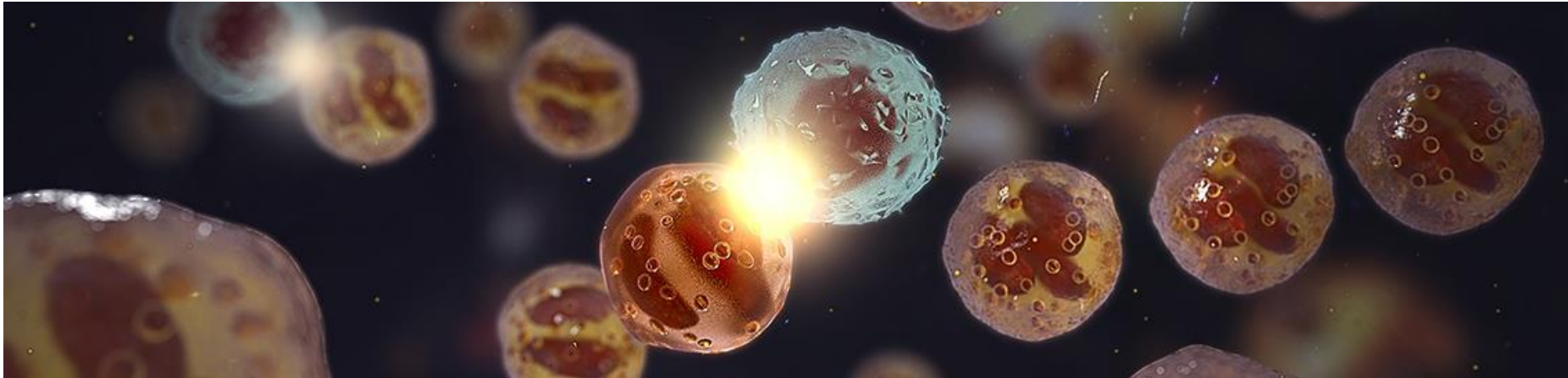


# A statistician's contribution to saving lives: drug research and development

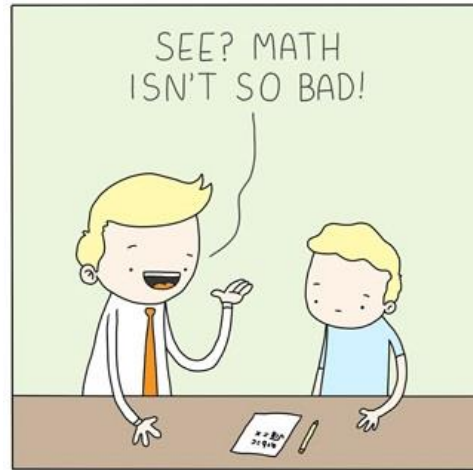
Teodora Trasieva

My-Dagen: MATEMATIK I YRKESLIVET

30 Oct 2017



# Wondering where math can take you?



# We push the boundaries of science to deliver life-changing medicines.



**“Together, we can be confident that, by leading in science, we will transform the lives of patients around the world.”**  
Pascal Soriot

## Global Dimensions

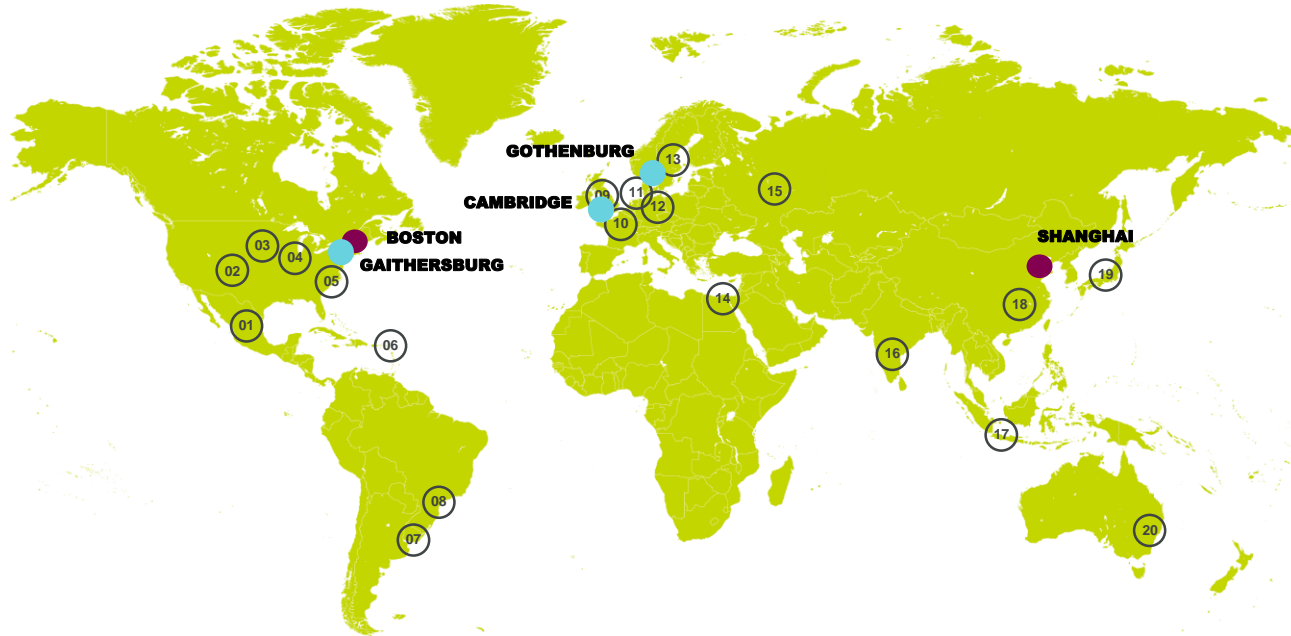
- **\$26.1 billion** annual sales
- **57,500** employees
- More than **850** collaborations and partnerships globally
- Manufacturing in **17** countries
- **\$4.9 billion** invested in R&D with research across 5 countries
- 3rd **fastest-growing top 10 multinational pharmaceutical** company in emerging markets in 2014



# We are truly global

28 production facilities in 17 countries

3 strategic R&D sites in 3 countries

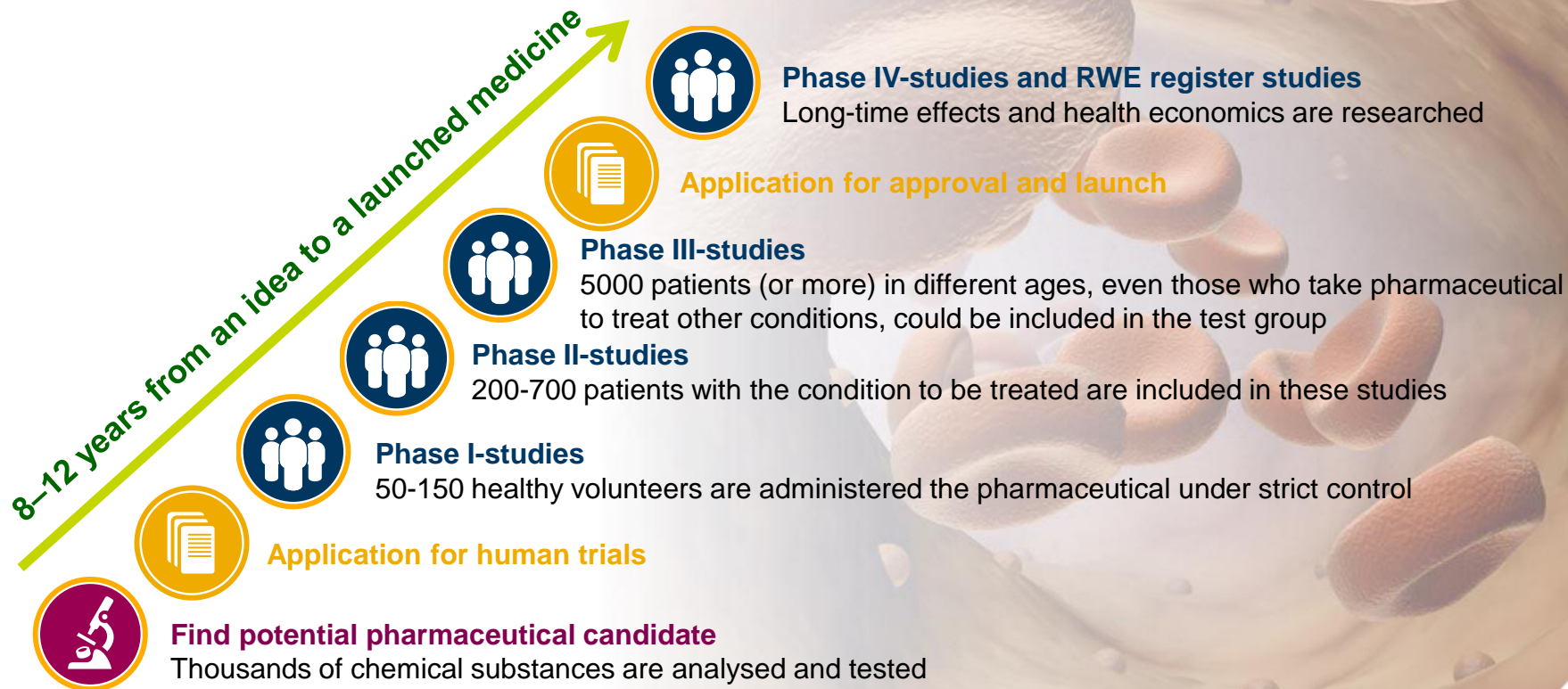


- |   |                                    |   |                            |
|---|------------------------------------|---|----------------------------|
| 1. Lomas Verdes (Mexico)  | 6. Canovanas (Puerto Rico)         | 12. Wedel (Germany)                           | 17. Jakarta (Indonesia)    |
| 2. Boulder (Colorado, USA)                                      | 7. Buenos Aires (Argentina)        | 13. Södertälje: Snäckviken & Gärtuna (Sweden) | 18. Taizhou, Wuxi (China)  |
| 3. Mt Vernon (Indiana, USA)                                     | 8. Cotia (Brazil)                  | 14. Cairo (Egypt)                             | 19. Maihara (Japan)        |
| 4. West Chester (Ohio, USA)                                     | 9. Avlon, Macclesfield, Speke (UK) | 15. Vorsino (Russia)                          | 20. North Ryde (Australia) |
| 5. Newark, Frederick, Maryland, Philadelphia, Westborough (USA) | 10. Reims, Dunkerque (France)      | 16. Bangalore (India)                         |                            |
|   | 11. Nijmegen (Netherlands)         |   |                            |





# Time and patience are behind every new medicine



# Each drug-project includes many studies such as

Statisticians are shy, but we learn to collaborate with others...



