



# Coming to grips with Quantitative Research

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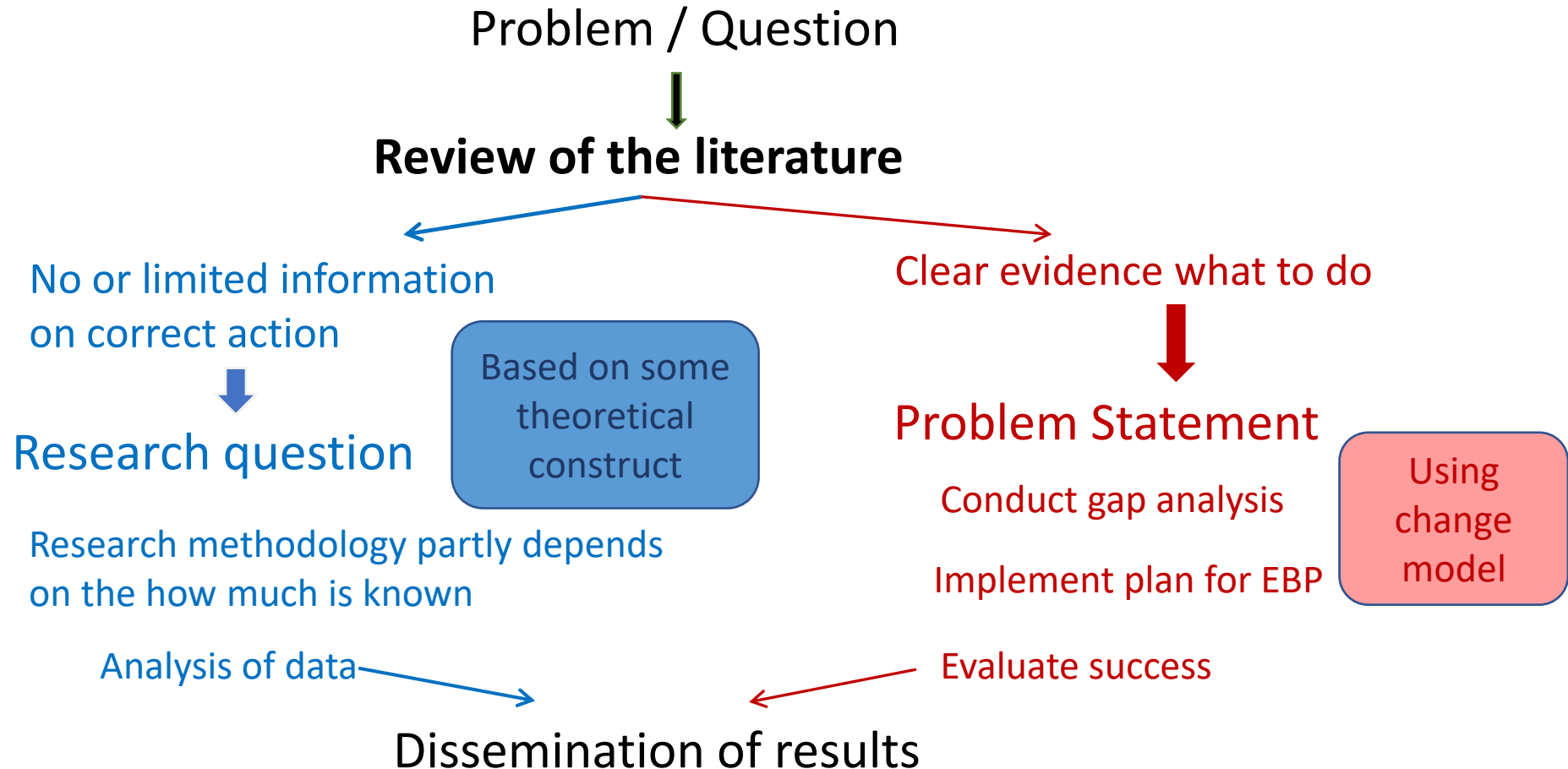
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# Today's objectives

- Contrast knowledge-generating research with quality improvement projects.
- Explain the basic principles of all quantitative research design to achieve valid and unbiased results.
- Describe how design of observational studies can approximate the design principles of a randomized control trial.
- Match appropriate study designs with different study aims.
- Describe essential elements in the methodology section of a quantitative research proposal.
- Discuss solutions to common biases in questionnaire development and administration.

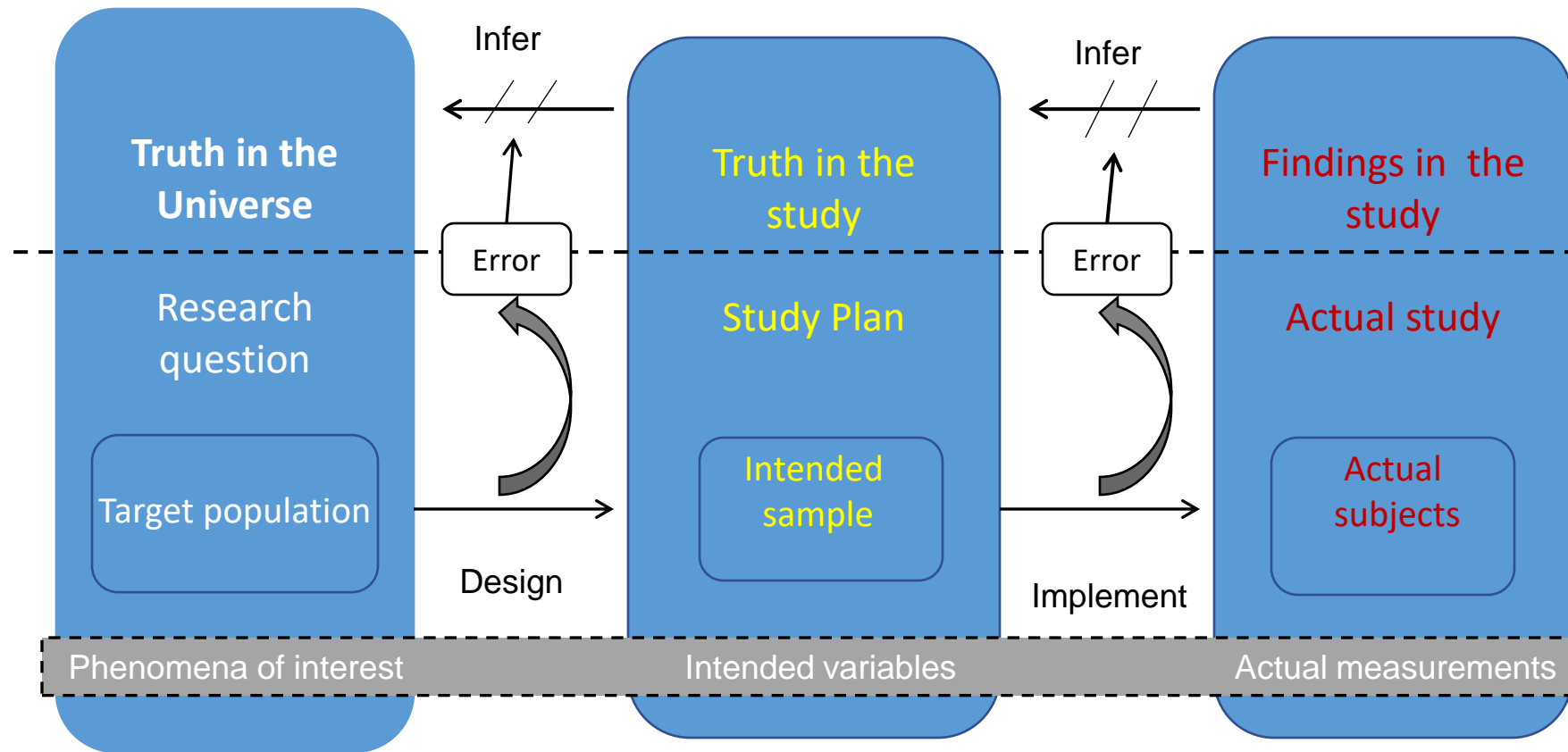
**Knowledge generating research**  
**versus**  
**Evidenced-based /Quality Improvement projects**



