

# Statistical aspects of pharmaceutical subsidy

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Pharmaceutical

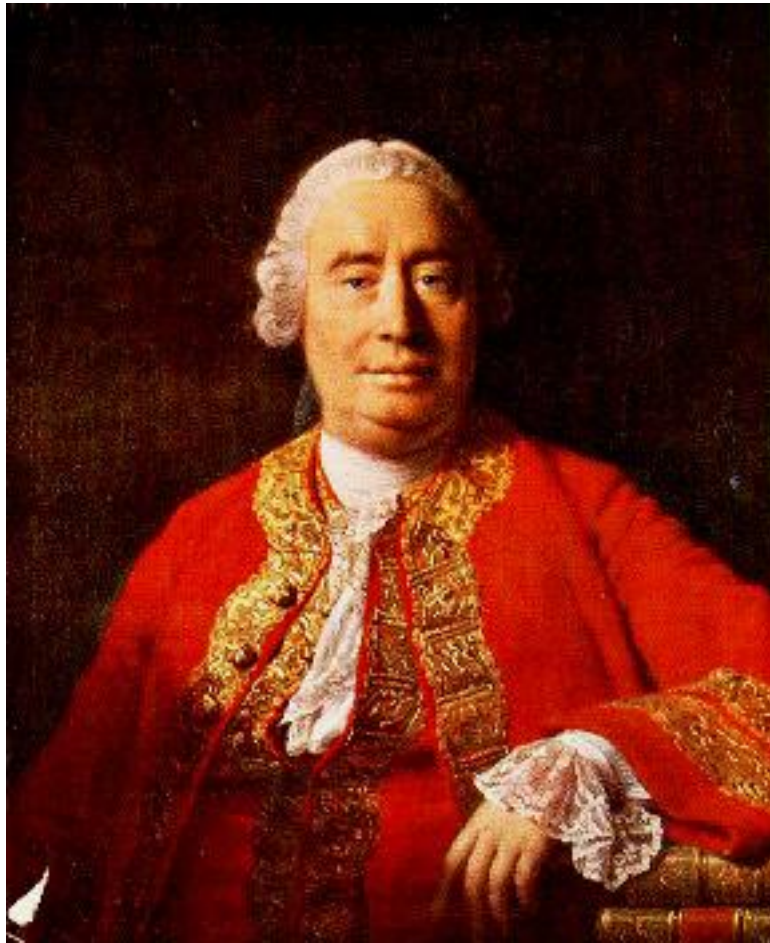
Drug

Biological

Vaccine

- Pharmaceutical subsidy in Australia
- Vignettes
  1. Indirect comparisons
  2. Probabilistic Sensitivity Analysis





“A wise man proportions  
his belief to the evidence”

# 1992

World first: Australia

Changed legislation

Set price for government subsidy of pharmaceuticals

Based on evidence

# Considered successful public policy

- Australia pays lower prices
- Other countries have copied
- How?
  - No-one wanted the sole credit
  - The policy change was a co-production (timing)
    - Academics
    - Bureaucrats

# Assessing evidence for subsidy

## 1. Quality & 2. Relevance

### 1. Quality of the comparison internal to the study

Internal validity

Blinding

Concealment of allocation

Withdrawals (informative censoring)

Often high; RCT for marketing approval

### 2. Relevance

External validity; baseline event rate

– Patients younger; fewer co-morbidities

Other aspects of relevance

– Surrogate & switching

– Time horizon

– Comparator

– Post hoc subgroup vs ITT

– Co-dependent technologies: pharmacogenomic markers becoming more common

# Often (not always) a trade-off

- High quality evidence is often not relevant
- Relevant evidence is often not of high quality

# Guidelines on assessing evidence

- 100 pages on internal validity
  - Was randomisation concealed?
  - Were the patients and investigators blinded?
  - Was intensity of FU the same in both groups?
  - Informative censoring
  - Missing data
  - etc, etc
- One paragraph on external validity
  - Were the patients in the RCT similar to your patients?
- Nothing on other issues for assessing relevance



# Relevance

- Baseline event rate (external validity)
  - Are the patients in the RCTs similar to patients who will receive the new pharmaceutical should it be subsidised?
- Comparator
  - Indirect comparison
- Outcome
  - Surrogate/switching
- Time horizon
  - Extrapolation of comparative treatment effect from the RCT to the time horizon relevant for subsidy
- Intention to treat population versus post-hoc subgroup
- Co-dependent diagnostic test
  - Pharmacogenomic markers
  - Prevalence
  - sensitivity/specificity

# Process of pharmaceutical subsidy in Australia

## 1. Marketing approval

TGA (FDA, EMA)