## Intravenous infusion

- Physician
- Clinical Operations manager
- Safety experts
- **Statistician**
- Programmer
- Data manager
- Supply chain expert
- Regulatory affairs
- ...

## Subcutaneous administration

- Physician
- Clinical Operations manager
- Safety experts
- **Statistician**
- Programmer
- Data manager
- Supply chain expert
- Regulatory affairs
- ...

## Pediatric study

- Physician
- Clinical Operations manager
- Safety experts
- **Statistician**
- Programmer
- Data manager
- Supply chain expert
- Regulatory affairs
- ...

## Another disease

- Physician
- Clinical Operations manager
- Safety experts
- **Statistician**
- Programmer
- Data manager
- Supply chain expert
- Regulatory affairs
- ...



# I work on a lupus drug

## Systemic lupus erythematosus



Mouth and  
nose ulcers

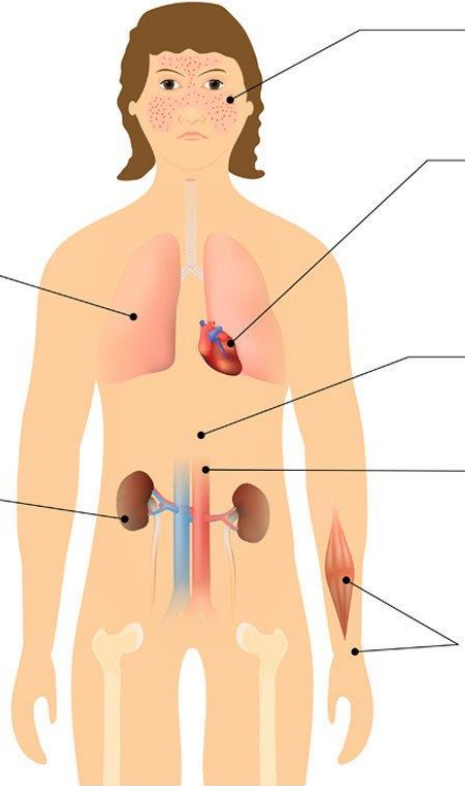
### Lungs

- pleuritis
- pneumonitis
- pulmonary emboli
- pulmonary hemorrhage

### Kidneys

- blood in the urine

Hair loss  
High fever  
Abnormal  
headache



### Skin

butterfly rash  
and red patches

### Heart

- endocarditis
- atherosclerosis
- inflammation of  
the fibrous sac

Severe  
abdominal pain

### Blood

- anemia
- high blood  
pressure

### Muscle and Joints

- pain and
- arthritis
- swollen joints

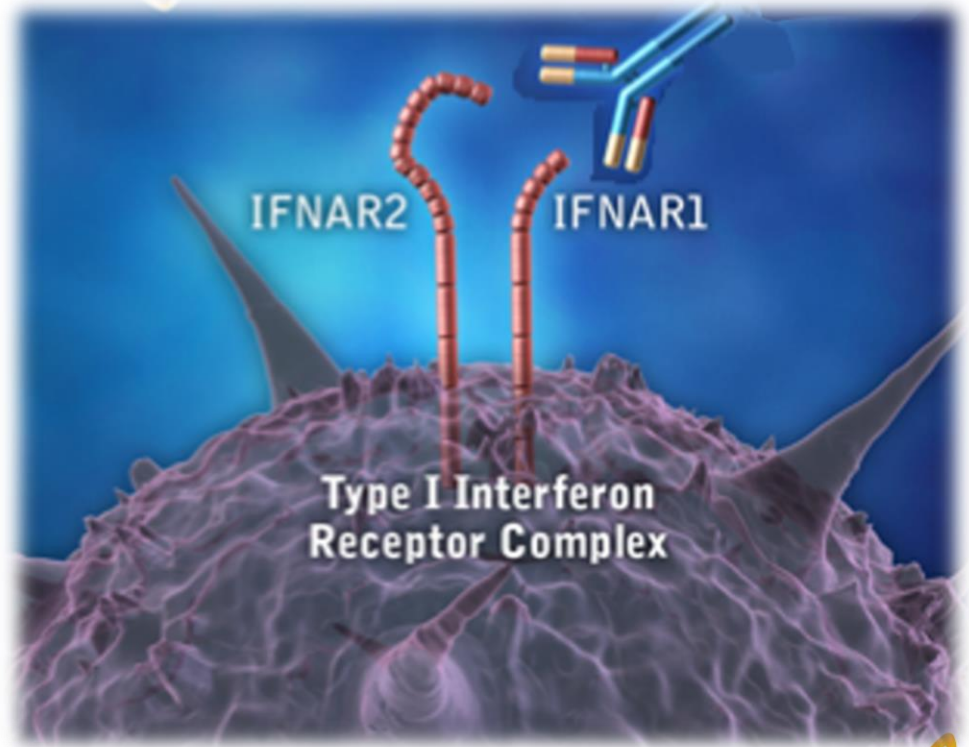
Butterfly rash



# Lupus is an autoimmune disease

Type I interferons (IFN) are produced when the body recognizes a virus has invaded it.

Lupus is connected to activation of the type I interferon system.





# We suspect that our drug works...

Week 1



Week 40



...but can we prove it?



# Statistics

A branch of applied mathematics concerned with the collection and interpretation of quantitative data and the use of probability theory to estimate population parameters

Concerned with the treatment of quantitative information from group of individuals

## Descriptive Statistics

In a clinical trial, a new drug resulted in pain relief an average of 25 minutes earlier than a known drug

## Inferential Statistics

The new drug results in pain relief significantly faster than the known drug.

**CI: (20min, 30min)**

**p-value = 0.003**



# Biostatistics

Statistics focused on the biological and health sciences

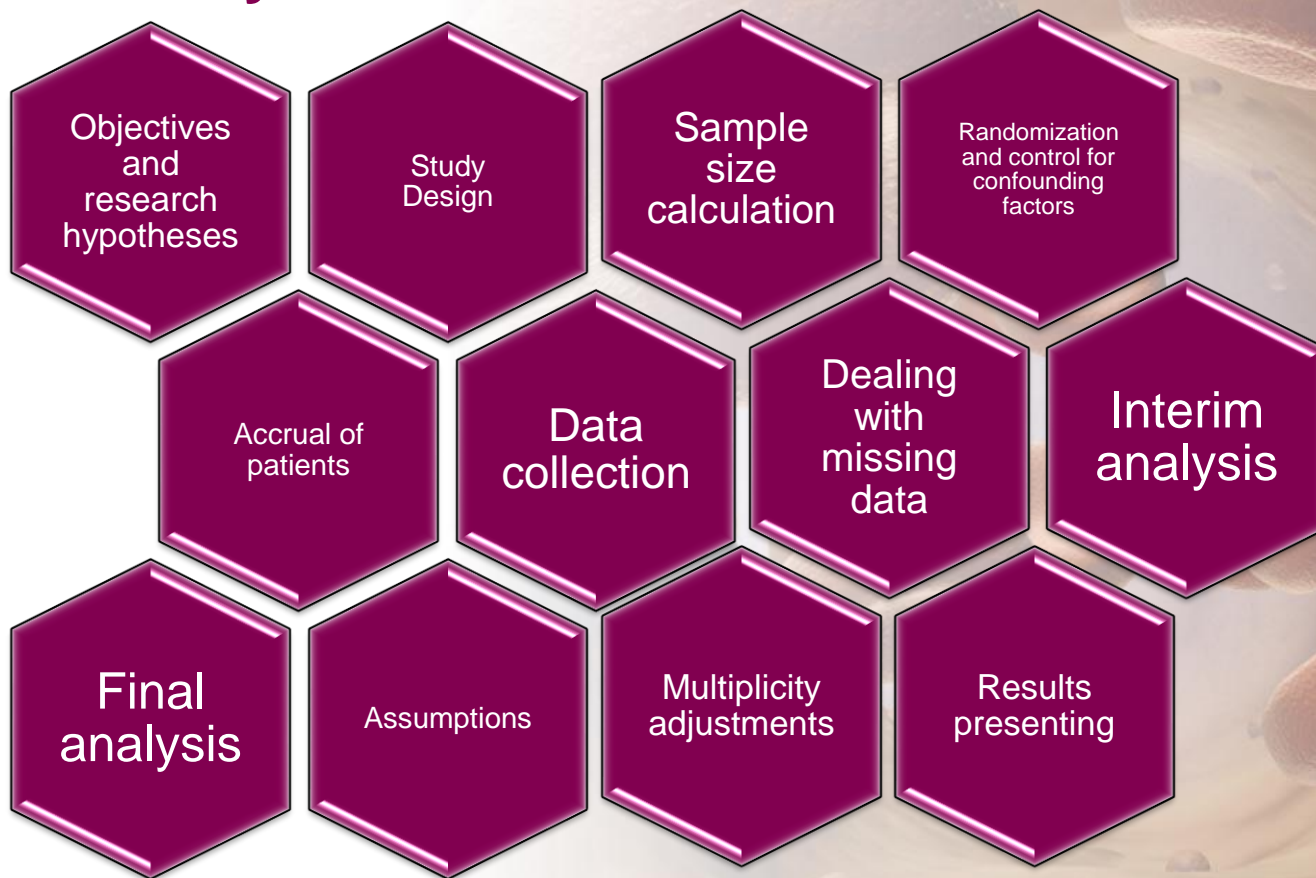
Concerned with all aspects of data:

- Planning the study
- Collecting and organizing the information
- Analyzing the data
- Interpreting the results

- Is a new pharmaceutical for autoimmune disease effective in decreasing organ damage? Is the new drug more effective than placebo or *standard of care*?
- Is the use of a drug associated with adverse events?
- Is there heterogeneity in treatment effects in subgroup of patients?
- How do clinical measures correlate with each other?

