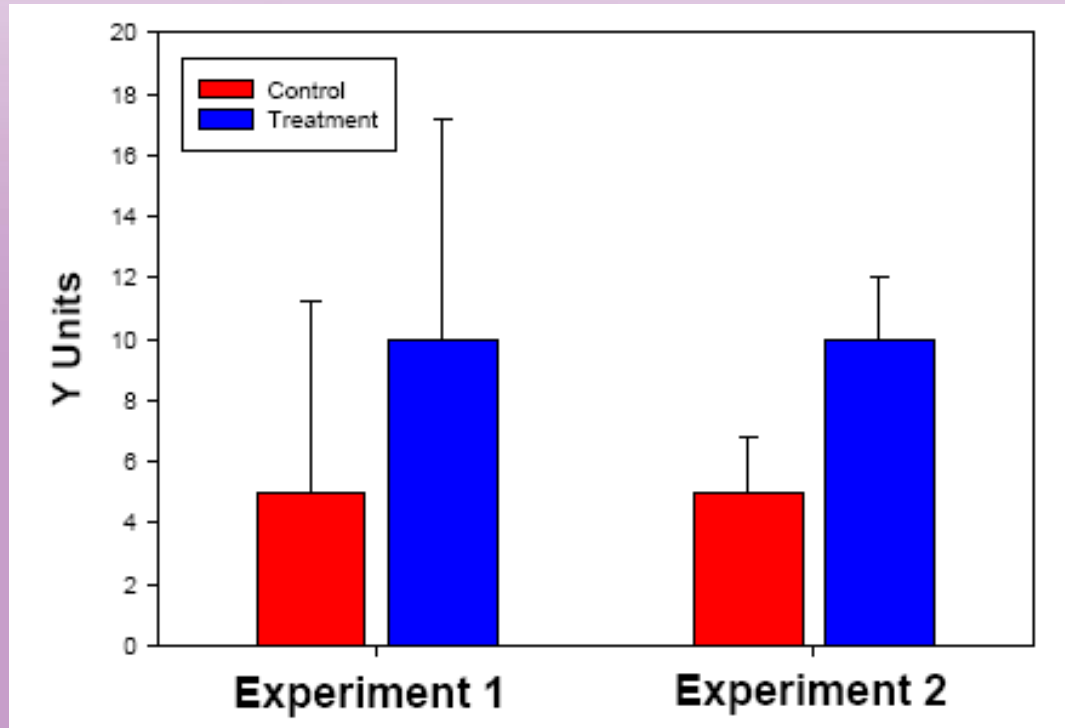


Figure 5.

More the effect size, smaller the sample size

Note: With more power, you can detect an effect even with less sample size

Variability



**More the variability, less certain
the treatment effect**

Variability & sample size

Graphical Representation of Power

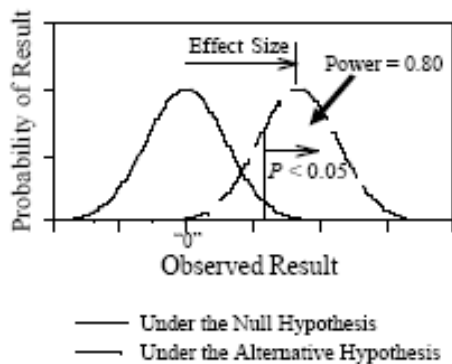


Figure 3.

Larger Sample Size: Larger Power

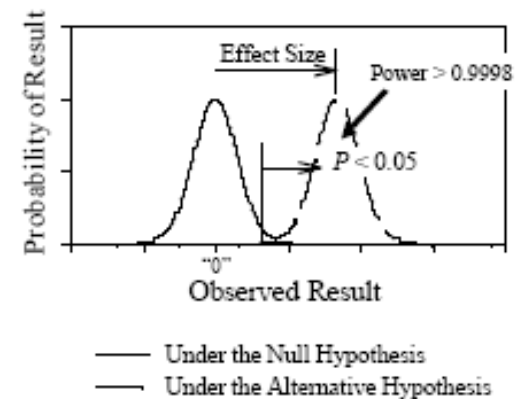


Figure 6.