## Differentiating Research and Quality Improvement (QI)

	Research	Quality Improvement
Generalizability	Designed to be generalizable	Limited scope generalizability; methods, lessons learned
Role of Theory	Goal to prove/disprove an underlying theory	<b>Program is being tested</b> – not theory How to make the program better?
Methodology	Often uses experimental controls	Pre-, post-evaluation; matching or control charts
Assumption of benefit	Use of <b>equipoise</b> e.g. treatment not expected to be beneficial	QI intervention to all patients and assumed to be safe and effective
Informed consent	Required – ethically and there is no promise of benefits	Patient consent to treatment sufficient; QI ethically required since leads to better care
Other	Serves investigator goals	Serves organizational goals

# Designing a Study to get to “Truth”



# Components of an Experiment

	Lind Survy Clinical Trial
<b>Population</b> e.g., persons, mice, organisms	Sailors with scurvy (n=12) Paired together with similar symptoms
<b>Setting</b> – place where study takes place	HMS Salisbury ship
<b>Treatment</b> (intervention): <b>independent variable</b>	- Apple cider -Vinegar - Mustard & garlic purges - 2 oranges & 1 lemon - Elixir of vitriol -Sea water
<b>Timeframe:</b> period of research; data points	?7-14 days
<b>Observations</b> (measurements): what/how variables collected, measured, analyzed, interpreted <ul style="list-style-type: none"><li>• Outcome (dependent) variables</li><li>• Variable to check/control for confounding</li></ul>	Not well written up but the 2 who received oranges and lemons recovered  Typically: simple relative risk

# Meaning of 'Control' in Randomized Clinical Trial

## **Ruling out 'all' threats to valid inference**

- Eliminate as many sources of **systematic bias** as possible
  - Control the situation or environment of the experiment
  - Make groups as equal as possible on baseline characteristics
    - Requires a balance between inclusion and exclusion criteria
  - Determine which groups receive a particular treatment at a particular time i.e. strict control of independent variable
  - Use blinding to reduce treatment or outcome assessment bias
- Eliminate threats to valid inference by design
  - Control factors that can affect outcome e.g change behavior (Hawthorne) by using placebo
  - Statistical control of imbalances

# Three key characteristics of **all** studies

- **Comparability of populations**

- In RCT, random assignment and CONSORT figure for drop-outs and Table 1

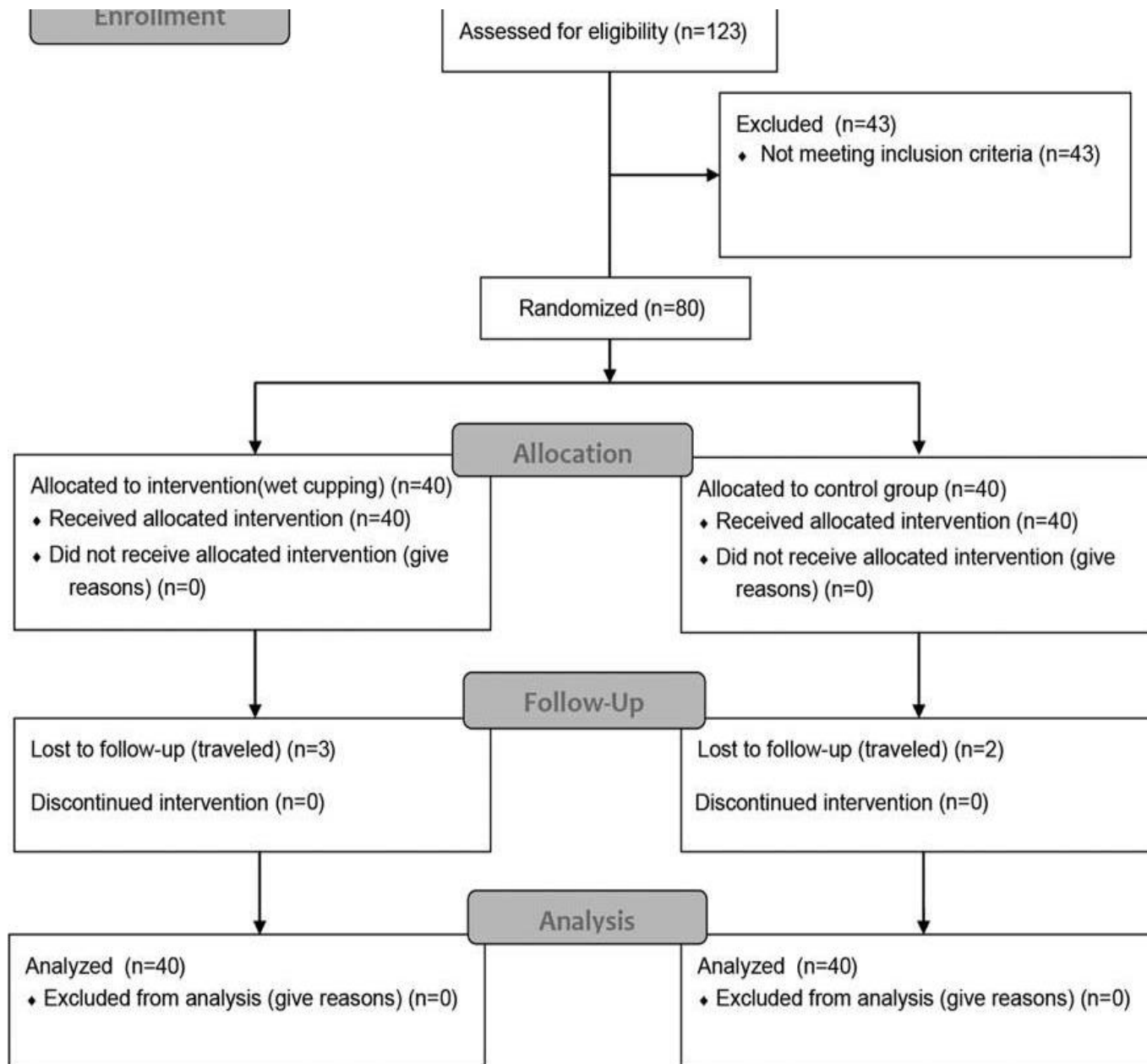
- **Comparability of information**

- In RCT, double/triple blinding

- **Comparability of effects**

- Use of 'placebo'/ control condition esp attention-control
  - Minimizes: expectation bias, performance bias (Hawthorn effect), detection bias
- Request subjects not use other treatments during the study





**Table 1. Baseline Characteristics in Intervention (Wet Cupping) and Control Groups**

Characteristic	Wet cupping (n = 40)	Control (n = 40)
Age (y)	36.48 (9.3)	36.43 (9.4)
Men/women (n/n)	22/18	17/23
Prognosis expectation on Likert scale	4.88 (0.9)	4.87 (1.1)
Age at onset (y)	31.88 (9.2)	32.48 (9.4)
Duration of illness (y)	4.45 (4.8)	3.85 (3.9)
NRS score	60.50 (19.7)	56.25 (17.5)
ODQ score	38.33 (19.2)	32.05 (15.9)
PPI score	2.35 (1.2)	2.13 (0.9)

Unless noted, values are the mean (standard deviation).  
NRS, Numeric Rating Scale; ODQ, Oswestry Disability Questionnaire; PPI, Present Pain Intensity.