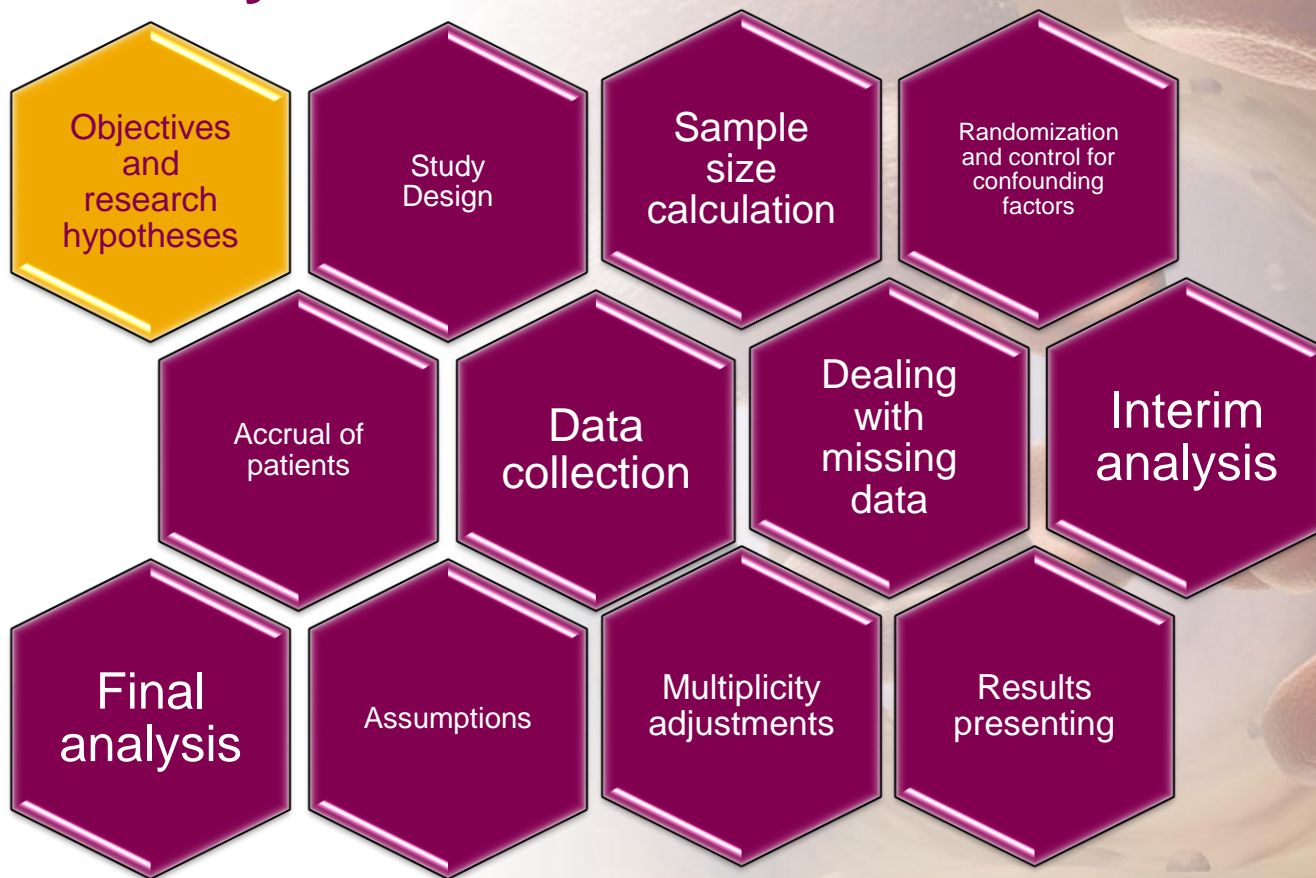


# Statistical Analysis Plan





# Statistical Analysis Plan



# Hypothesis testing

## Null Hypothesis ( $H_0$ )

No effect, no difference

- After one year of treatment there is **no difference** in the mean change from *baseline* of number of swollen joints between patients on active treatment and placebo.
- There is *no difference* in the percentage of patients with no organ damage in the placebo group and active treatment group of patients

## Alternative Hypothesis ( $H_1$ )

Effect, difference

- There is a difference between active treatment and placebo in the mean change of swollen joints
- There is a difference between the two groups in the percentage of patients with no organ damage.







# Hypothesis testing

$1-\alpha$ =confidence level

$\beta$ =power

Research

		The Truth (unknown to the researcher)	
		Null Hypothesis	Alternative Hypothesis
Research	Null Hypothesis	Accurate (probability= $1-\alpha$ ) 	Type II error (probability= $\beta$ ) 
	Alternative Hypothesis	Type I error (probability= $\alpha$ ) 	Accurate (probability= $1-\beta$ ) 

