



# Unlocking a national adult cardiac surgery audit registry with

The R User Conference 2013  
University of Castilla-La Mancha, Albacete, Spain

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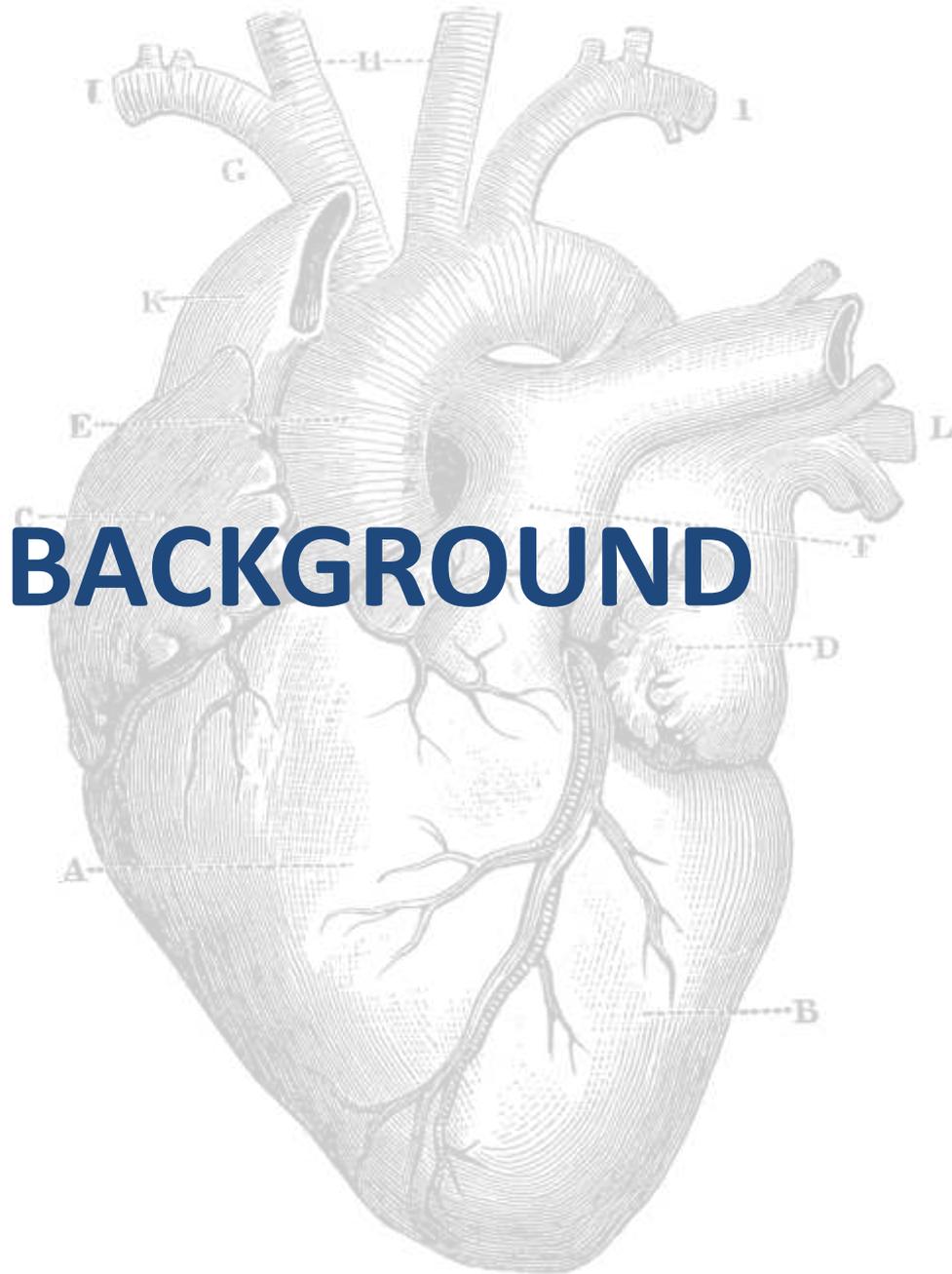
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<sup>2</sup>University Hospital of South Manchester

<sup>3</sup>National Institute of Cardiovascular Outcomes Research, UCL



Fig. 37.



# BACKGROUND

# Bristol Inquiry

**The Telegraph**

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## Bristol heart scandal

The Bristol heart scandal in which 35 babies died and dozens more were left brain damaged sparked a sea-change in the way mortality rates in hospitals are monitored, especially in cardiac care.



Sir Ian Kennedy at the inquiry in 2001. Photo: PAUL GUNOVER

By Rebecca Smith, Medical Editor  
7:00AM BST 29 Jul 2010

Comment

Concerns about the high mortality rate of babies undergoing heart surgery at the Bristol Royal Infirmary eventually led to the biggest public inquiry ever undertaken into the workings of the NHS.

Sir Ian Kennedy who chaired the inquiry collected 900,000 pieces of evidence and operations spanning a ten year period were examined.