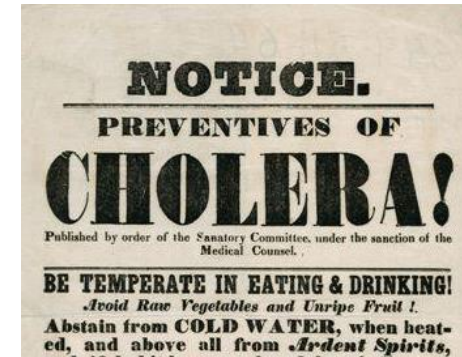
# John Snow intervenes in a cholera epidemic

## Situation

1865 cholera breaks out in London  
Cholera: severe diarrhea, vomiting, rapid dehydration  
with death within hours; 50% fatality rate  
Killed millions in 1800's in India, N. AM, Europe

## What was unknown

Understanding of bacteria  
Role of sanitary conditions



## Questions

How is cholera transmitted?  
How can we stop this cholera epidemic in central London?

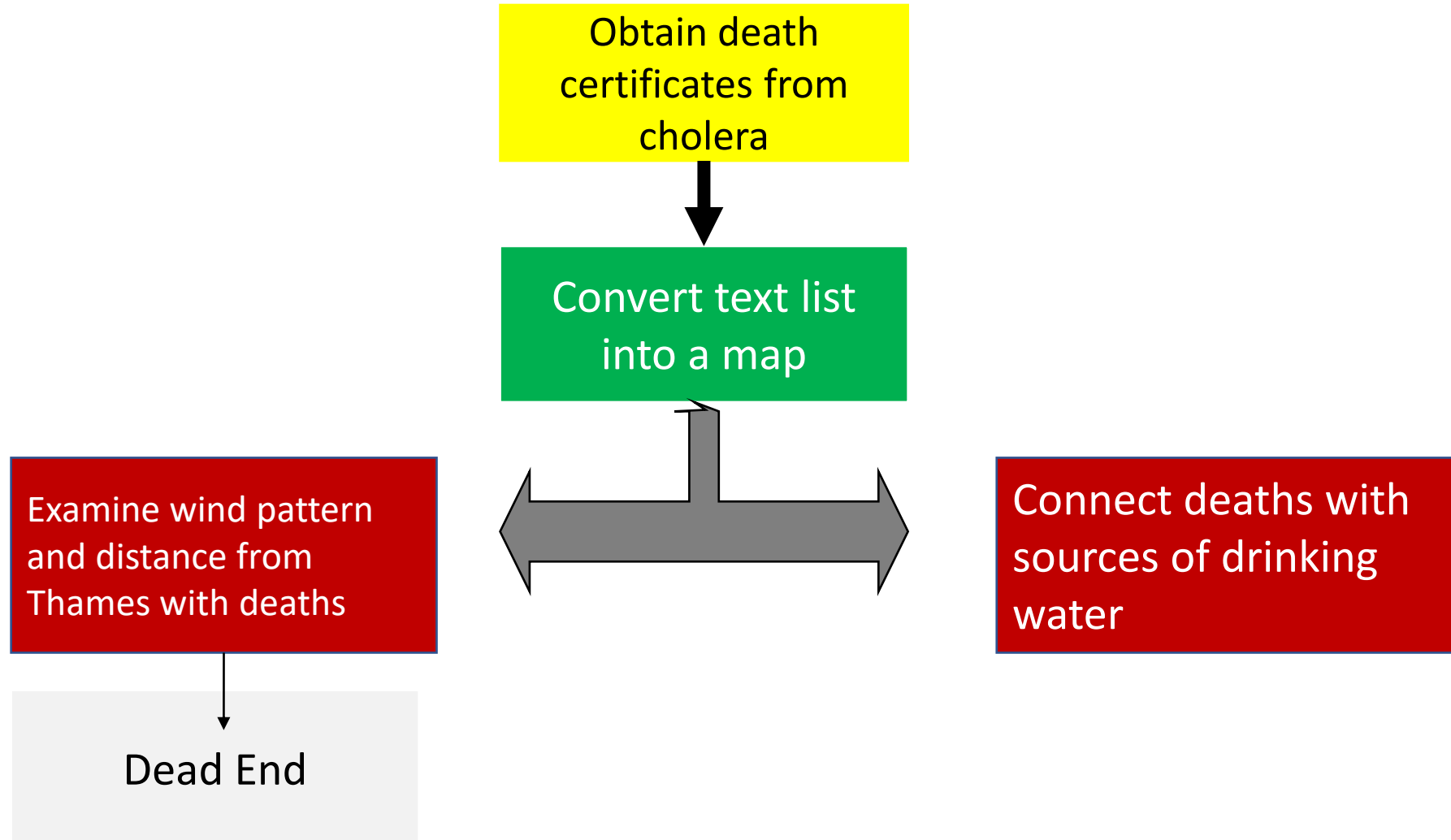
## Hypothesis

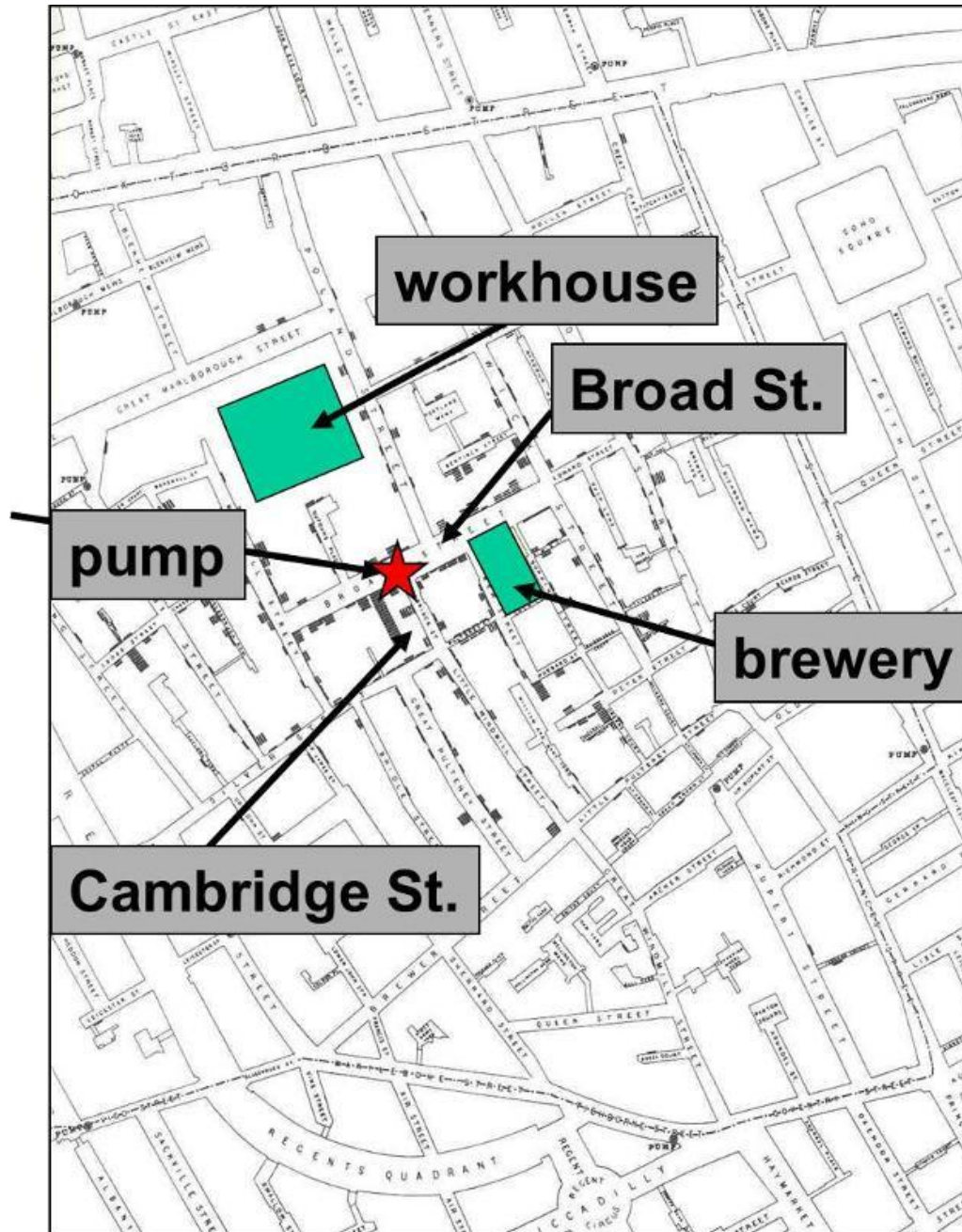
Cholera is spread by:

- 1) Breathing vapors of decaying matter
- 2) Drinking contaminated water

# John Snow's Designs and Methods:

## Searches for correlations between water and cholera





Snow correlates death locations with a water source



Broad street pump



Residence of cholera victim



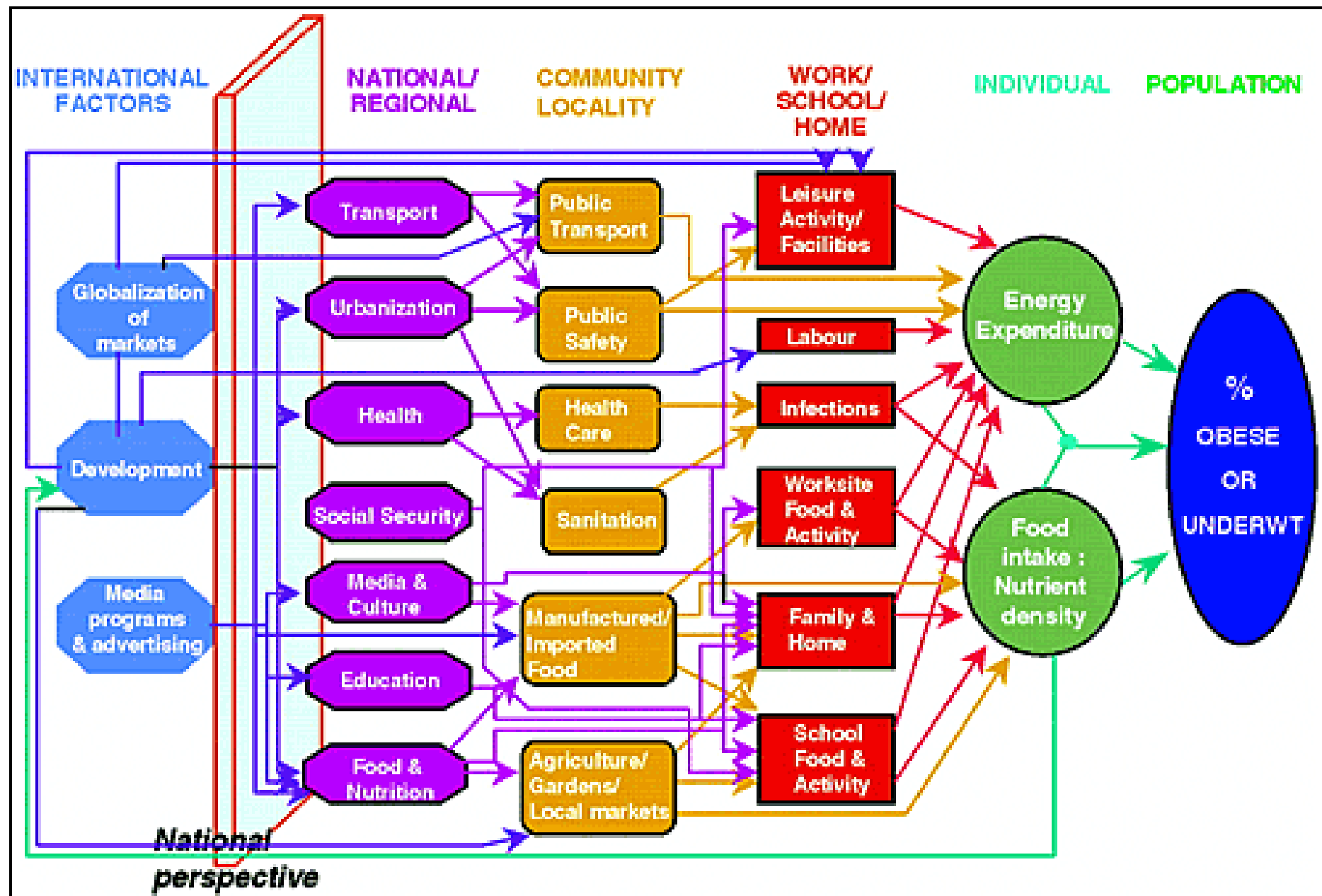
Different water source not Broad St. pump

Strong correlation of cholera victims drinking water from Broad St. pump!

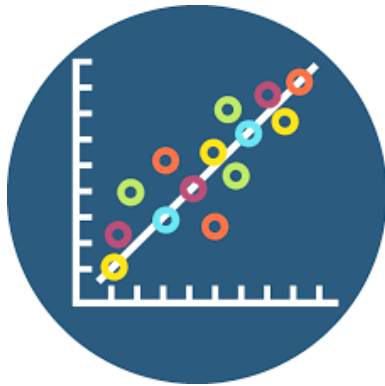
# Why do we need observational studies?

Please answer in the chat box

- It may be unethical or not feasible to do an experimental study
- An RCT may not answer the question you want to answer
  - RCTs are **efficacy** (what is possible under ideal conditions), not **effectiveness** trials
- Question you are studying may not suit RCT trial design
  - Very rare event
  - Complex processes



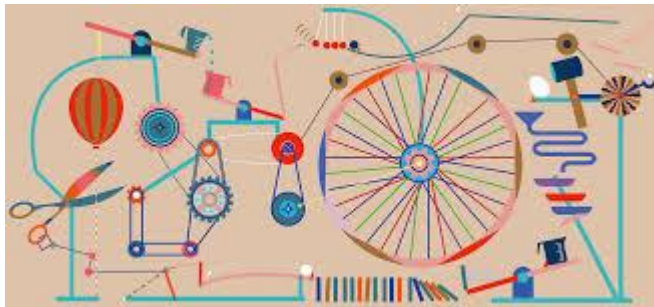
# Types of quantitative research



Analytic  
(correlational)