Assumptions

Select  $\alpha$

P-value

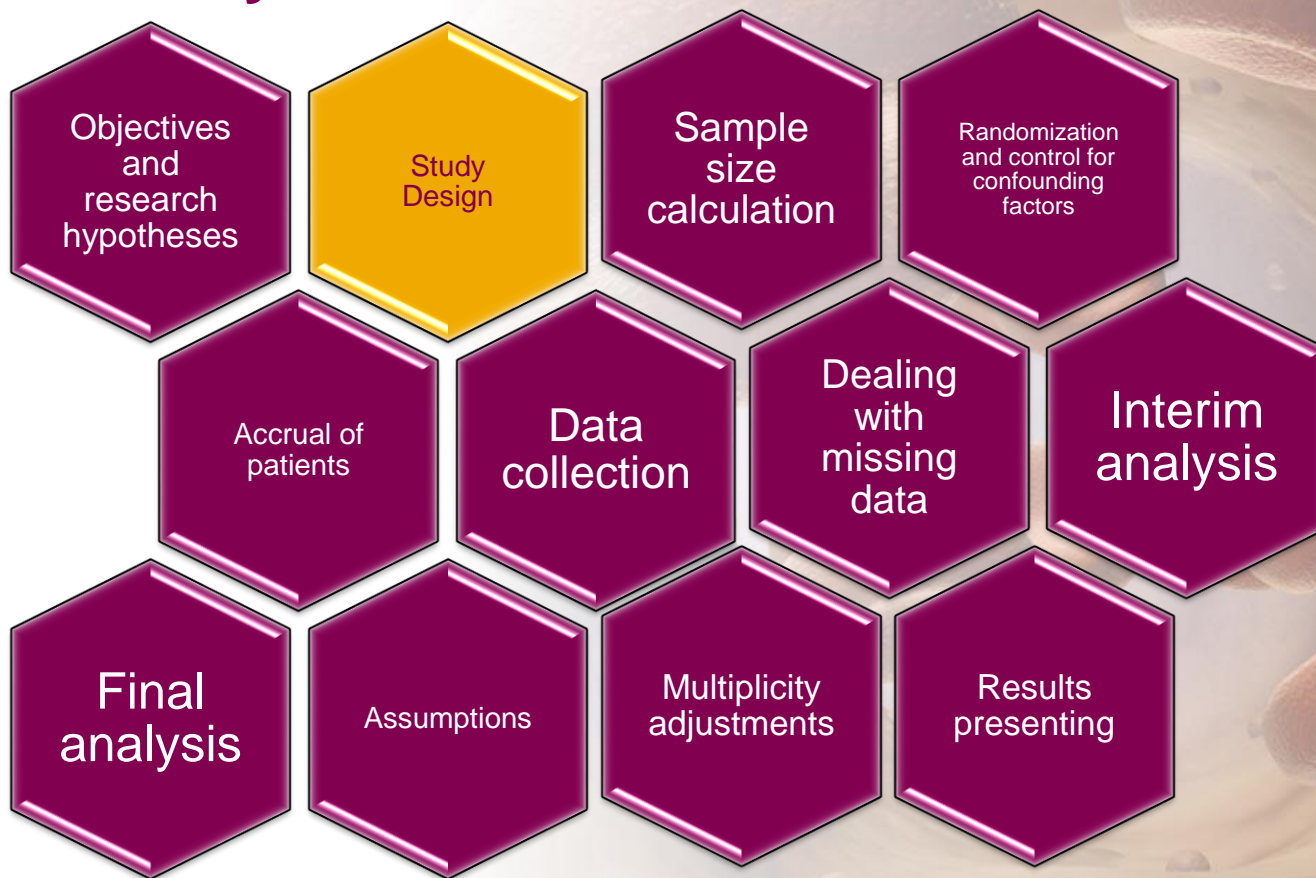
Decision

Choose test

Compare observed  
valeur with critical value



# Statistical Analysis Plan



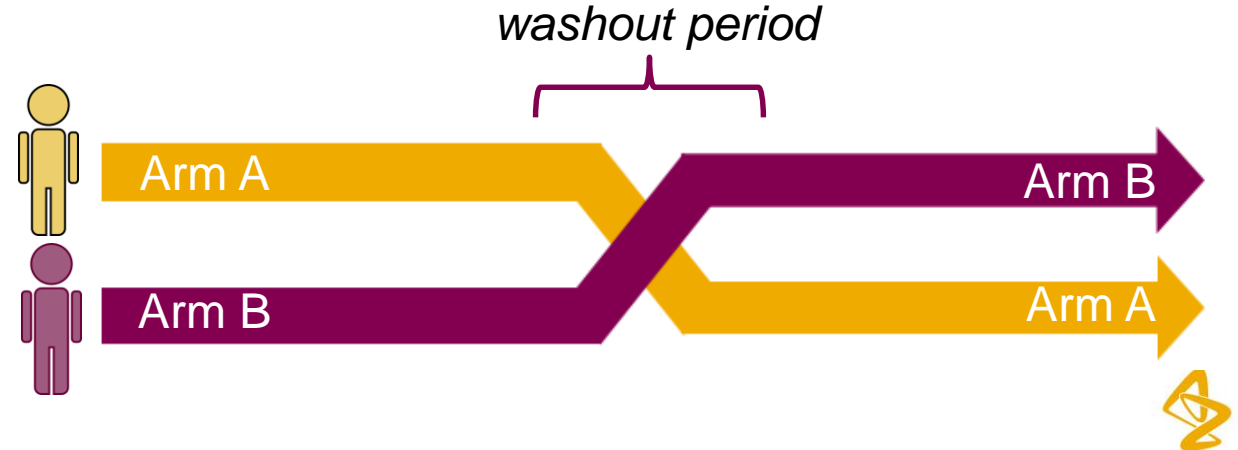


# Study Design

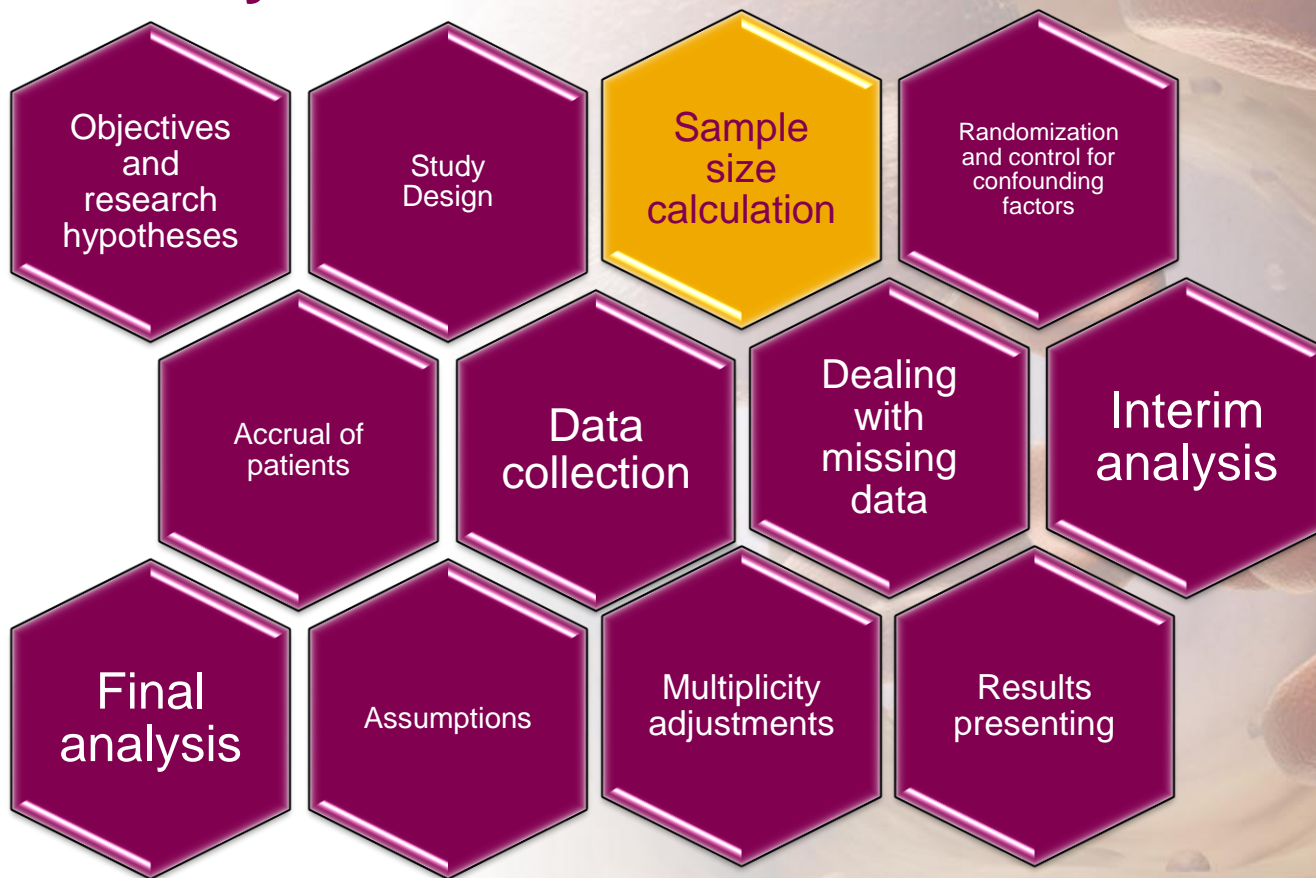
## Parallel study



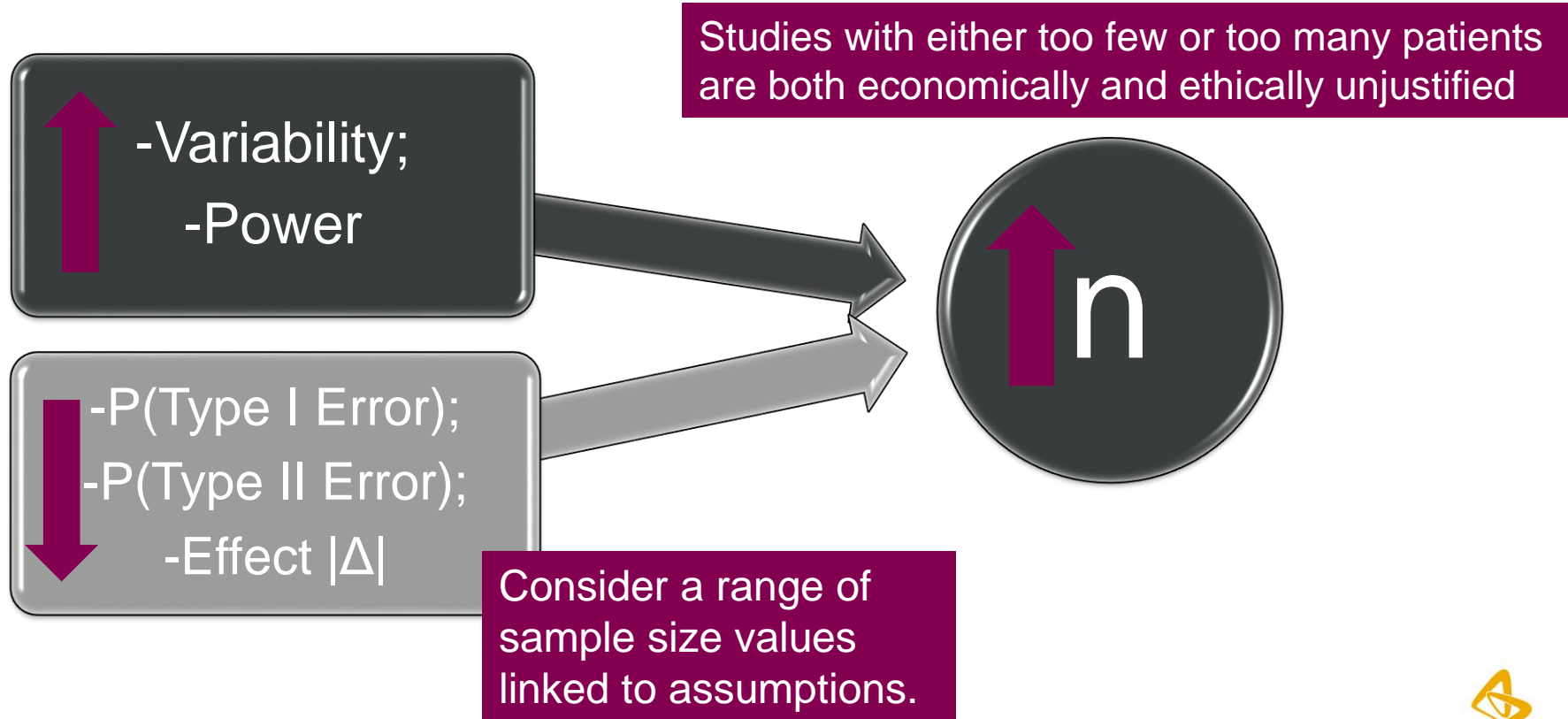
## Crossover study



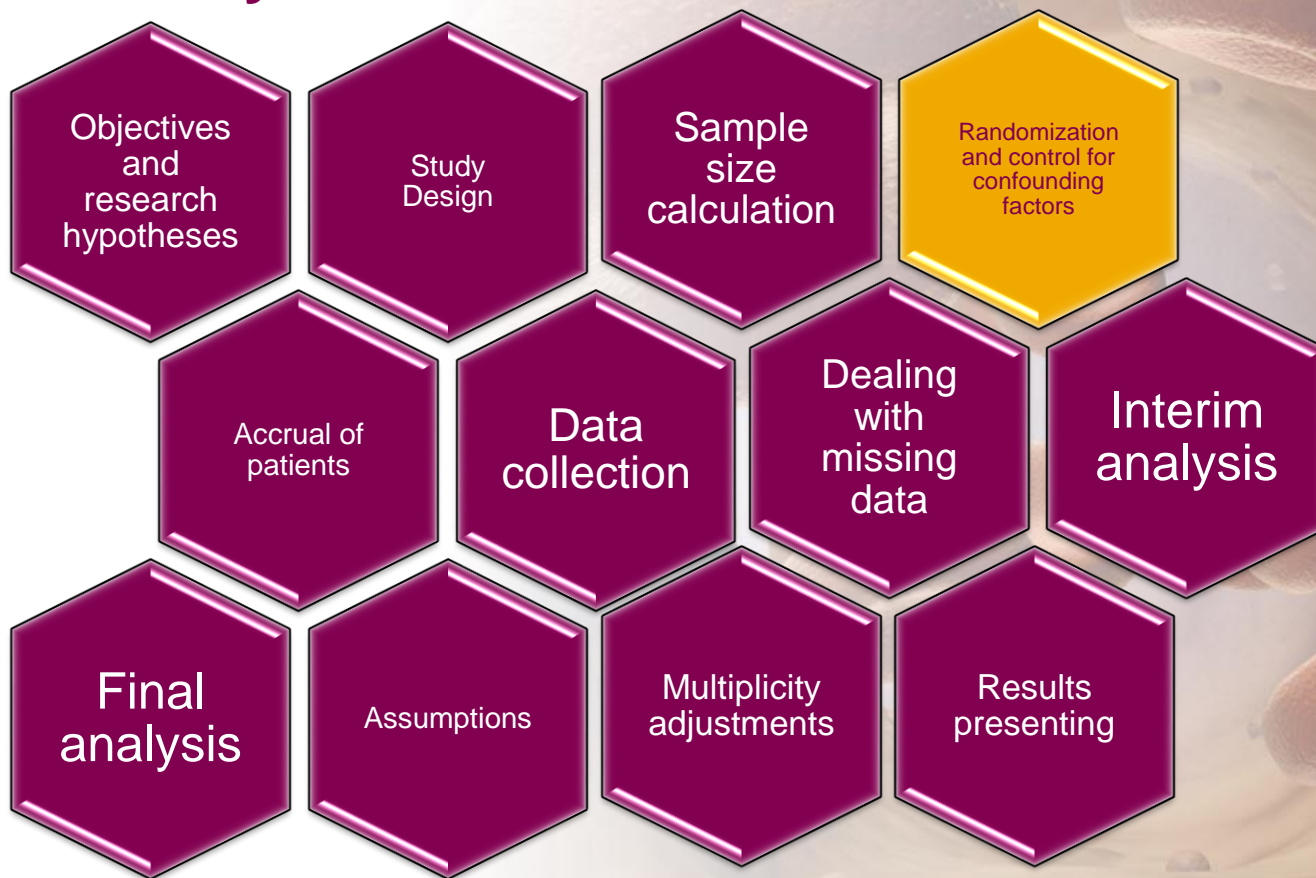