To reduce variability, INCREASE the sample size

Summary

Determinant	Preferred	Sample size
Alpha (type I error)	Small	↑
Power	High	↑
Effect size	Small	↑
Variability	Less	↓

Effect size and variability

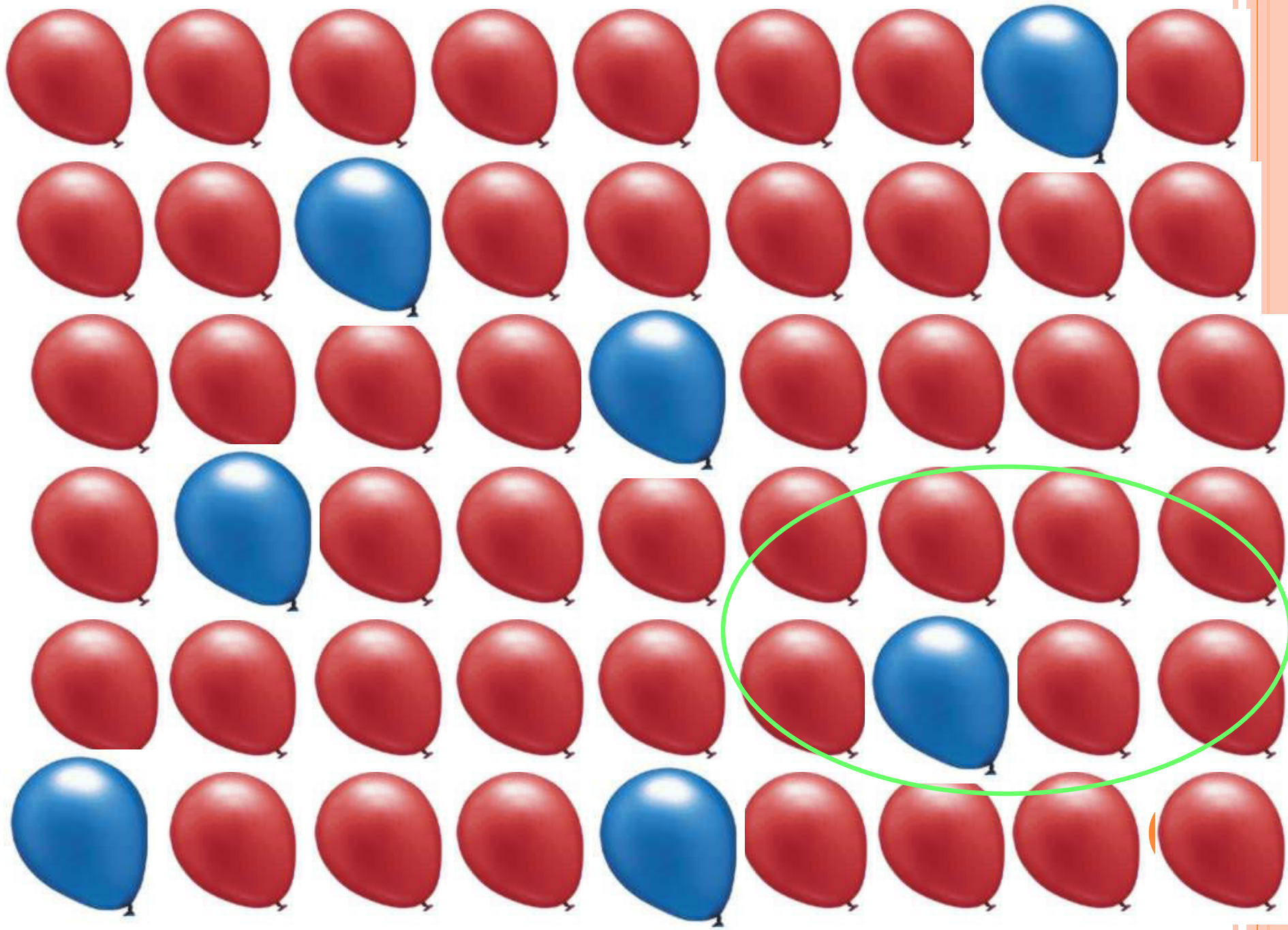
How to estimate?