Between 30 and 35 babies died between 1990 and 1995, the inquiry found, while over the whole decade up to 170 might have been saved if they had been operated on elsewhere.

Contributory factors that led to the failings included:

1. Inadequate collection of data
2. Inadequate monitoring of data

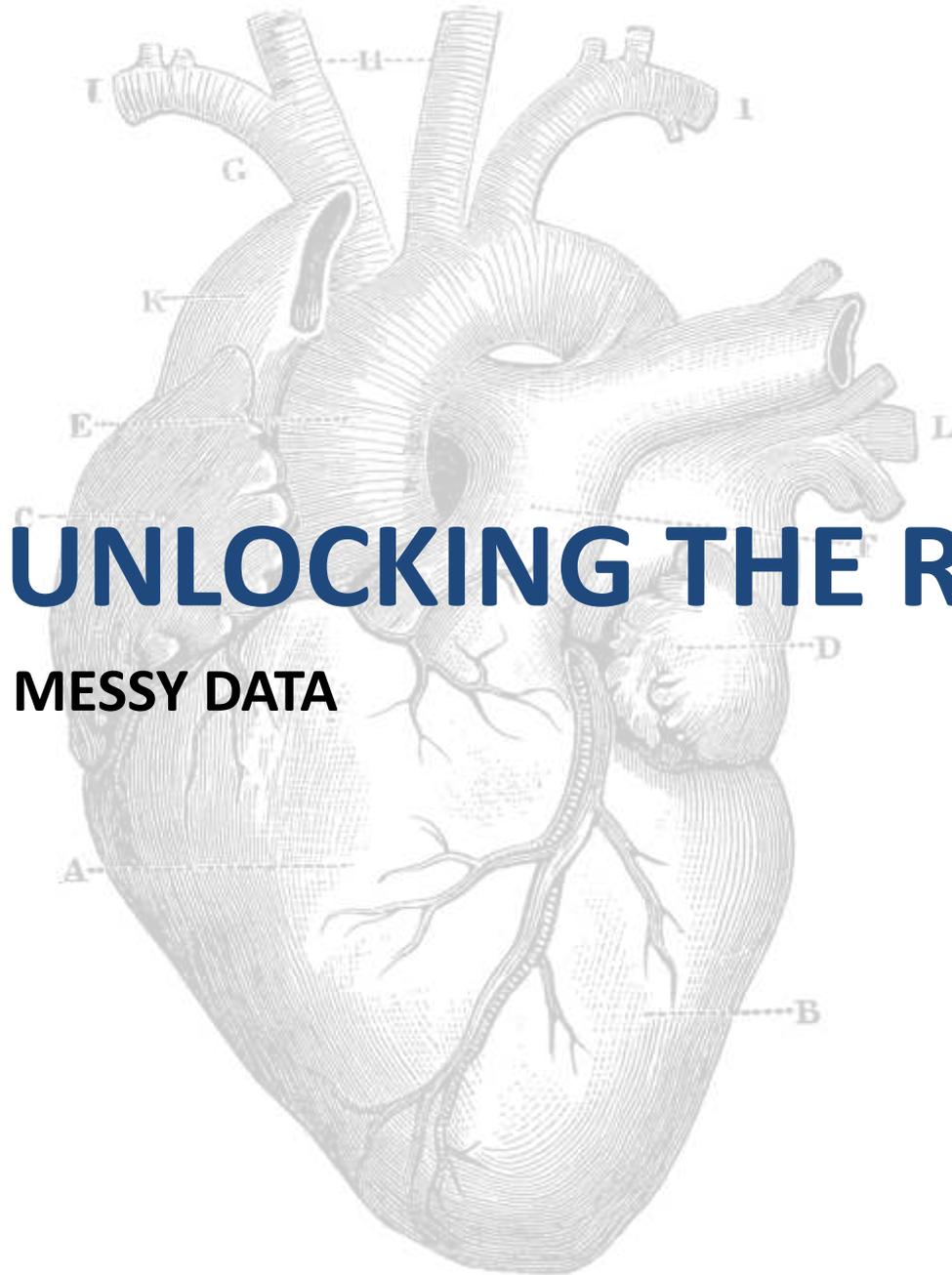
# National Adult Cardiac Surgery Audit registry

- Up to 166 clinical variables collected on each patient: administrative, demographics, comorbidities, operative factors, outcomes
- 15 years of data
- 465,000 records
- 44 hospitals + >400 consultant surgeons