Descriptive



Quasi-experimental: Causal-comparative



Experimental: RCT

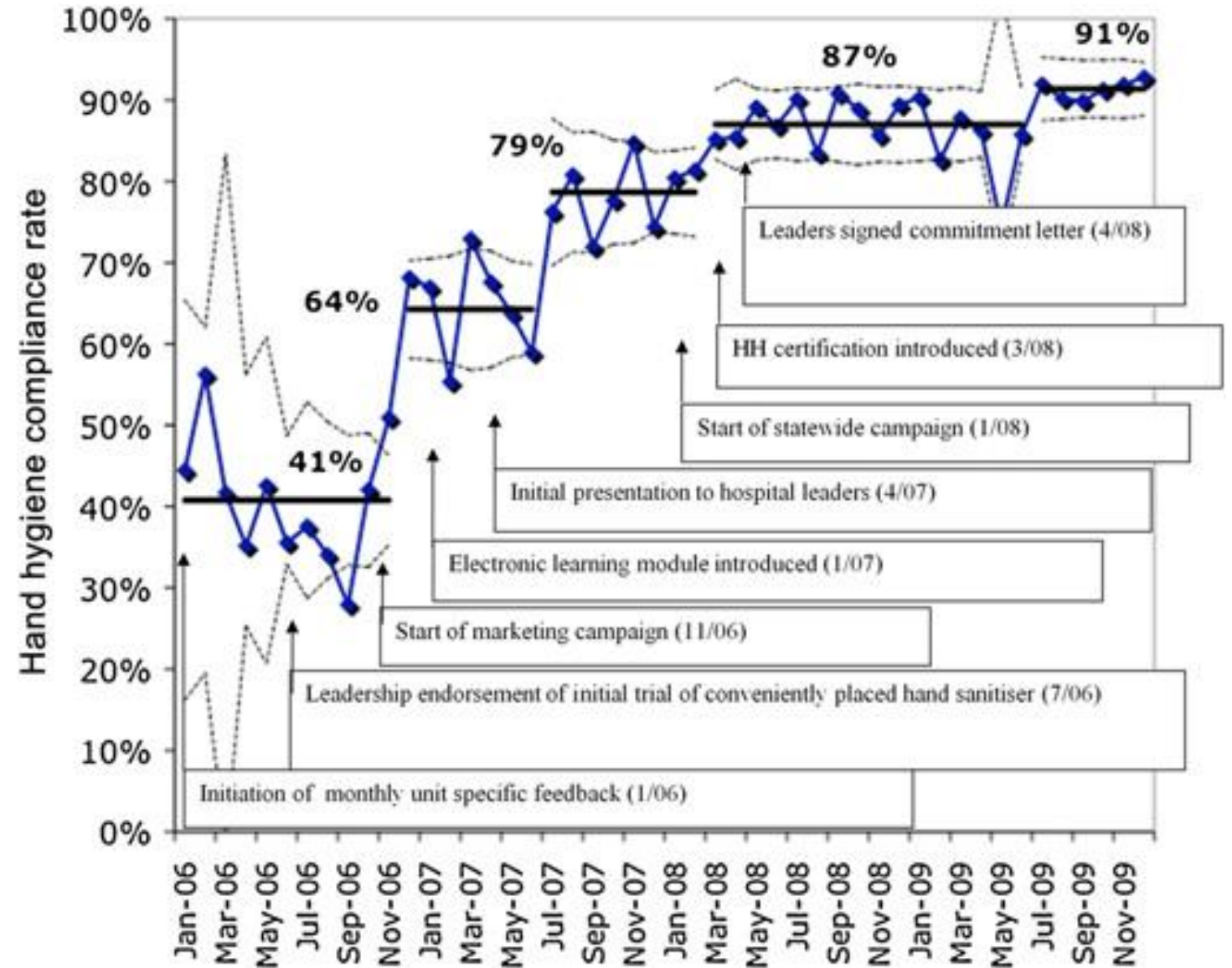
# Quasi-experimental Design

Like experiment, aims to assess cause and effect

- No random assignment of subjects but random assignment may occur e.g., by groups or setting (aka Cluster randomization)
- Control groups compensates for lack of randomization
- Intervention introduced in one group but not the other (control group)
  - Effect on subjects are measured and compared between groups
- Design variations
  - Natural experiment: event occurs naturally e.g. earthquake, disaster
  - Non-equivalent control group e.g. outcomes in a clinic before a new process is introduced and after
  - Time-series design: effects of treatment inferred from measurement taken multiple times before and after treatment



Kirkland KB, et al. Impact of hospital wide handwashing hygiene initiative on hospital-care associated infections: results of an interrupted time series. *BMJ Safe Qual*.2012; 21(12):1019.



# Observational Studies

No manipulation or control or random assignment to groups  
**CANNOT** by themselves determine cause and effect

- **Descriptive study**

Describes characteristics/behaviors of a population or situation &/or frequency of a phenomenon.

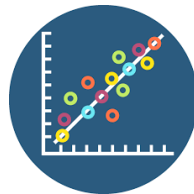


- **Analytic/Correlational study**

Describe size (magnitude) and direction of the relationship between 2 or more variables

- Hypothesis generating
- Improve or inform health-related activities
- Inform decision-making

Comparison between groups usually



## Potential Data collection methods

- Cohort: follow group over time
- Cross-sectional: one time assessment
- Case-control: choose controls to match cases and assess exposures
- Secondary Data: can be any of the above designs depending on how data collected
- Meta-Analytic: combine study results

# What are the issues related to observational studies?

## Reply in chat box

Example: If we want to examine the relationship between smoking and a health outcome since we can't randomize

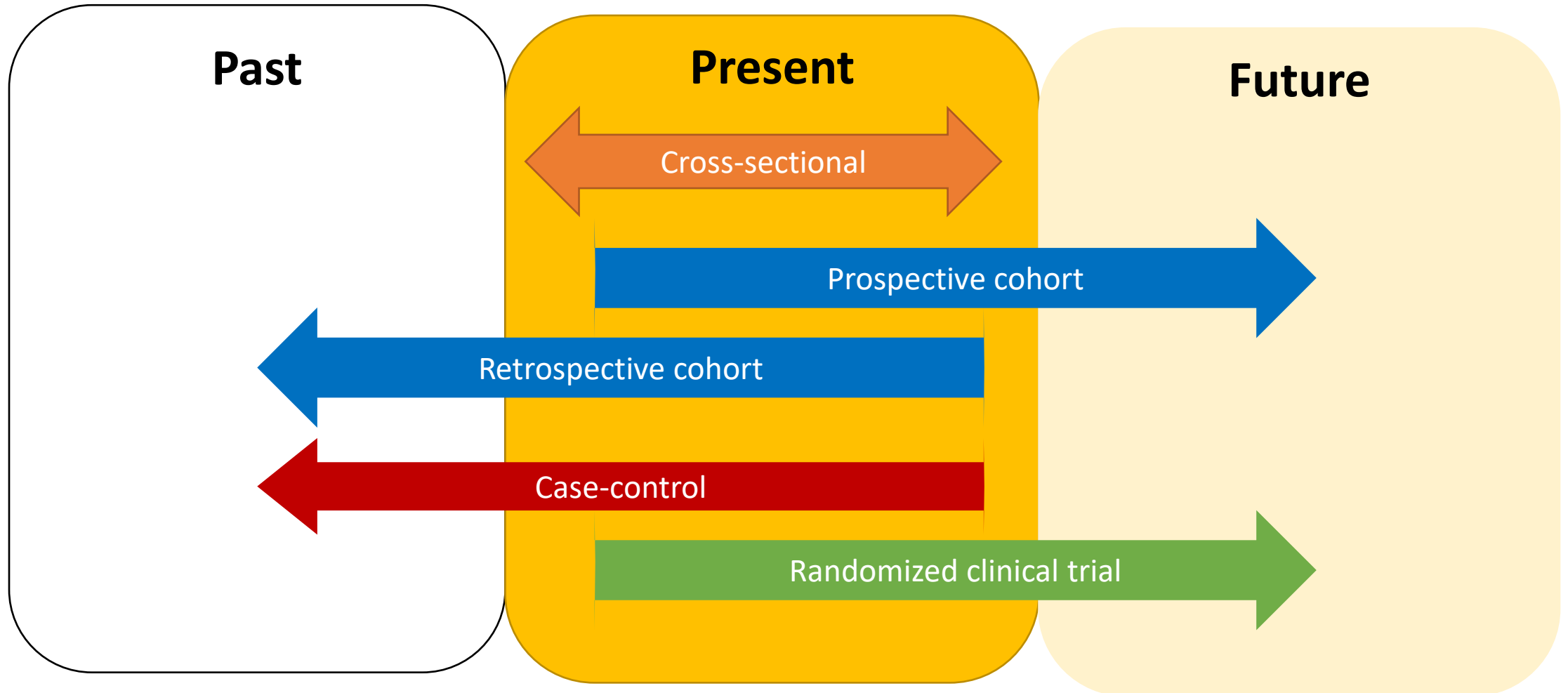
- Comparability of populations
  - Baseline characteristic differences
- Comparability of effects
  - Confounding or bias
- Comparability of information
- Differences by gender and age of smokers
- In observational studies, people self-select their exposures which may be associated with many other behaviors/issues (exposures) e.g. mental health, drug use, exercise activity
- Need objective measures that can't be influenced by participant or researcher
- Researcher must use same source for information
- If proxy person used, how to assure comparable information