# Statistical Analysis Plan



# Sample Size calculation

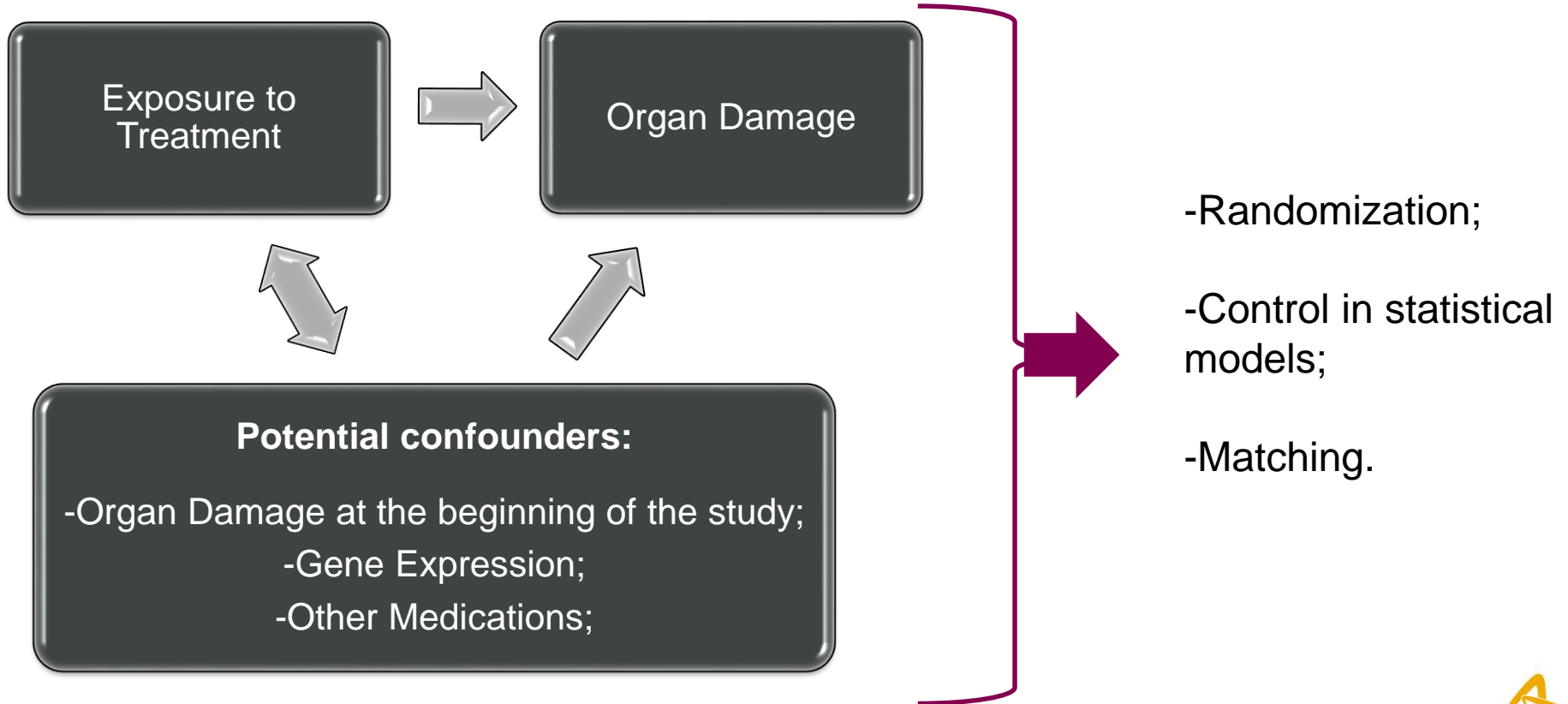


# Statistical Analysis Plan

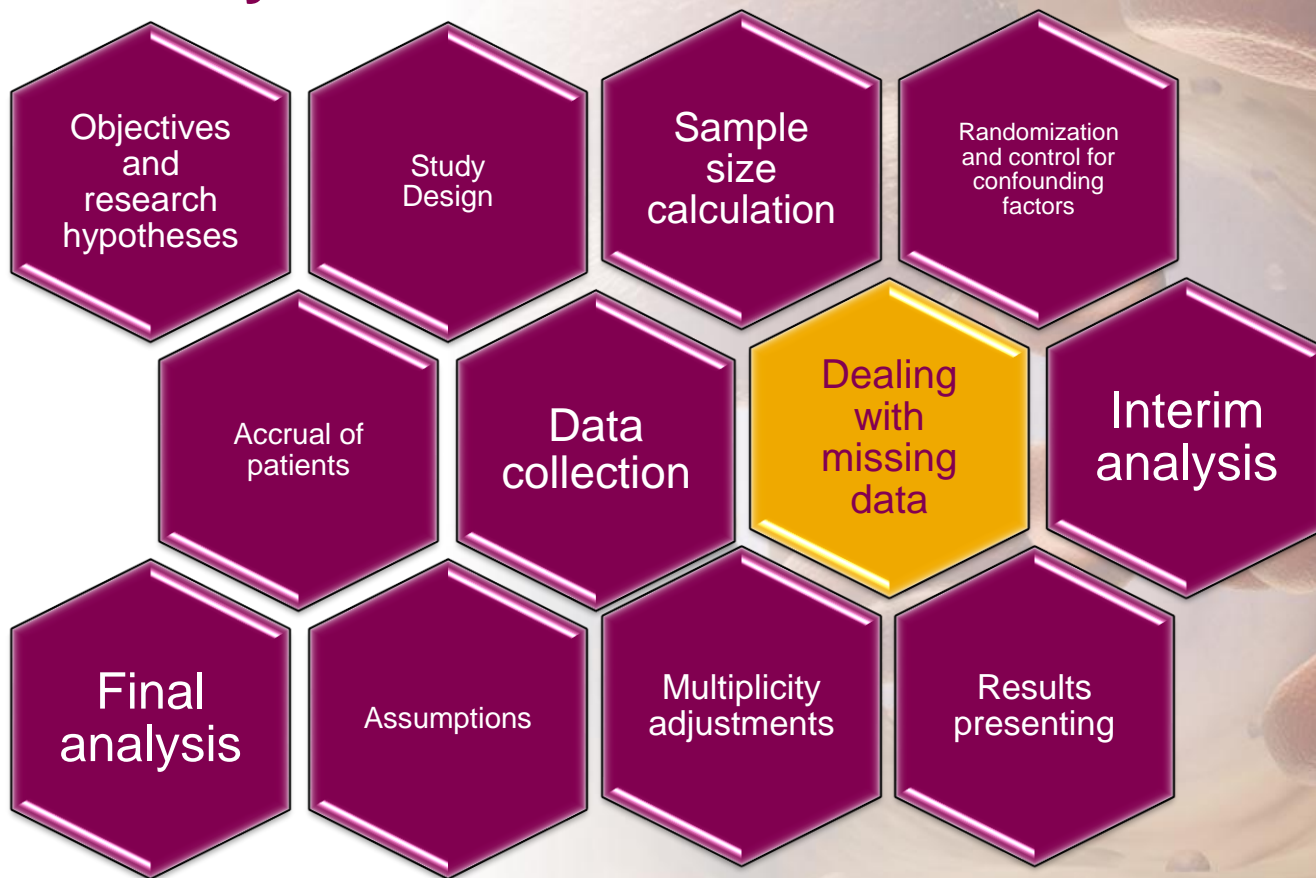




# Controlling for confounding factors



# Statistical Analysis Plan



# Missing Data

## Missing Completely at Random (MCAR)

- The probability of missing is independent of any characteristic of the subjects;
- The chance of missing data is the same for individuals in different treatment groups.