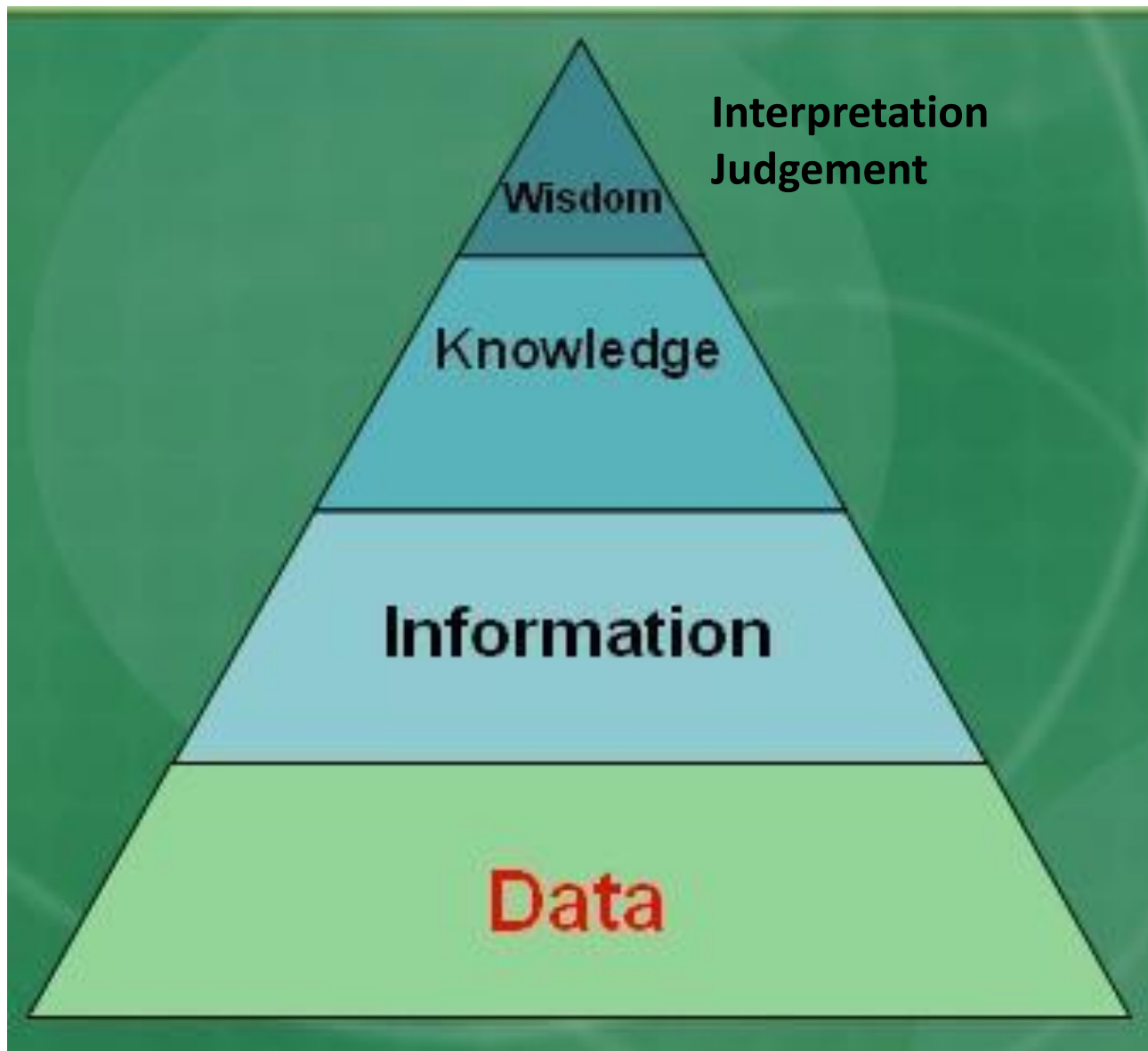
- Quality (of manufacture)
- Efficacy
- Safety

## 2. Apply for subsidy through the

Pharmaceutical Benefits Scheme (PBS)

# Applications to PBS

- Sponsor (pharmaceutical company)
  - Submission (200-1000 pages)
- 1 of 5 evaluation groups at universities
- Technical subcommittee (peer review)
- Pharmaceutical benefits advisory committee (PBAC)
  - 16 clinicians; health economist; pharmacist



PBAC

Sub-committee  
review

University  
evaluation

Sponsor's  
submission

# Legislation (1992)

PBAC should consider

- Comparative clinical effectiveness
- Comparative cost

Comparator:

Treatment most likely to be replaced should the new pharmaceutical be listed for subsidy

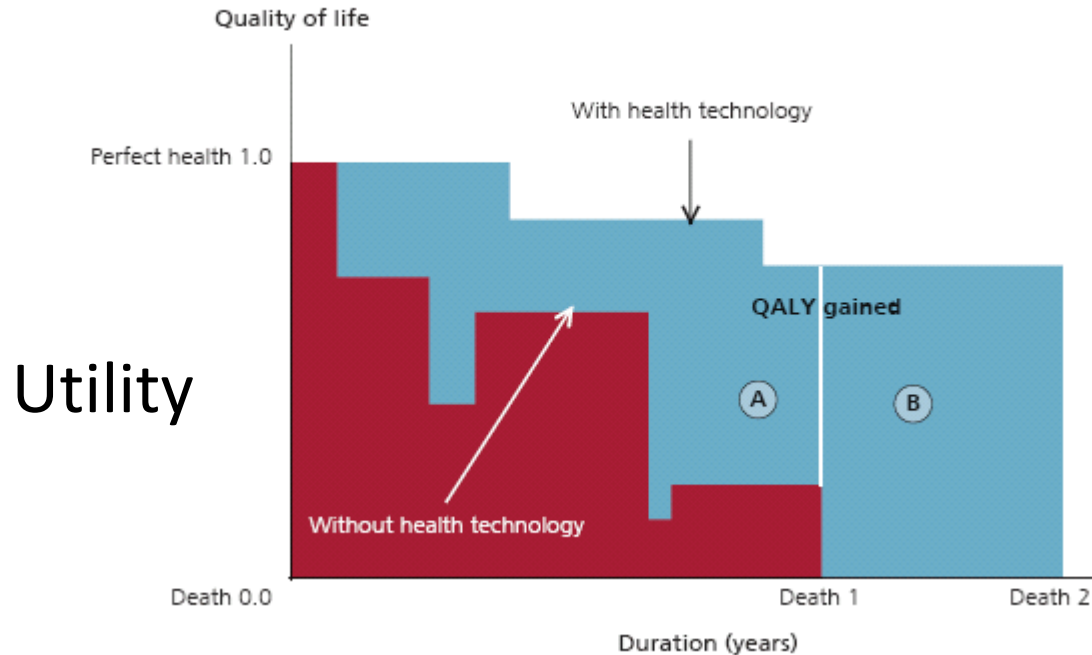
# Health economic analyses

- Cost minimisation
  - Claim: Same health gain as comparator
  - Non-inferiority
    - Same cost (higher price if cost offsets)
    - Often in the same pharmacological class; me-toos
    - not always cost neutral; can expand market
- Cost utility analysis
  - Claim: greater health gain than comparator
  - Superiority
    - Incremental cost effectiveness ratio (ICER)
    - $ICER = \text{Cost} / \text{QALY}$