- Previous studies/animal experiments
- Pilot study
- Consultation with experts
- Educated guess

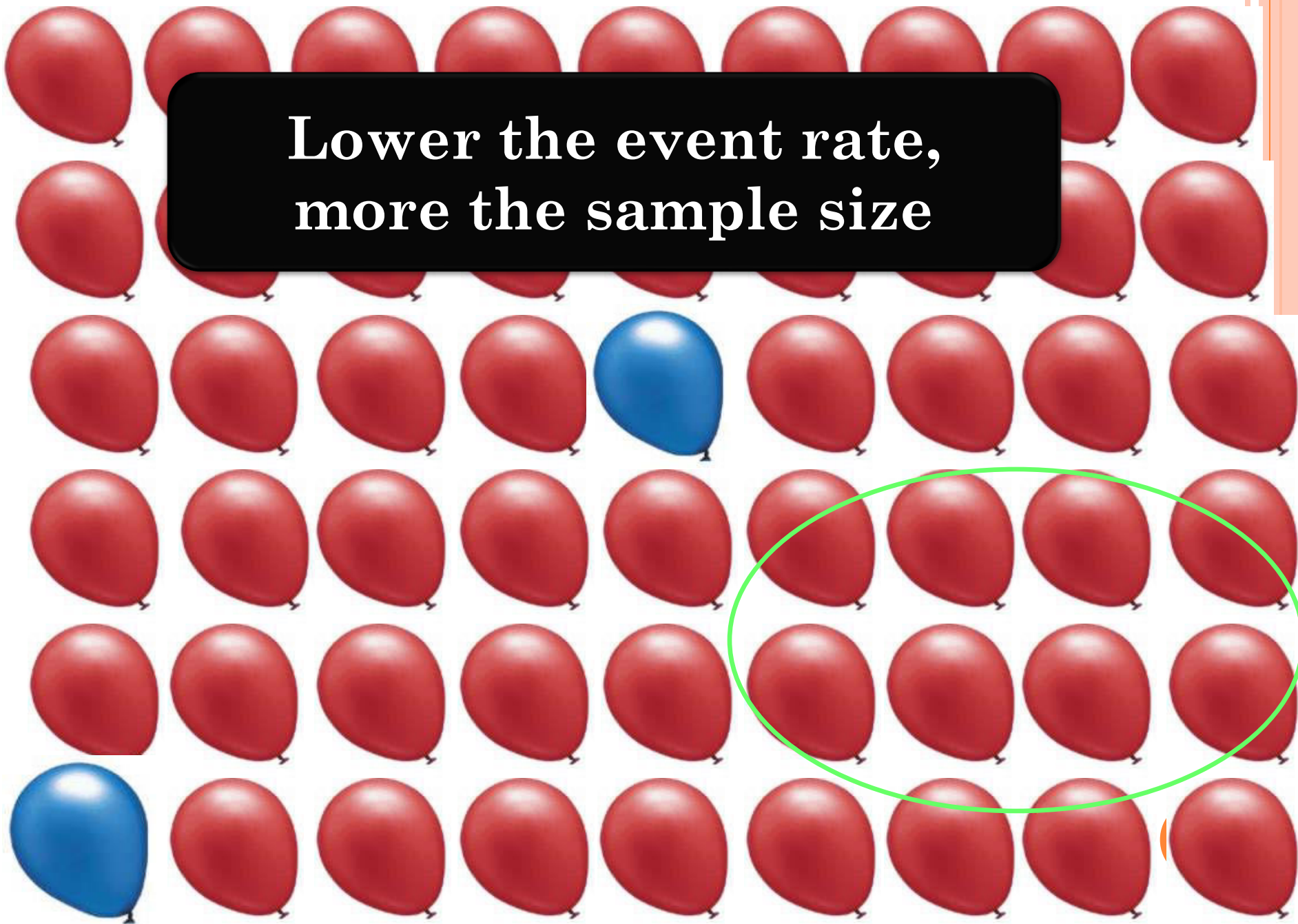
Determinants of sample size

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Event rate



**Lower the event rate,
more the sample size**



Sample size in prevalence studies

- E.g. cross-sectional survey
- One sample – **NO** effect size or power*
- Sample size determined by:
 1. Estimated proportion_{*}
 2. Confidence (Alpha error)
 3. PRECISION

** Remember even in one sample, power comes into play if you are testing a hypothesis*

Overview

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Type of study designs

- cross-sectional
- cohort
- case-control
- experimental

Cross-sectional (survey)

Required information

1. anticipated population prop. (p)
2. type I error (5%)
3. precision (d)

An investigator seeks to estimate the proportion of children receiving vaccinations.

How many children must be studied if the estimate is to fall within 10% points of the true proportion with 95% confidence?

P = alpha=0.05 d= 10%

n = ?

Case-control study

Required information

- I. At least 2 of the following:
 - i. exposure rate in cases
 - ii. exposure rate in controls
 - iii. odds ratio
2. Probability of type I and 2 errors

A study is designed to compare the immunization rates in a group of TB cases compared to controls. Available information - 30% of controls are vaccinated, and we wish to have an 80% chance of detecting a significant difference at 5% level. An OR of 2 would be considered an important difference.

$$P_2 = \text{Power} = \alpha = \text{OR} = 2.0$$

Cohort study/RCT

Required information

- I. At least 2 of the following:
 - i. Risk/incidence in exposed group
 - ii. Risk/incidence in control group
 - iii. Relative risk
2. Probability of two types of errors