## Missing at Random (MAR)

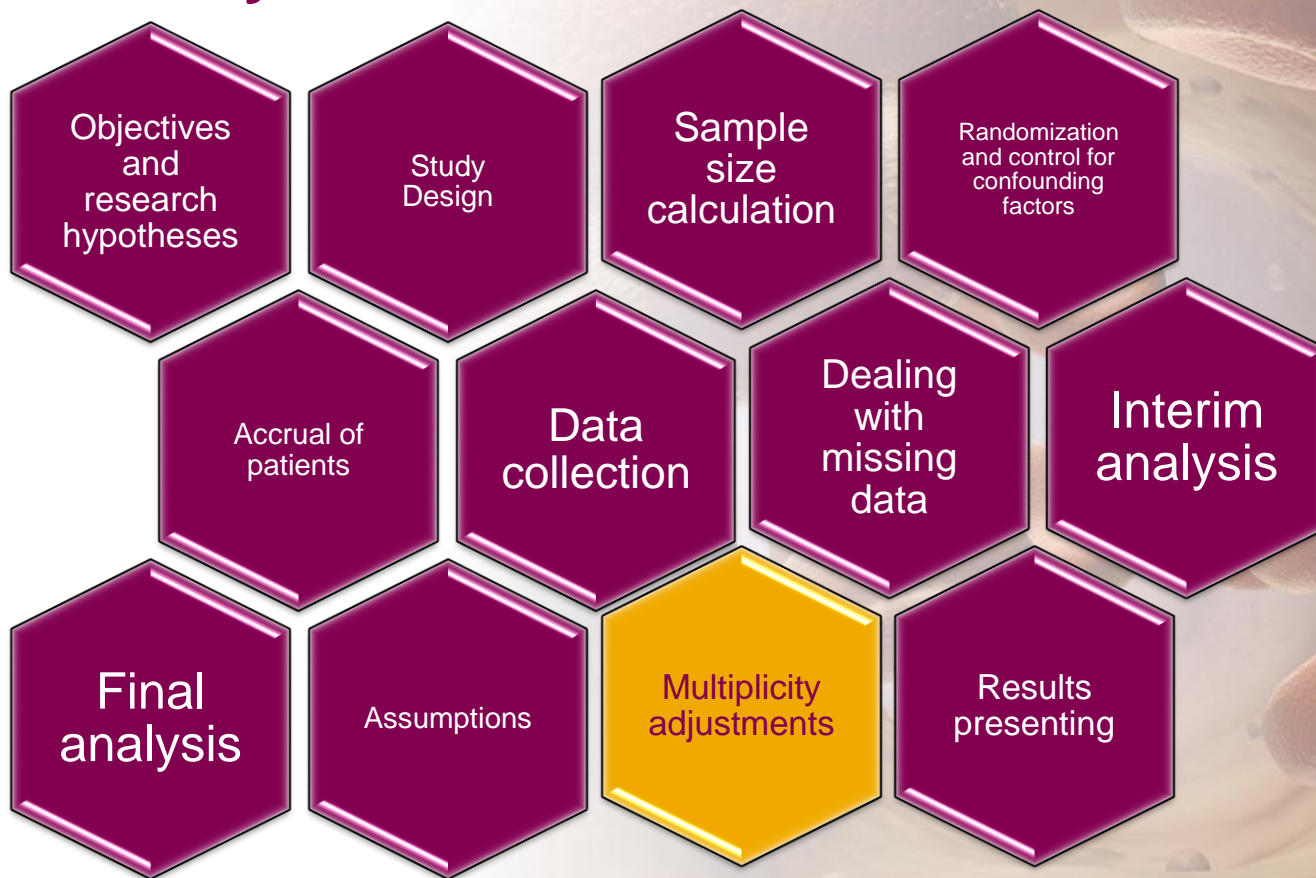
- The probability a variable is missing depends only on observed variables.

## Not Missing at Random (NMAR)

- Probability depends on variables that are incomplete



# Statistical Analysis Plan



# Multiplicity Adjustment

N independent tests examined for statistical significance (due to multiple study objectives, multiple doses, etc.)

All null hypotheses are true

The probability that at least one will be found statistically significant (reject the null hypothesis) =  $1 - (1 - \alpha)^N$  for given  $\alpha$  level.

## Bonferroni correction

- Test at  $\alpha = \alpha_{FWER}/N$

## Holm's correction

- Order the p-values from smallest to largest ( $i=1, \dots, m$ ).
- Each  $p_i$  is compared to  $\alpha/(m - (i - 1))$
- Stop if fail to reject for some  $i$ .

## Benjamini and Hochberg's correction

- p-values are sorted in ascending order.
- Each  $p_i$  is compared to  $\alpha(i/m)$
- Stopping rule

## Hochberg and Hommel

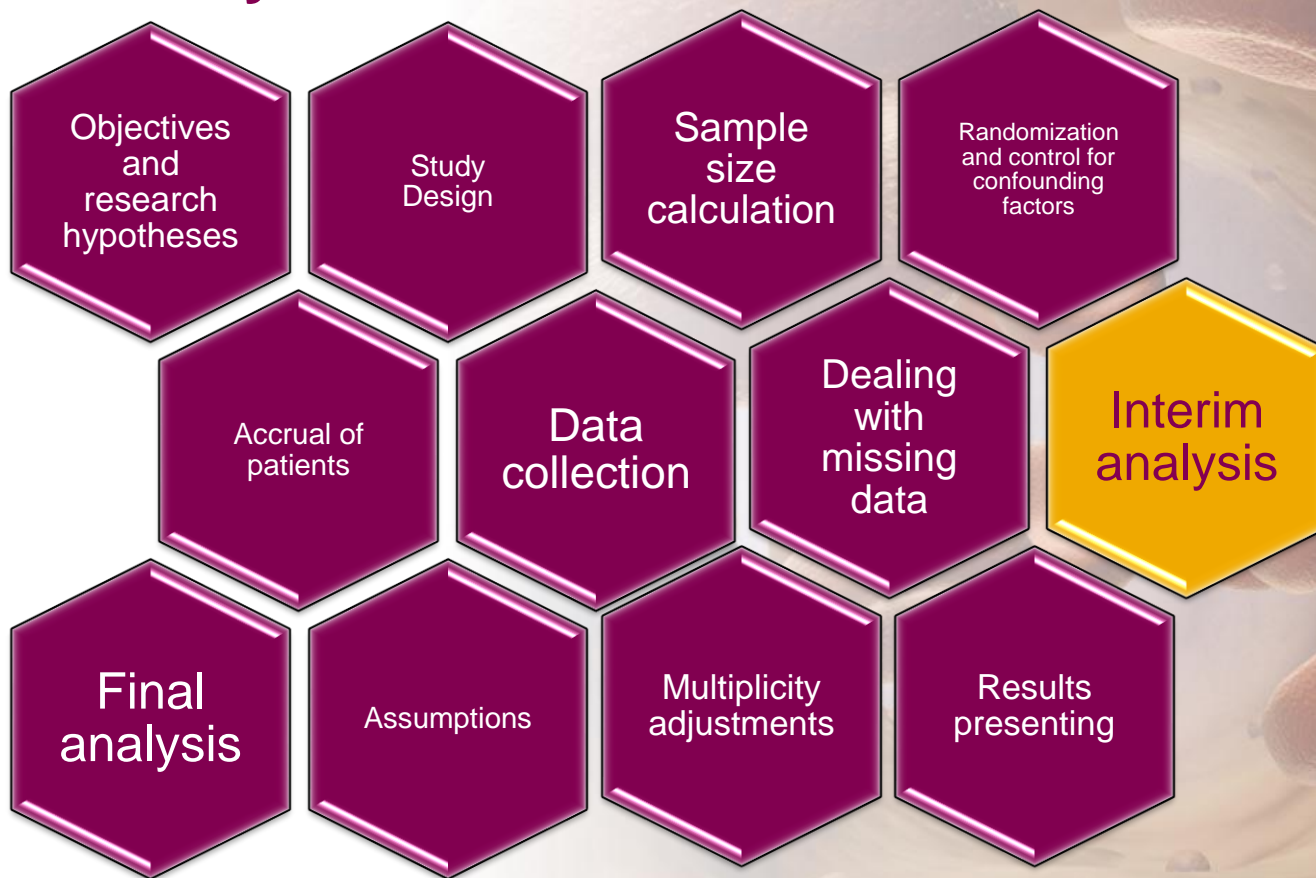
- For multiple doses and objectives

More...