# QALY

## Quality adjusted life year

Figure. Diagram of the concept of QALY (quality-adjusted life years)



QALY is life-years-saved weighted by utilities

**Utility:**

**0: dead**

**1: perfect health**

# Advantage of QALY

Common metric across all health care technology

In theory, can compare cancer pharmaceuticals to those for:

heart disease

multiple sclerosis

depression

prevention (vaccines)

pain relief

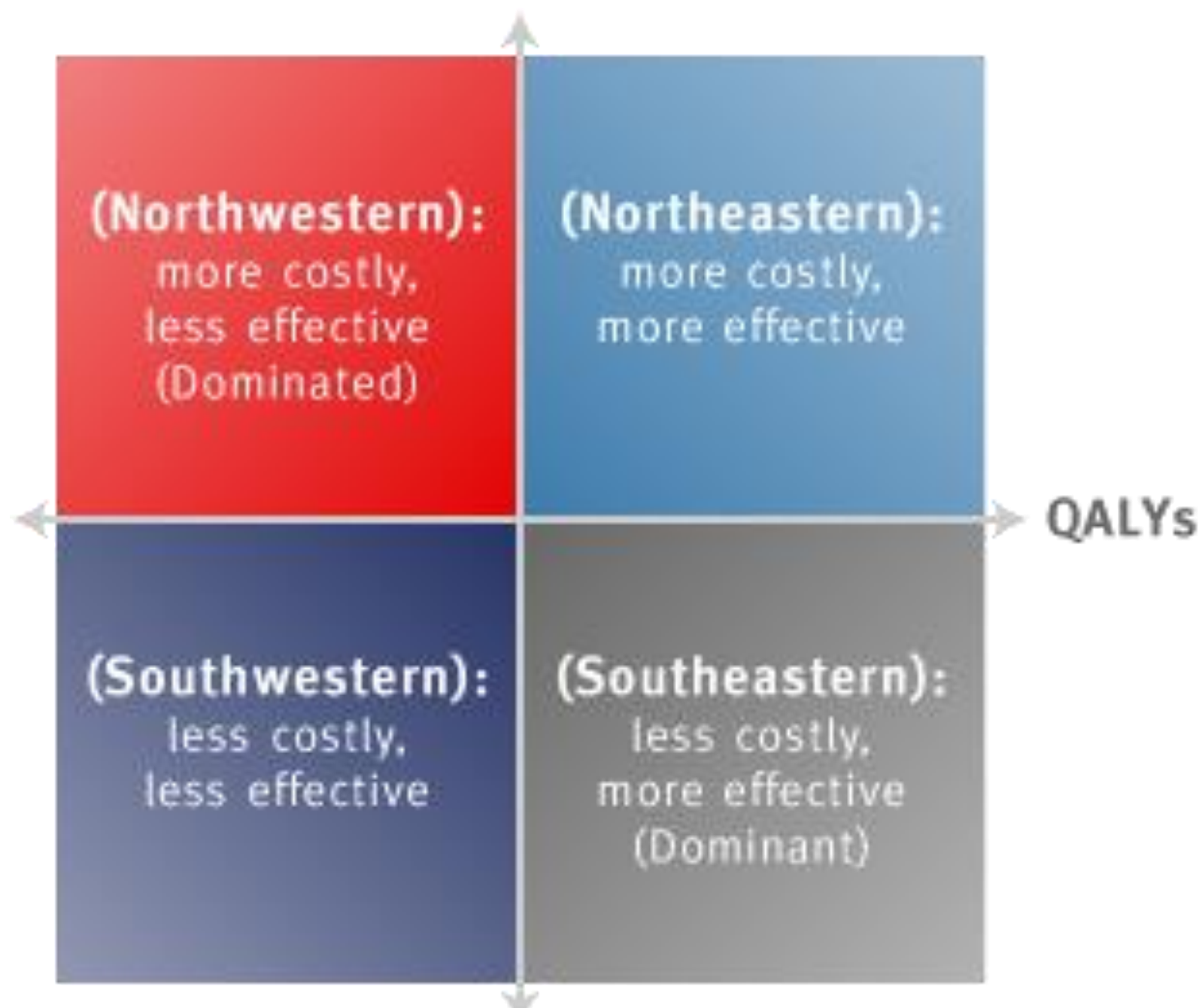
etc, etc



# Difficulties with QALYs

- Calculating/agreeing utility values
- For some pharmaceuticals the outcome in RCT is:
  - Headache-free day
  - Relief from constipation
  - Avoidance of diarrhoeal illness
- Easier for cancer or heart-disease, say
  - Outcome: life years saved or related measure