## Cohort study example of excellent 'comparabilites'

Risk of myocardial infarction, death, and diabetes in identified twins with different BMI (Nordstrom et al JAMA Int Med, 2016)

- Comparability of populations
  - Monozygotic twins
    - Same genetics
    - Same gender
- Comparability of effects
  - Sociodemographic and behavior information collected at same time with same instrument before outcomes measured
- Comparability of information
  - As above plus used same Swedish health database to measure outcomes

# Study Designs and Time



# Cohort compared to RCT

## Similarities

- Comparison across two or more exposure groups
- Follow subjects to monitor outcomes
- Select groups to achieve comparability and efficiency
- Proportion in the compared groups does not reflect the general population
- Statistical measure: relative risk (both have complete denominators)

## Differences

- RCT: random allocation of exposure  
Cohort: self-selection of exposure
- RCT: randomize for baseline comparability  
Cohort: must carefully select groups to achieve comparability or adjust statistically
- RCT: use placebo to match group experiences' and mask assignment  
Cohort: select groups carefully to do this; masking possible sometimes
- TIME: RCT – prospective  
Cohort – either direction

# Cross-sectional Studies

## Advantages

- Fast and inexpensive to do
- No loss to follow-up
- Many exposures and outcomes can be assessed
  - Hypothesis generating
- Can be highly generalizable if using population-based data

## Disadvantages

- Temporal sequence uncertainty making causal inference difficult
- Impractical if the focus is a rare disease
- Preponderance of prevalent cases of long duration leading to 'healthy worker/survivor bias' (bias against finding an association)

Since there is no true denominator, measure of association is the odds ratio.

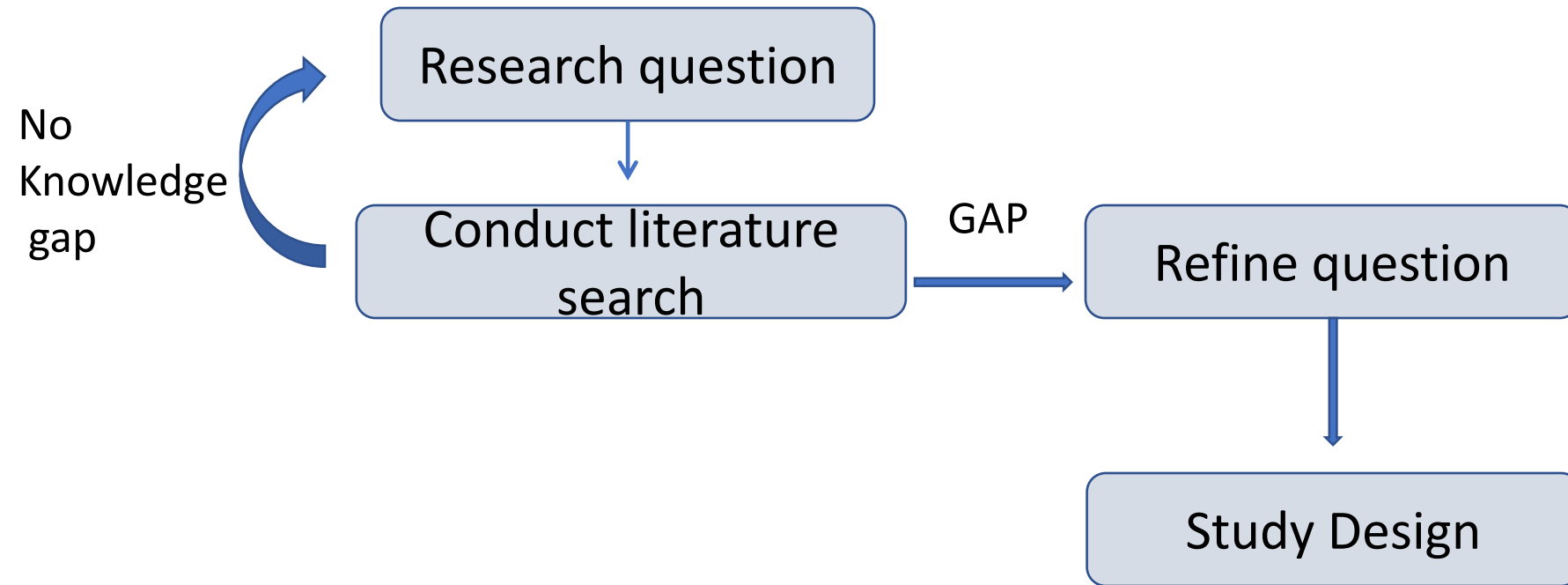
# When can an association be judged as causal?

(adapted Bradford Hill Criteria)

- Temporal relationship e.g. exposure occurs before the outcome
- Strength of association e.g. large relative risk
- Dose-response relationship (biologic gradient)
- Biologic plausibility
- Consistency with other knowledge
- Alternative relationships explored
- Cessation of exposure
- [Specificity of association]



# Designing a research study



# What study design?

- If focus on individual values and experiences, **qualitative study**
- If little is known about the topic, and doing an exploratory study: **qualitative study or descriptive study**
- Confirmatory study: **experimental, quasi-experimental, observational analytic (correlational)**

# Deciding Among Study Designs

Goal: Obtaining valid and precise information on the association between exposure and disease using a minimum of resources