# Statistical Analysis Plan



# Interim Analysis and Futility Analysis

## Great results:

Strategy for early stopping if an interim analysis reveals large differences between treatment groups.

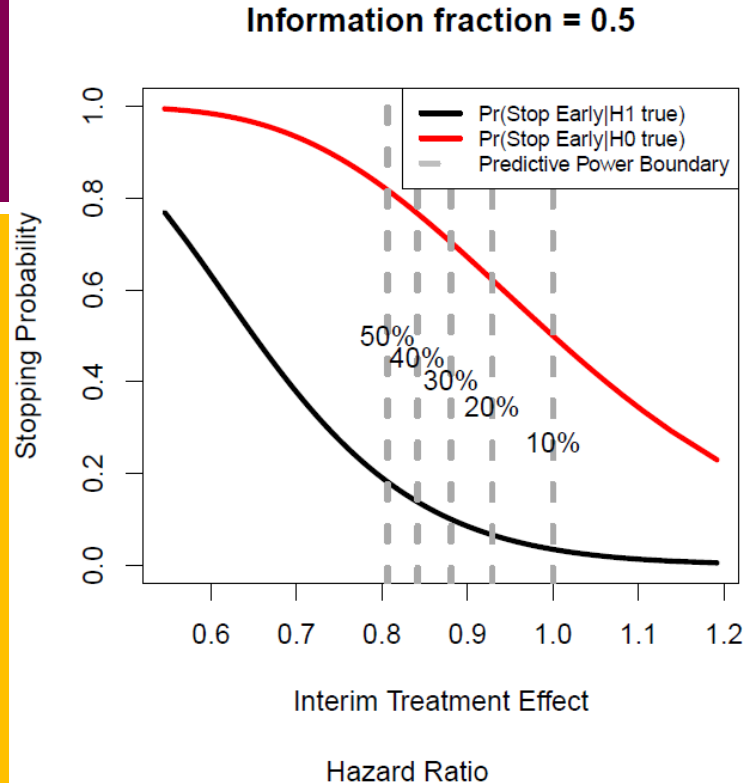
- Saves time and resources
- Reduces study participants' exposure to the inferior treatment.

## Interim futility analysis:

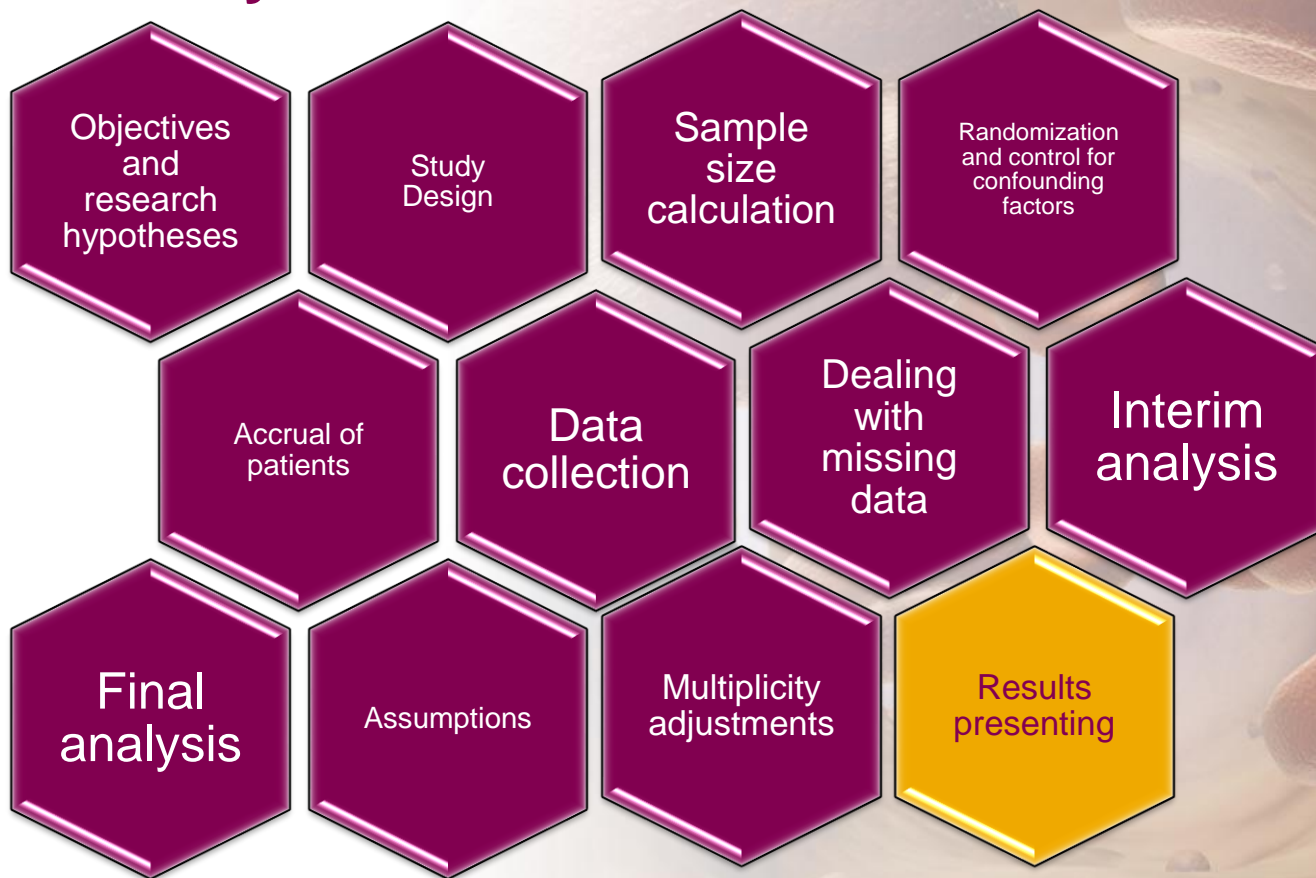
Stop the trial if chance of success at the final analysis be sufficiently small.

Key statistical considerations:

- When?
- What is the trigger value such that, if observed, the trial will be deemed futile?
- What will the savings be if futility is concluded?
- What is the probability futility will be concluded in error?
- What is the overall power of the trial with a futility analysis incorporated?



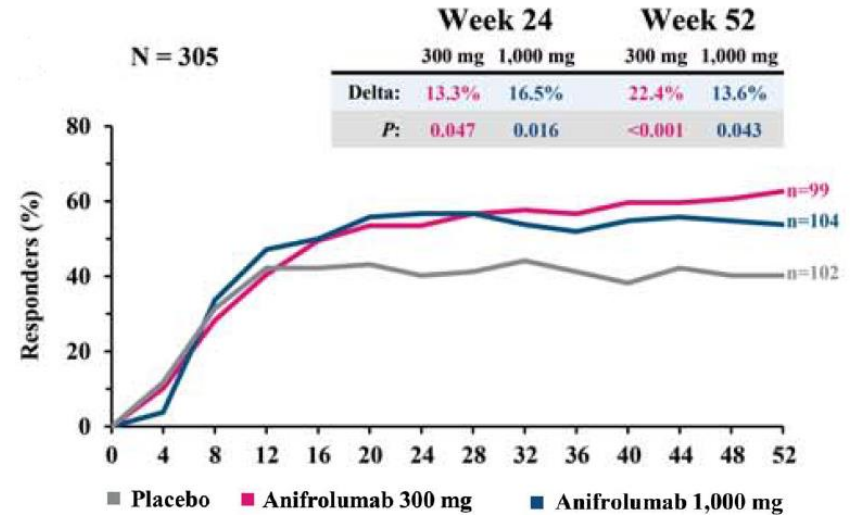
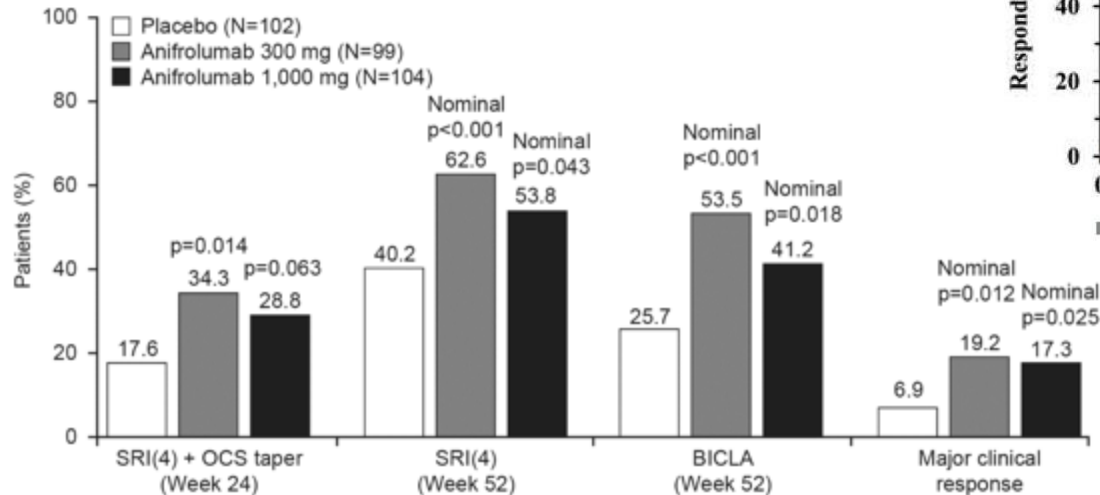
# Statistical Analysis Plan



# Clinical study report (CSR)

Includes ~200 tables, figures, listings:

- Population characteristics;
- Efficacy;
- Safety.