Cost



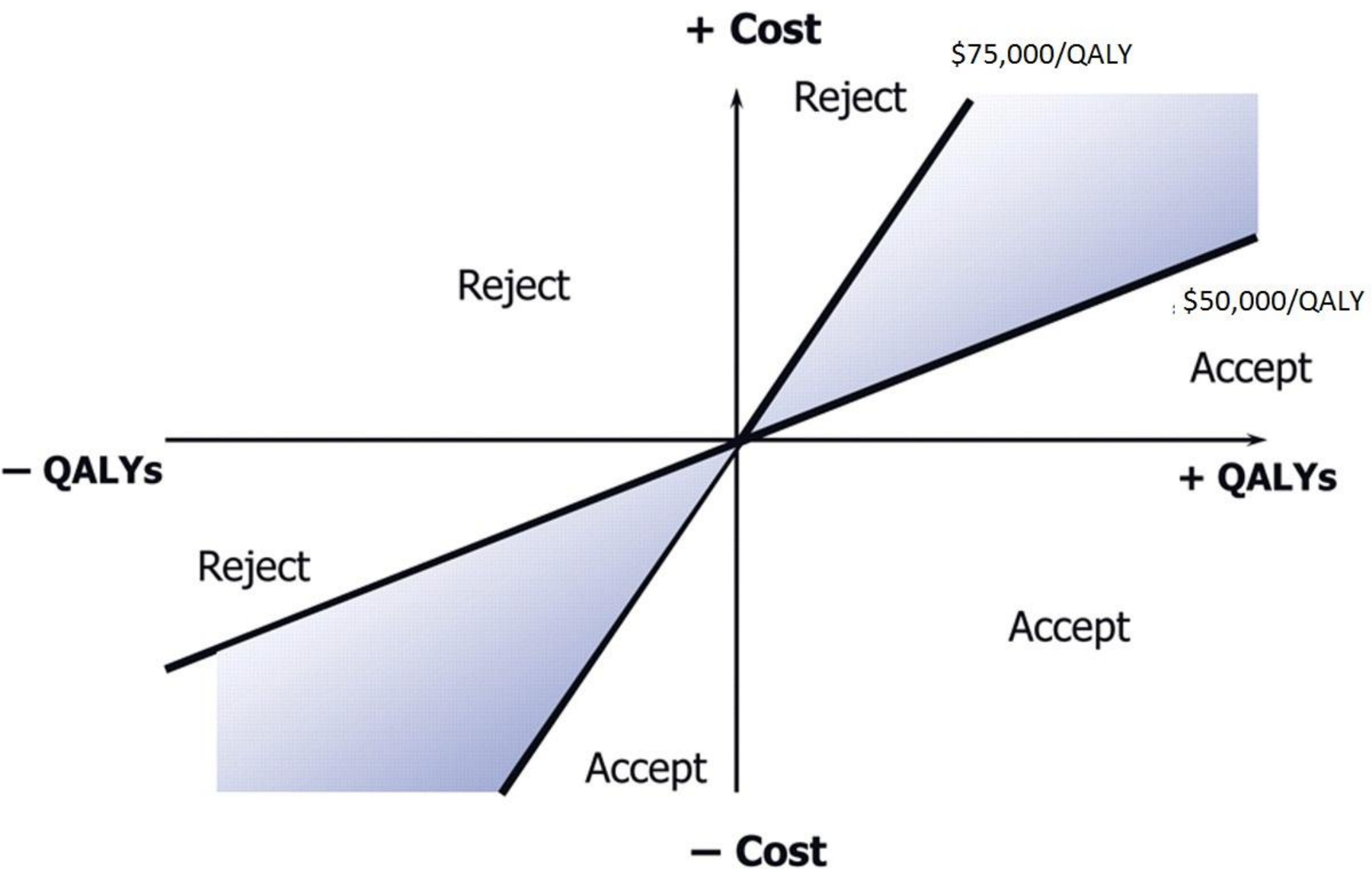
**(Northwestern):**  
more costly,  
less effective  
(Dominated)