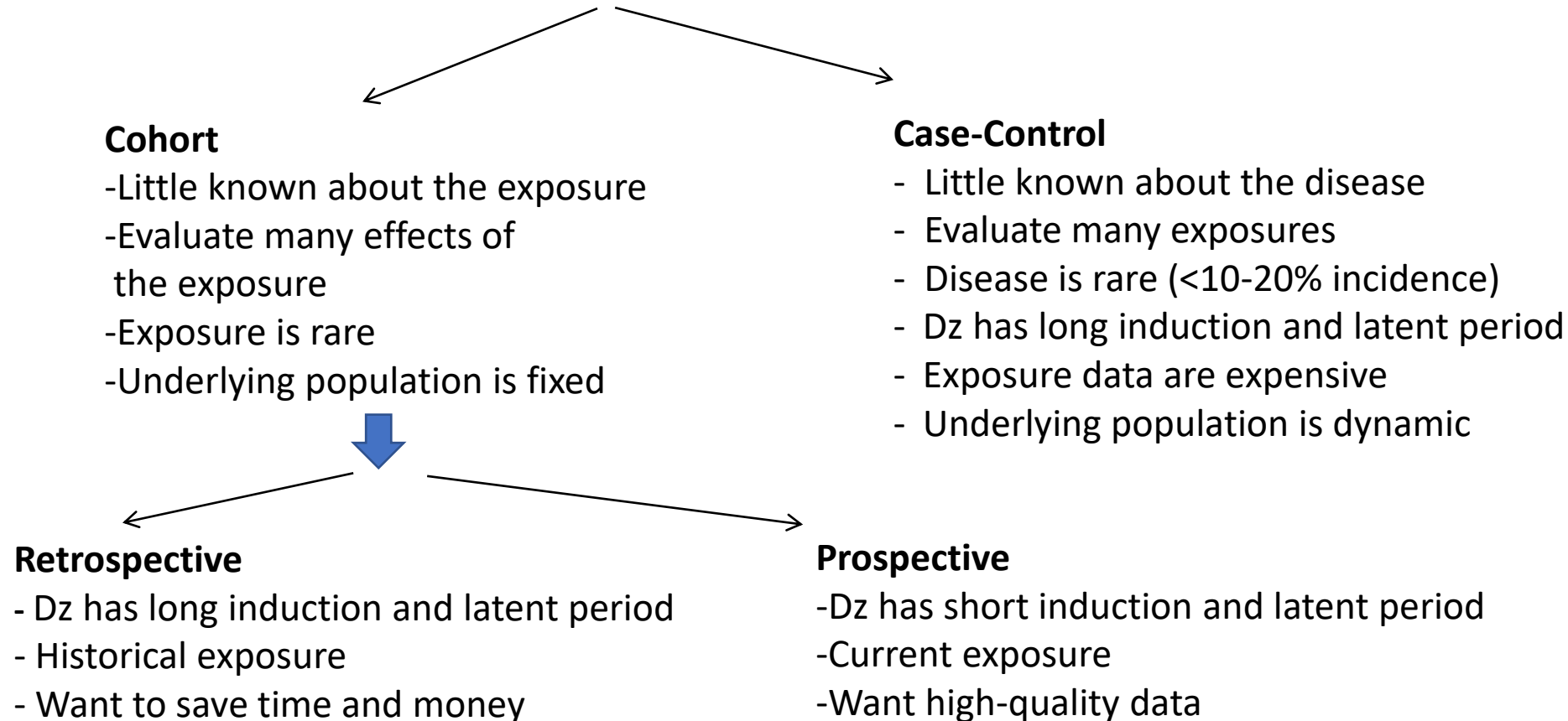
## **Observational**

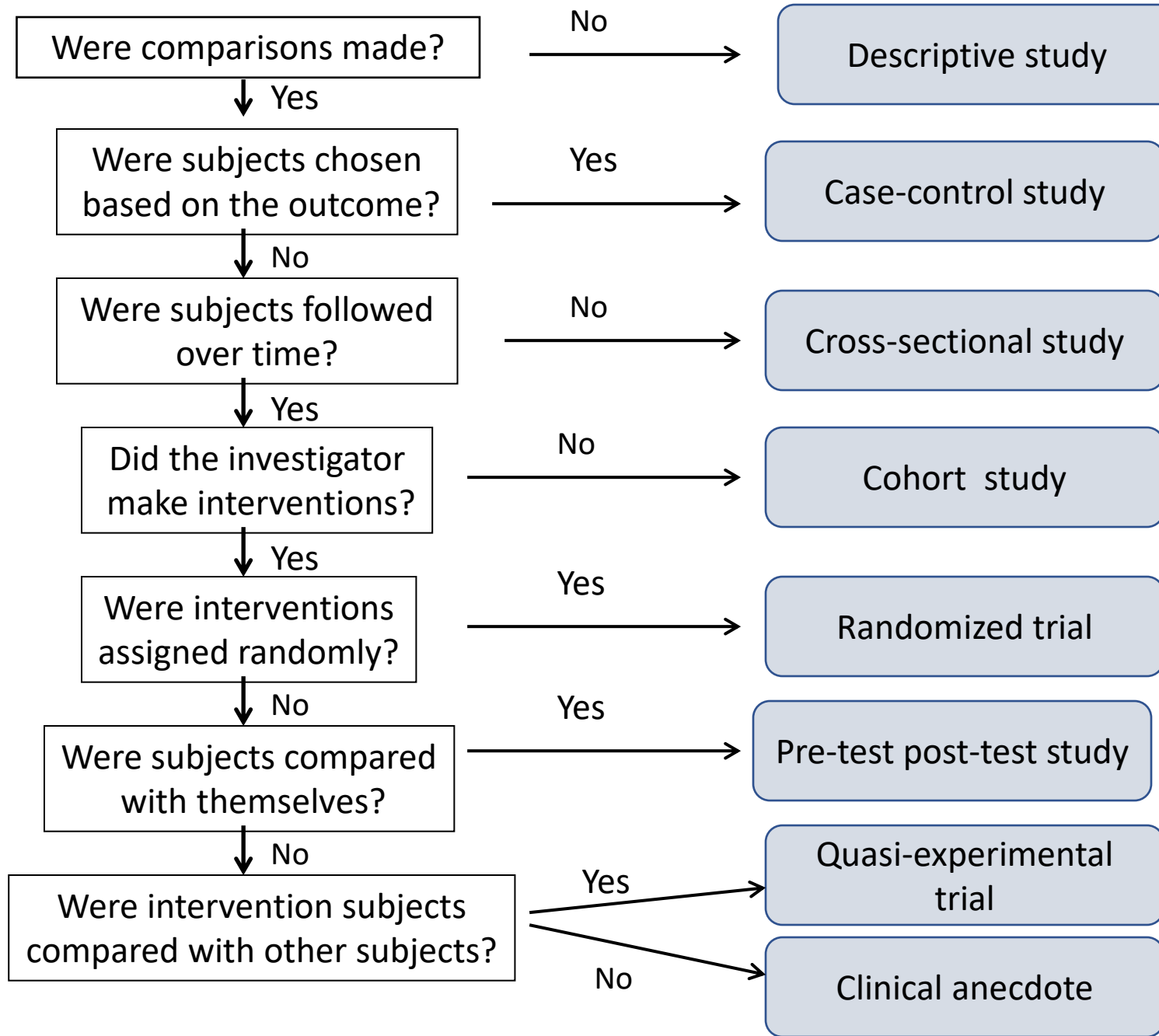
- Objective prevention, treatment, or causal factor
- Moderate to large effect expected
- RCT not ethical or feasible
- RCT too expensive

## **Experimental**

- Objective: prevention or treatment
- Small effect expected
- Ethical and feasible
- Money is available

# If Observational, more decisions





# Methodology Section of Research Proposal

- Study Design
- Study Population
- Study Setting
- Recruitment
- Study measures – variable table may be useful
- Study Conduct
- Analytic strategy
- Potential Barriers and Limitations
- Research ethics
- Study Timeline

# Study population, setting, recruitment

- Be specific as possible about the setting and population
- Inclusion and exclusion criteria
  - Be thoughtful and only if exclude if essential
  - More criteria, less generalizability
- Sample size needed – **this needs to be done early in the process**
  - Depends on the effect size you anticipate in finding (as well as alpha and beta)
  - If a prospective study, need to account for drop-outs to obtain needed sample
- How will you recruit?
- What about privacy issues in recruiting and completing questionnaires?
- What about asking a group to complete the questionnaires?
  - Okay for them to talk among themselves? If not, important to provide this instruction.