# Transparency and Regulation

[ClinicalTrials.gov](https://clinicaltrials.gov) is a Web-based resource that provides the public with easy access to information on clinical studies on a wide range of diseases and conditions.

Big regulatory agencies:

- Food and Drug Administration (FDA)
- European Medicines Agency (EMA)

If the reviews by regulatory agencies show that the drug's benefits outweigh its known risks and the drug can be manufactured in a way that ensures a quality product, the drug is approved and can be marketed.

Risk vs Benefit





# Conclusion

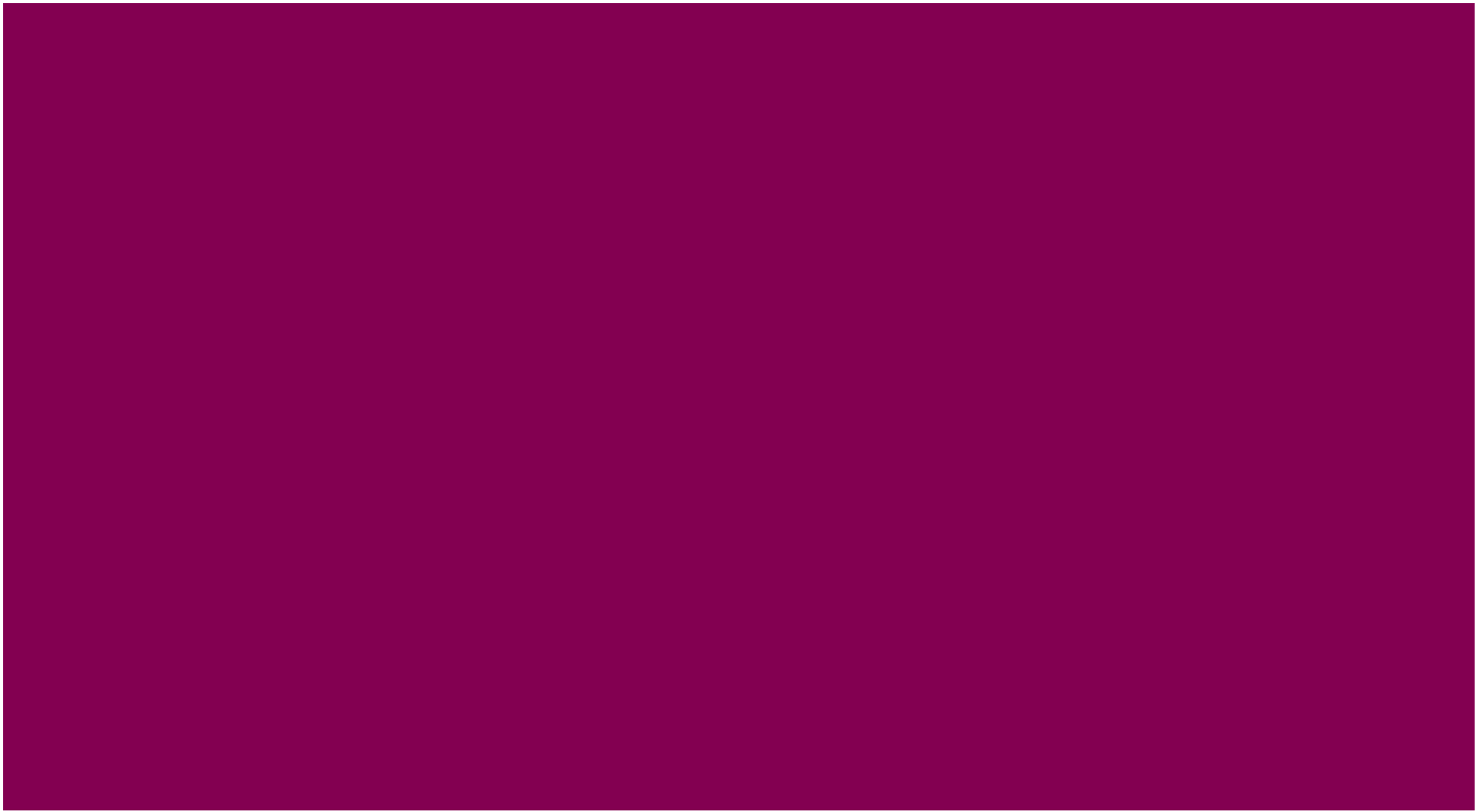
A biostatistician develops statistical methods and apply them to human health topics ultimately to improve human health.

Statistics aims to gives answers about dependencies and inferences, but always states a measure of uncertainty.

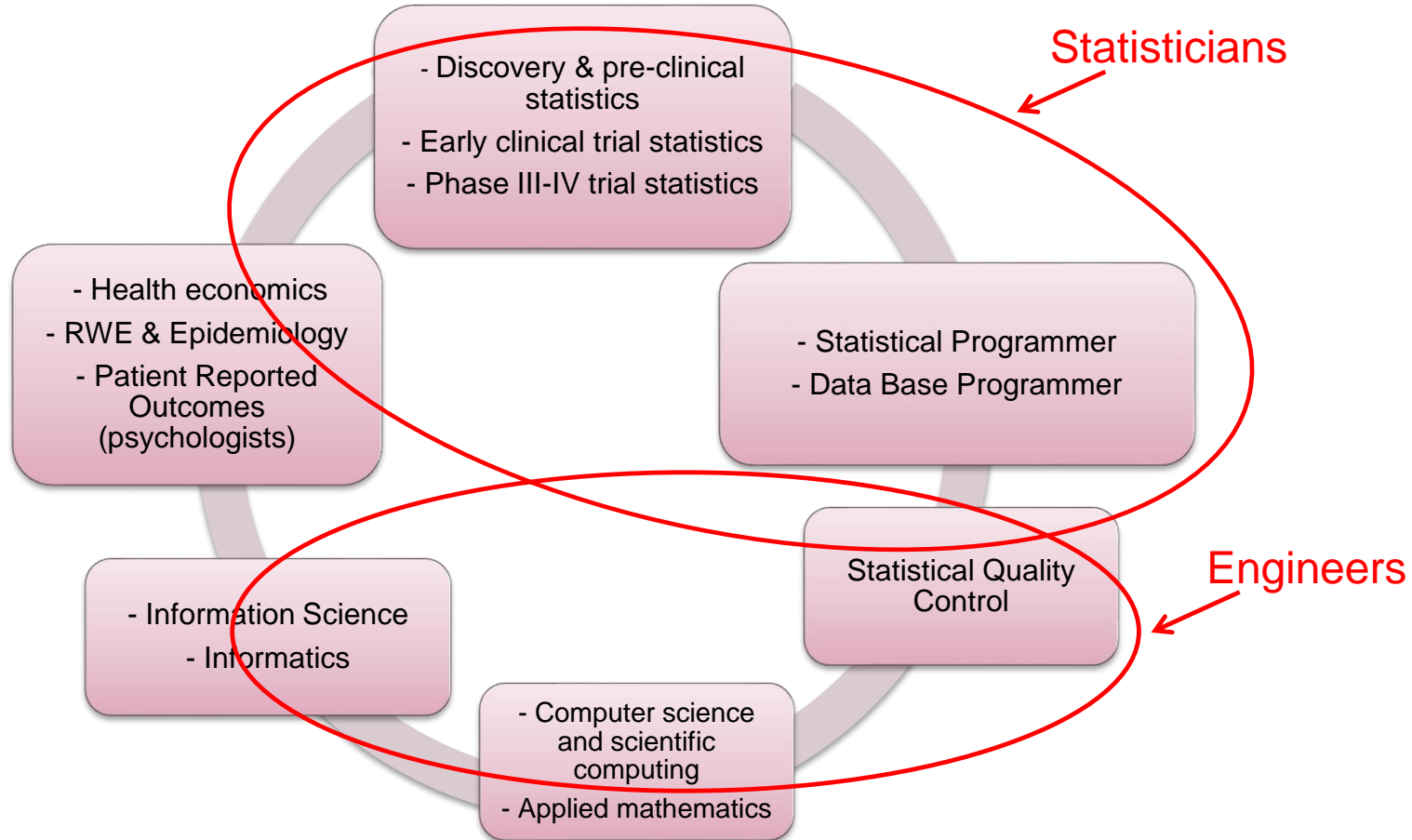
Always space for exploration

Help save lives





# Statistikområden och närliggande områden inom läkemedelsindustrin



# Missing Data

	MCAR	MAR	NMAR
<b>Unbiased Effects and Standard Errors</b>	<ul style="list-style-type: none"> <li>- Likelihood Based Analysis</li> <li>- Multiple Imputation</li> <li>- Inverse Probability Weighting</li> <li>- Complete-case</li> </ul>	<ul style="list-style-type: none"> <li>- Likelihood Based Analysis</li> <li>- Multiple Imputation</li> <li>- Inverse Probability Weighting</li> </ul>	Acceptable:  <ul style="list-style-type: none"> <li>- Selection models</li> <li>- Pattern mixture models</li> </ul>
<b>Unbiased Effects</b>	<ul style="list-style-type: none"> <li>- Simple mean imputation</li> <li>- Conditional mean imputation</li> </ul>	<ul style="list-style-type: none"> <li>- Conditional mean imputation</li> </ul>	
<b>Avoid</b>	<ul style="list-style-type: none"> <li>- LOCF</li> <li>- BOCF</li> <li>- WOCF</li> </ul>	<ul style="list-style-type: none"> <li>- LOCF</li> <li>- BOCF</li> <li>- WOCF</li> <li>- Simple mean imputation</li> <li>- Complete-case</li> </ul>	