**(Northeastern):**  
more costly,  
more effective

**(Southwestern):**  
less costly,  
less effective

**(Southeastern):**  
less costly,  
more effective  
(Dominant)

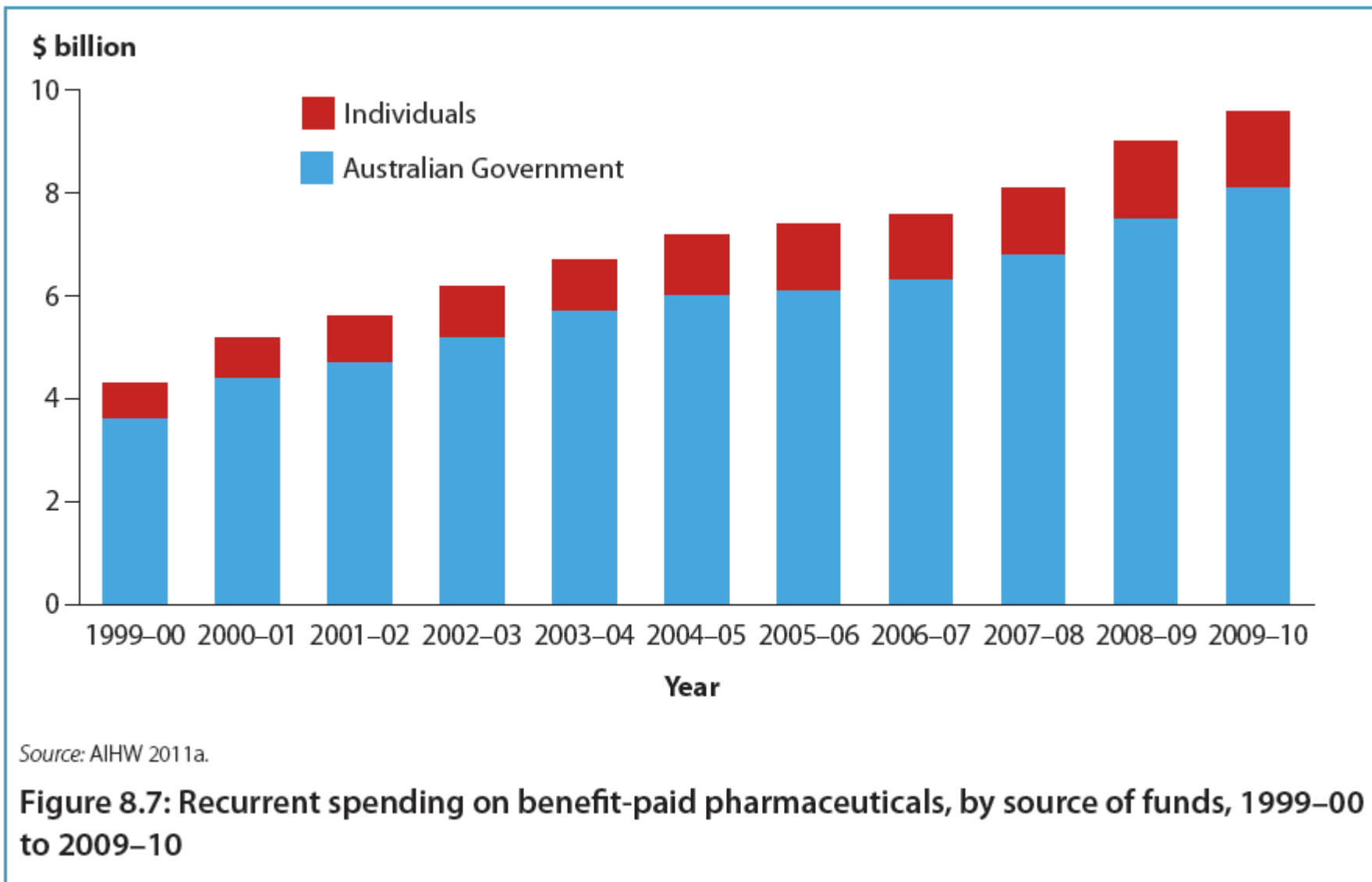
QALYs



# How do pharmaceutical companies arrive at a price?

- R&D
  - High risk venture
  - Cervical cancer vaccine: \$3B
- Innovation
  - Patent
- High clinical need
  - Early HIV drugs
- Manufacturing costs





Total health expenditure: \$122B ~9% GDP

# Vignette 1

Indirect comparisons

# Why do we need indirect comparisons?

Comparator used in RCT might not be the relevant comparator for Australia

# An incorrect approach

Pool results from the active treatment arms

A versus C

Take single arm A

B versus C

Take single arm B

Compare the event rate in A with  
event rate for B

***Naive*** indirect comparison

Loose the benefits of randomisation



# The Results of Direct and Indirect Treatment Comparisons in Meta-Analysis of Randomized Controlled Trials

Heiner C. Bucher,\* Gordon H. Guyatt, Lauren E. Griffith, and Stephen D. Walter

DEPARTMENT OF CLINICAL EPIDEMIOLOGY AND BIostatISTICS,  
McMASTER UNIVERSITY, HAMILTON, ONTARIO,  
CANADA, L8N 3Z5

J Clin Epidemiol, 1997

***Naive*** indirect comparison: prone to bias

Direct head-to-head comparisons: whenever possible

Proposed ***adjusted*** indirect comparison

But still limited strength of inference

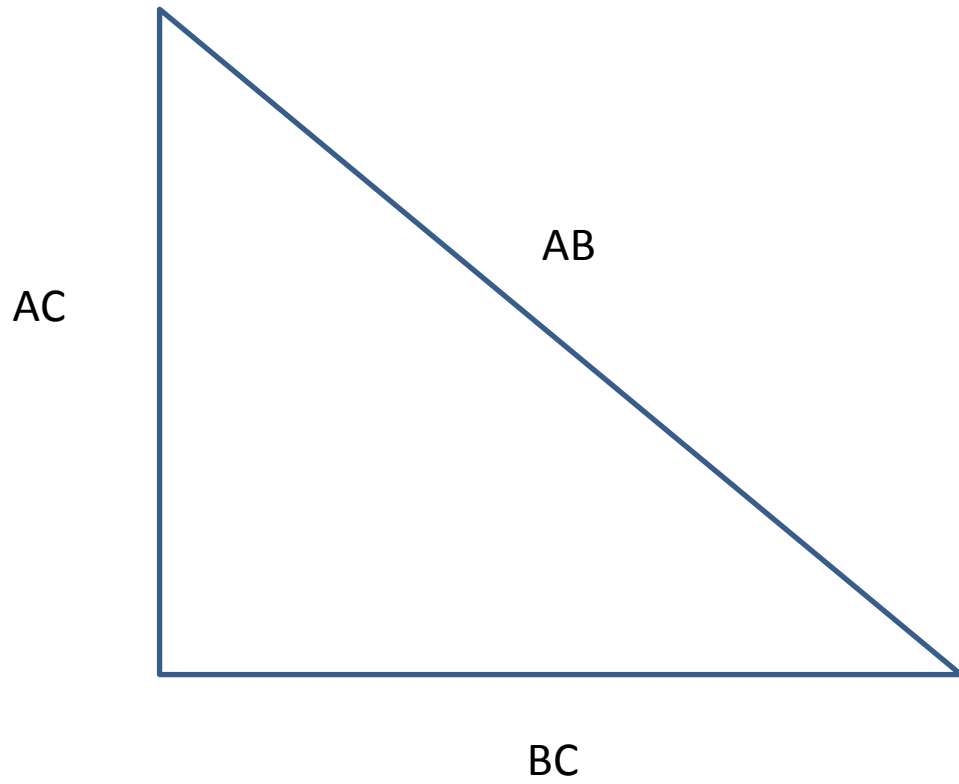
Exchangeability problem

# Appendix

$$\ln(OR_{ind}) = \ln(OR_{AB}) - \ln(OR_{CB}). \quad (4)$$

Because  $OR_{AB}$  and  $OR_{CB}$  are estimated from different studies, they are statistically independent, and hence the variance of  $OR_{ind}$  can be obtained from

$$\text{Var}(\ln OR_{ind}) = \text{Var}(\ln OR_{AB}) + \text{Var}(\ln OR_{CB}) \quad (5)$$