# Study Measures: Variable table example

Table 1 – Subjective and Objective Study Measures		
Measure	Instrument/Measure	Validity/reliability statistics
Demographic characteristics	Information on age, race/ethnicity, marital status, education, length of time without permanent shelter prior to present shelter, and lifetime income	
Insomnia Severity Index (ISI) (Aim 1)	7 item scale for insomnia severity. Scores range from 0-28	Internal consistency: Cronbach's 0.90; In community population: sensitivity 86.1%; specificity 87.7% with cut-off>10. <sup>62</sup> 8.4 pts decreased associated with moderate improvement of symptoms in clinical population <sup>62</sup>
PROMIS Sleep-Related Impairment Scale (Aim 1)	8 items to measure effects of sleep ion daytime activity	Correlation with full PROMIS item bank = 0.98. <sup>63</sup> The discrimination slope parameters range from 1.67 – 3.76. <sup>64</sup>
Hair cortisol (Aim 2)	Physiological distress as measured by cortisol in 3mm diameter vertex hair sample.	Test-retest correlations 0.68-0.79 <sup>65</sup> . Coefficient of variation <5%.
PROMIS SFv1.0 Anxiety 8a (Aim 2)	Distress scale using an 8 item anxiety scale of symptoms over last 7 days	Internal consistency reliability of .90 over a range of T-scores 42-80. <sup>66</sup>
PTSD Checklist v. 5 (PCL-5)(Aim 2)	New 20 item 5-point Likert scale of PTSD symptoms was revised to correspond with the DMS-5.	For mixed population of community, college students, & military: <sup>67,68</sup> Cronbach's alpha .89-.94; test-retest .82-.87; convergent reliability (rs=.74-.78)



# Common errors in methodology section

- Definitions for independent and dependent variables do not match the study aims or questions
- Wrong study design to meet study aims
  - Measuring a complex concept that may change at only one point in time
- Lack of specificity about recruitment and study procedures
- Analytic approach does not match the variables in the study

# Surveys and Their Administration



# Goal of Surveys or Research Questionnaires

**Obtain the minimum amount of data to provide quality data about the problem.**

How do you develop a survey/questionnaire?

- Delphi study: obtain opinions from experts
- Focus groups of study target population
- Choose appropriate validated instruments
  - COSMIN ([www.cosmin.nl](http://www.cosmin.nl))  
(**CO**nsensus-based **S**tandards for the selection of health **M**easure **IN**struments)
    - Find different instruments
    - Appraisal tools and checklists to assess appropriateness of the instrument

**Resource:** O'Connor, S. (2022) Designing and using surveys in nursing research: A contemporary discussion. *Clinical Nursing Research*. 31(4), 567-70.

# Questionnaire Reliability & Validity

## Validity

- Face/content validity
- Construct validity
  - Requires several studies to evaluate
- Criterion validity
  - Compared to 'gold standard'

## Reliability

- Test-retest
  - Consistency of results at 2 different times
  - $\geq .70$  acceptable (Pearson or Intraclass correlation)
  - Obtain for your study through pilot testing
- Inter-rater reliability
  - Consistency across raters or observers
  - Cohen's kappa or intraclass correlation
  - Ideal  $\geq .75$ ;  $> .50$  acceptable
- Internal consistency (validated instruments)
  - Degree to which items measure a single concept
  - Cronbach's alpha around .80 ideal (.70 OK)

# Sources of Bias in Questionnaires

- Question Design
- Questionnaire Design
- Survey Administration
- Analysis

# Plain Language principles

- Logical organization with reader in mind
- Use 'you' and other pronouns
- Use the active voice
- Use short sentences (less than 15 words)
- Incorporate easy-to-read design features
  - Use upper and lowercase text
  - Use at least 12 point font
  - Use headings and sub-headings

# Sources of Bias in Question Design

## Wording

- Ambiguous questions
- Overly complex questions
- Double barreled questions
- Leading questions
- Technical Jargon or uncommon words
- Vague Words

## Faulty Scale

- **Forced choice**
  - Too few choices?
  - Use “Don’t Know?”
- **Missing interval**
  - Cover every choice
- **Overlapping interval**
  - Use mutually exclusive categories

# Vague words encourage vague answers

## **Contrast:**

How often do you exercise?

☐ Regularly

☐ Occasionally

How often do you exercise?

☐ twice a week or more often

☐ once a week

☐ less than once a week



# Decide on type of questions

## Frequency

During the <b>Past Month</b> , how much of the time did you:		None of the time	A little of the time	Some of the time	A good bit of the time	Most of the time	All of the time
1	have difficulty reasoning and solving problems? <i>(for example: making plans, decisions, learning new things)</i>	1	2	3	4	5	6
2	have difficulty doing activities involving concentration and thinking?	1	2	3	4	5	6

## Likert Scale

**My doctors spent enough time with me during my labor and birth**

Strongly disagree	Disagree	Undecided	Agree	Strongly Agree
1	2	3	4	5

**How SATISFIED/dissatisfied are you with your Mantram? (Circle one)**

Very NOT Satisfied				Very Satisfied
1	2	3	4	5

# Other question decisions

- Include open-ended question/s ?
  - May be very informative especially encouraged during pilot testing
  - Will need to decide how these will be analyzed if incorporated into study results – Content/Thematic Analysis

# Questionnaire design as source of bias

- Formatting problem
  - Poor formatting leads to inaccurate responses
  - **Solution:** easy to read and visually appealing: adequate 'white space'

# Which is easier to read and enter data?

7. During the past month, how often have you taken medicine to help you sleep (prescribed or "over the counter")?

Not during the past month \_\_\_\_\_      Less than once a week \_\_\_\_\_      Once or twice a week \_\_\_\_\_      Three or more times a week \_\_\_\_\_

8. During the past month, how often have you had trouble staying awake while driving, eating meals, or engaging in social activity?

Not during the past month \_\_\_\_\_      Less than once a week \_\_\_\_\_      Once or twice a week \_\_\_\_\_      Three or more times a week \_\_\_\_\_

During the past <b>month</b> , how often have you:	Not during the past month	Less than 1 time a week	1 or 2 times a week	3 or more times a week
7. taken medicine to help you sleep (prescribed or "over the counter")?	0	1	2	3
8. had trouble staying awake while driving, eating meals, at social events?	0	1	2	3

# Questionnaire design as source of bias

- **Formatting problem**

- Poor formatting leads to inaccurate responses
- **Solution**: easy to read and visually appealing: adequate 'white space'

- **Questionnaire too long**

- Result: response fatigue and answering randomly or all 'yes' or 'no'
- **Solution**: limit to the data you need to answer study aims

- **Placement and asking sensitive questions**

- Universalize question e.g. "Many women experience domestic violence ..."
- Place at end; general agreement to put sociodemographic questions at the end

# Good questionnaire design principles

- Pretest, pretest, pretest.....
- Ordering of questions:
  - Pretest may help
  - Is there a logical order?
  - Start with easier ones first with more sensitive questions later
  - Group topics together
  - Don't put more important questions last
  - If combination of open- and closed ended, start with close-ended questions

# Questionnaire Administration – source of bias

## Respondents

### Subconscious reactions

- Central tendency bias or 'end aversion'
- Positive satisfaction

### Conscious reaction

- Faking good or bad
- Unacceptability: exposure, disease, etc

### Inaccurate recall

- Primacy or recency i.e. item listed first or last more likely chosen
- Recall: using lists may help
- Proxy respondent

## Researcher

- Interviewer bias
- Non-blinding