A study to compare efficacy of drug A vs. placebo in leukemia patients. 40% of patients get recurrence with current treatment. If we wish to have 90% chance of detecting if new drug reduces it to 20% at 5% level of significance, what would be the n ?

$$P_1 = \quad P_2 = \quad \text{Power} = \quad \alpha = 0.05$$

RCT with continuous outcome variable

Required information

1. Mean of the outcome variable in group 1 = $M1$
2. Mean of the outcome variable in group 2 = $M2$
3. SD of the outcome variable in group 1 = $\sigma 1$
4. SD of the outcome variable in group 2 = $\sigma 2$
5. Probability of two types of errors

- Underlying concepts
- Getting ready to estimate sample size
- **Calculating sample size**

Sample size calculators

- Epi-info
- PASS, Power&precision
- Stata
- Websites
 - <http://www.epibiostat.ucsf.edu/dcr/>
 - www.sealedenvelope.com
 - www.openepi.com

Rule of thumb

- formula for calculating the sample size in the case of a continuous variable:

$$15(\text{SD}/\text{difference in means})^2$$

- For the examples we discussed, the sample size per group would be as follows:
- 1. Assuming the SD to be 1 and the expected difference in means to be 12 hrs, it would be $15 (1/12)^2 = \mathbf{10}$ per group
- 2. Assuming the SD to be 24 and the expected difference to be 12 hrs, it would be $15 (24/12)^2 = \mathbf{60}$ per group

Loss to follow-up

- Increase sample size by multiplying with $[1/(1-\text{expected drop-out rate})]$
- e.g. if 20% drop-out rate and calculated sample size is 100, then enroll 125 subjects ($100*1.25$); $[1/0.8=1.25]$

Strategies to decrease sample size

- Use continuous variable instead of categorical variable
- Use paired measurement
- Use more precise variable
- Use a more common outcome

Resources

- Stephen B Hulley, Steven R Cummings. Designing Clinical Research : An epidemiologic approach, Williams and Wilkins, London 1988. page 139 – 150
- Stanley Lemeshow, David W Hosmer, Janelle Klar, Adequacy of sample size in health studies. John Willey, and Sons. New York