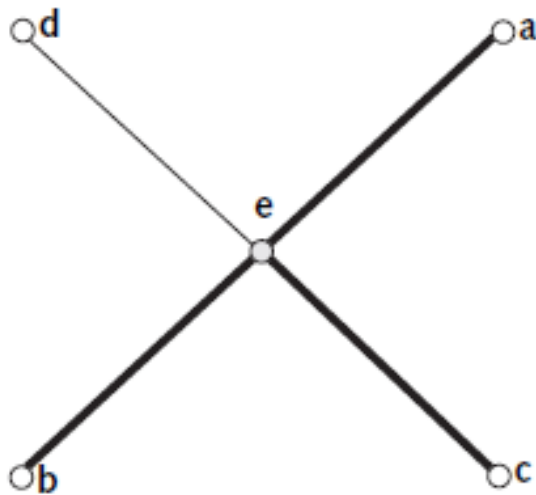


# Extensions

## Network meta-analysis

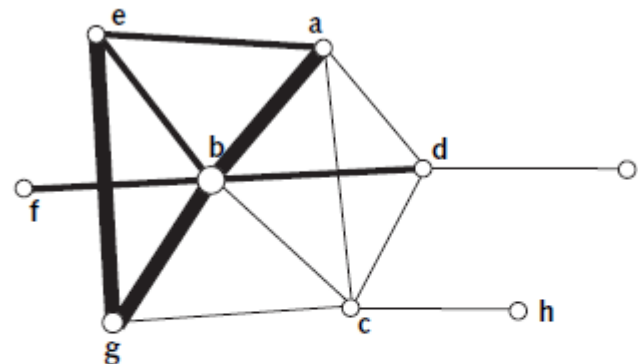
### WinBugs

Biologic treatments for rheumatoid arthritis



a: adalimumab, b: infliximab,  
c: etanercept, d: anakinra, e: placebo

Chemotherapy regimens for ovarian cancer



a: platinum monotherapy, b: platinum-based combination,  
c: taxane monotherapy, d: platinum + taxane-based combination,  
e: nonplatinum/nontaxane monotherapy,  
f: platinum-based combination (ip), g: nonplatinum/nontaxane  
combination, h: taxane-based combination,  
i: platinum/taxane-based combination (ip)

STATISTICS IN MEDICINE

*Statist. Med.* 2004; **23**:3105–3124 (DOI: 10.1002/sim.1875)

## **Mixed treatment comparison**

Combination of direct and indirect evidence in mixed  
treatment comparisons

**BMI** Simultaneous comparison of multiple  
treatments: combining direct and indirect  
evidence

# **NATIONAL INSTITUTE FOR HEALTH AND CLINICAL EXCELLENCE**

**Report to the Methods Review Working Party**

**Key issues arising from workshop on evidence  
synthesis (indirect and mixed treatment  
comparisons)**



## RESEARCH

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### **Inconsistency between direct and indirect comparisons of competing interventions: meta-epidemiological study**

2011: “The inconsistency between indirect and direct comparisons might be more prevalent than previously observed.”

# Apples and oranges problem

## Assumption of exchangeability

### Synonyms

- Similarity
- Lack of heterogeneity
- Lack of treatment-effect modification

More problematic than “heterogeneity”  
in a H2H systematic review



# Potential reasons for lack of exchangeability

## Patient characteristics

- Co-existing disease
- Concomitant treatments
- Severity of index condition

## Methods

- Length of FU
- Withdrawals
- Measurement of outcome

## Treatment

- Common comparison treatment can be different

Most RCTs assess add-ons

Besides the problem of exchangeability, indirect comparisons are subject to ***statistical imprecision***

Not like a H2H meta-analysis where precision increases

- Need 4X as many patients in an indirect as in a direct H2H RCT to get CI of same width

### ***Some examples***

Cost-minimisation [non-inferiority]

OR=0.97; 95% CI (0.75, 1.68)

Cannot meet any sensible non-inferiority margin

Cost-utility [superiority]

OR=0.73 (0.49, 1.23)

Hard to interpret

# How does PBAC assess indirect comparisons?

(15% of submissions)

- Rarely assumption of exchangeability holds
- Looks at the number crunching as supplementary information

# Summary

## Vignette 1. Indirect comparisons

- Unhelpful over-enthusiasm  
“bloated optimism”
- Took 15 years to get back to the conclusions/advice in the Bucher/Guyatt/Walter paper
- Number crunching ok, given the assumptions  
But, assumption of exchangeability rarely holds



# Vignette 2

## Probability Sensitivity Analysis (PSA)

# Cost utility model is a forecast

Economic model is typically run until all patients have died

- Cancer
  - RCT: md FU ~12-18 months
  - Economic model ~ 5-10 years
- Statins for secondary prevention heart disease
  - RCT: md FU ~ 5 years
  - Economic model ~ 30 years
- Depression
  - RCT: FU 12 weeks
  - Economic model ~ 30 years

To proceed, might have to make guesses about

- Comparative treatment effect for time frame beyond the RCT
- Calculation of baseline risk for population for subsidy
- Translation of surrogate to life years gained then QALYs
- Effect of subsidy on use other treatments

Also could be uncertainty about

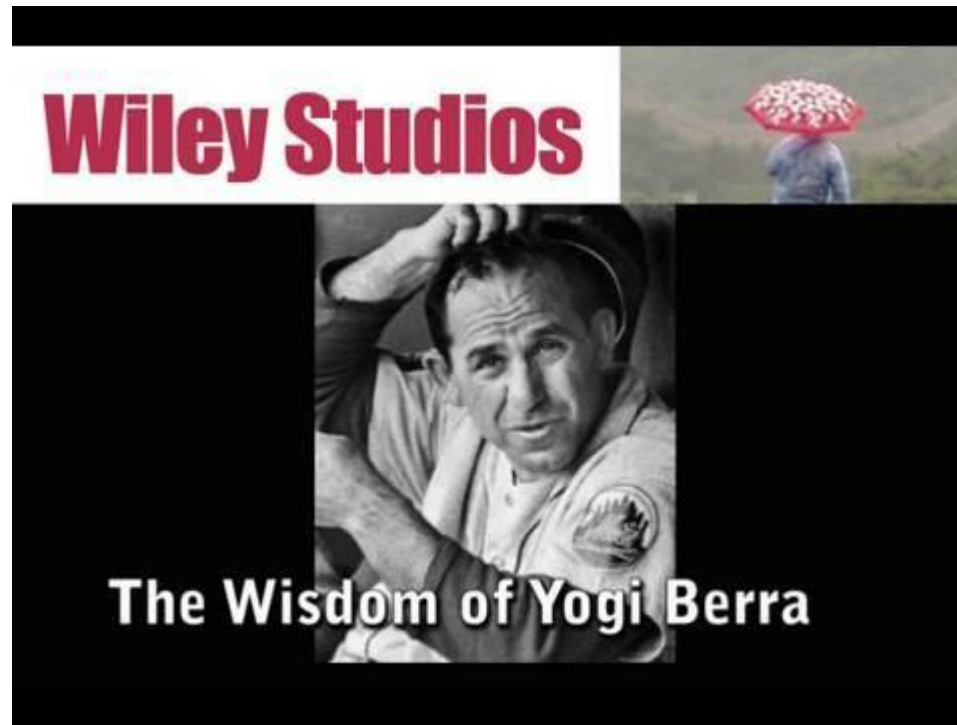
- Size of the comparative treatment effect  
(post-hoc subgroup)
- Utilities
- Costs/cost offsets



Even if cost data is collected as part of the RCT  
“trial-based economic evaluation”

Still need modelling to:

- Extrapolate the time horizon
- Translate baseline risk to population for subsidy
- Evaluate co-dependent technologies
- Assess the effect of subsidy on use of other treatments



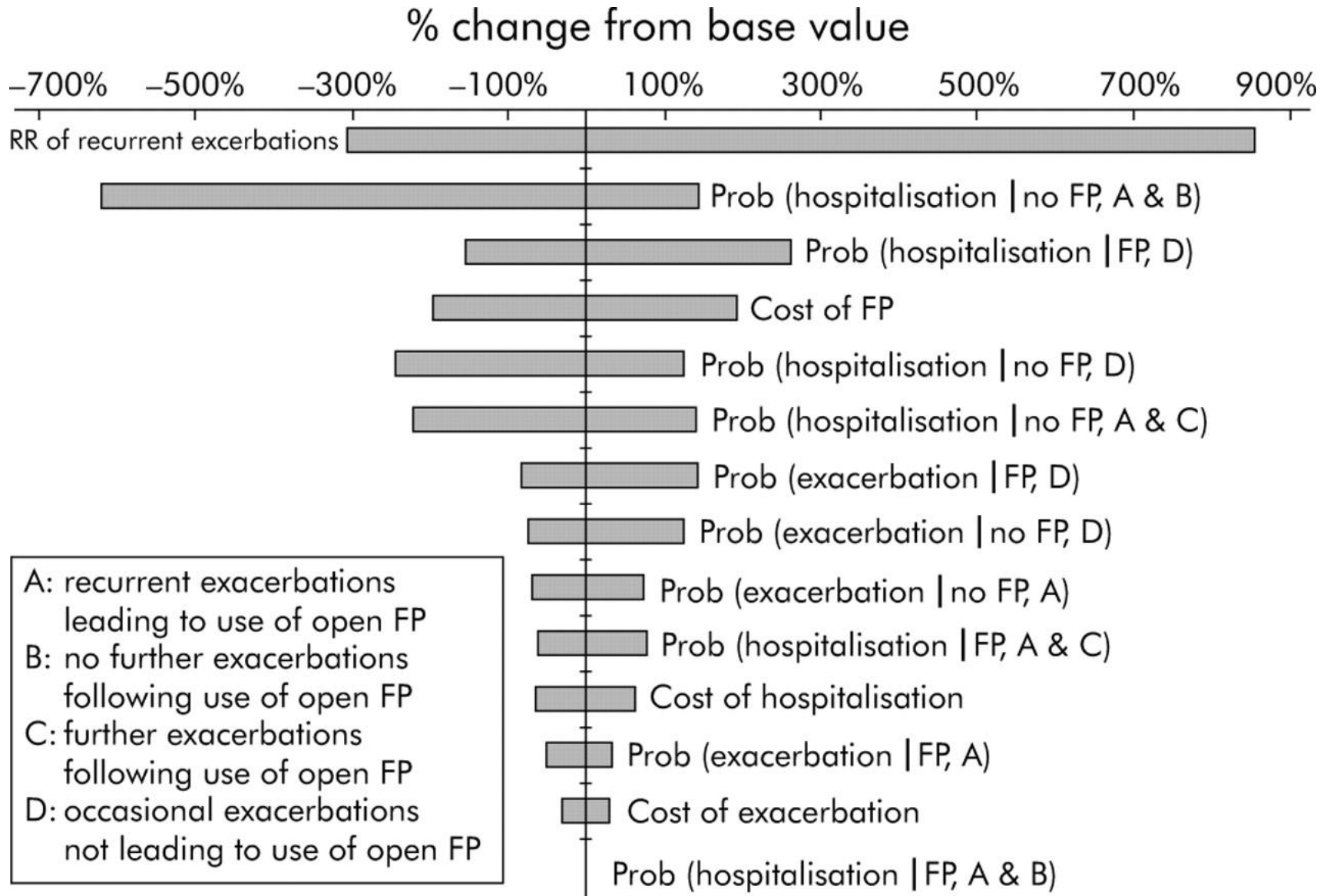
It's like deja vu all over again

You should always go to other people's funerals,  
otherwise they won't come to yours

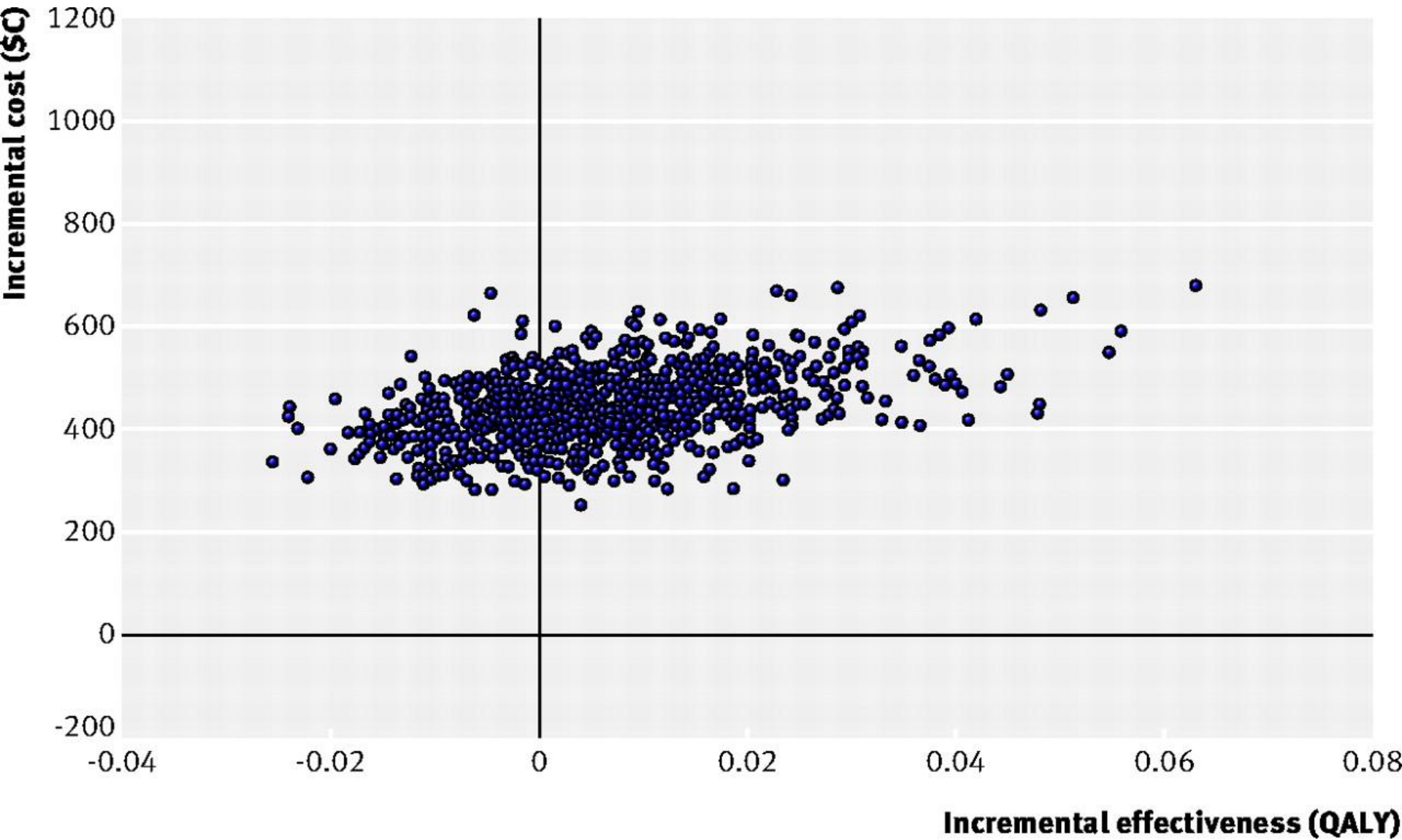
It's hard to make predictions, especially about the  
future

# One-way sensitivity analysis

## Tornado diagram



# Probability sensitivity analysis



# Mechanics of PSA Bayesian

- Set up priors for the parameters in the model
- Set up the structure of the model
- Run it through WinBugs [or similar]

# PBAC prefers one-way sensitivity analysis over PSA

- PSA: often shows huge range for ICERs
  - Just confirms it's hard to predict the future
- Some uncertainty can be quantified
  - Utilities
  - Costs
- Some uncertainty might not be able to be quantified
  - Comparative treatment effect beyond RCT
  - Changes to the treatment algorithm
  - Treatment effect for patients not included in RCT

- PSA advocates
  - Ask experts about appropriate prior
- PBAC
  - Expert committee of 16 clinicians (content experts)
  - Paid to make expert judgements
  - What's the point of getting other experts to put priors on known unknowns?

Then there are the unknown unknowns

# Summary

## Vignette 2

- In an environment where evidence is often contested
  - Bayesian framework is not helpful
- Complex models to capture reality, but
  - No data to populate the model
- One-way sensitivity analyses
  - Simplistic
  - Arguably more useful for decision-making (judgement)



# Why statisticians should become more involved in cost-utility modelling

- Statistics is partially about quantifying uncertainty
- Is it worth building a realistically complex model if
  - There is no data to populate it ?
  - Decision-makers won't use it?

Deliberately (skilfully) simplified models

- Co-dependent technologies
  - Synthesise data on clinical effectiveness & diagnostic accuracy
- Extrapolation of treatment effect