# Flow of data



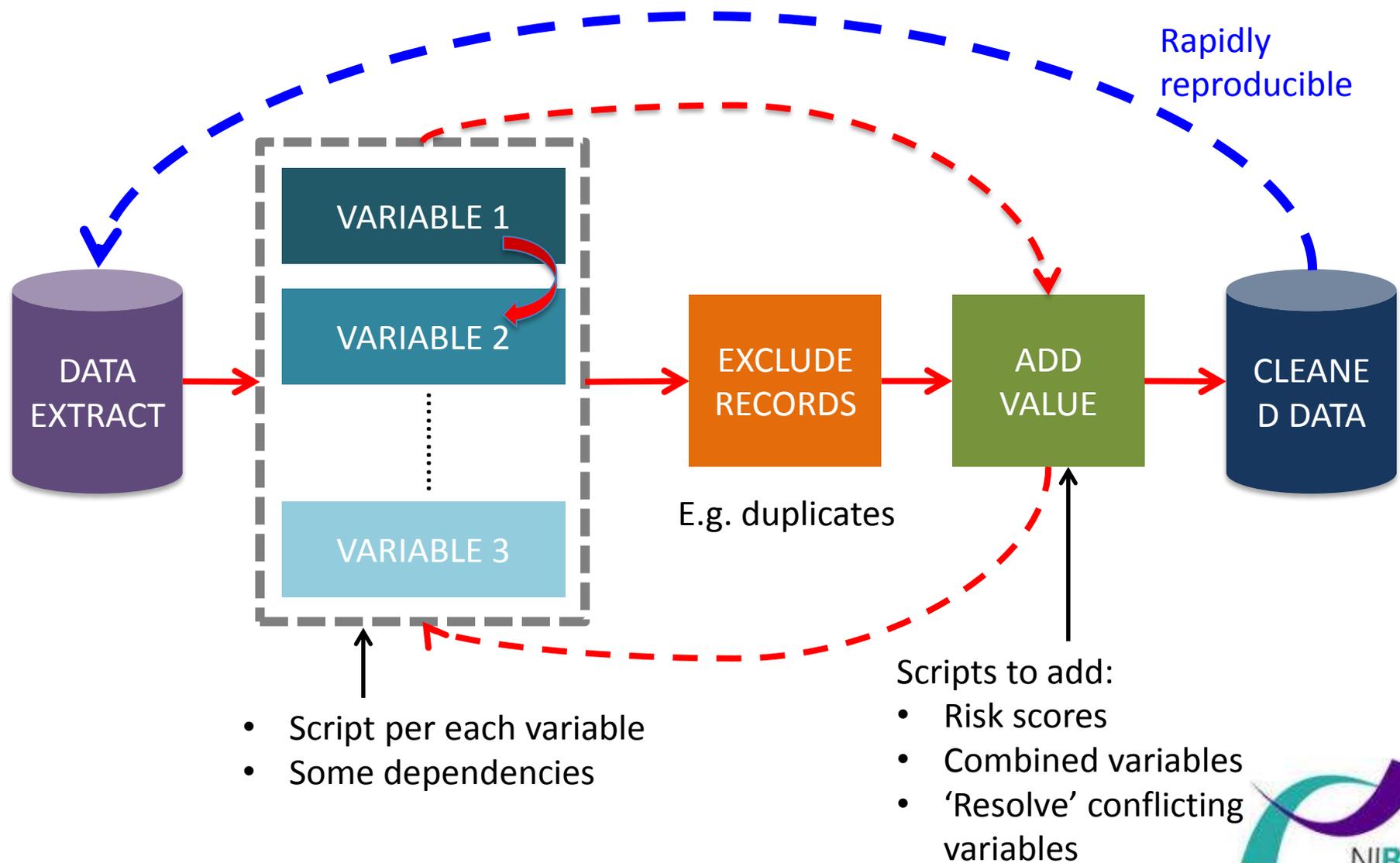
Fig. 37.



# UNLOCKING THE REGISTRY

MESSY DATA

# Cleaning the registry in



> with(SCTS, table(X4.04.Discharge.Destination, X4.05.Status.at.Discharge))

X4.04.Discharge.Destination

X4.05.Status.at.Discharge

0. Alive 1. Dead

```

. Another dept within the trust
0
0. Not applicable - patient deceased
1 Home
1. Home
2 Convalescence
2. Convalescence
2. Convalescence (Non acute Hospital)
3 Other hospital
3 Other Hospital
3 Other Hospital - wd 6
3 Other Hospital wd 2
3 Other ward
3. Other Acute hospital
3. Other hospital
4 Patient deceased
4. Not applicable - patient deceased
4. Patient Deceased
5
5. Transferred to different Consultant - NGH
7
8
9
Second op

```

	0. Alive	1. Dead
828	48296	2453
0	57	0
1	1	0
0	0	1
0	4104	0
674	370763	374
0	63	0
8	7347	4
2	2164	0
0	1	0
0	151	0
0	1	0
0	1	0
0	1	0
1	7680	1
115	22935	37
0	0	173
51	412	13286
0	0	19
0	7	0
0	42	0
0	2	0
0	38	4
114	3820	518
0	2	6

Conflicts

Transcriptional discrepancies

Illegal options

Missing data



# Cleaning the registry in

- Errors are **difficult to find** and not all can be resolved
- Excluding all imperfect data not an option
- Balance between a ‘research ready’ dataset and robust audit capability
- Needs to be **reproducible**
- It is **locked** to clinicians & researchers without being cleaned

**Warning:** cleaning clinical registries without experts is dangerous\*



+

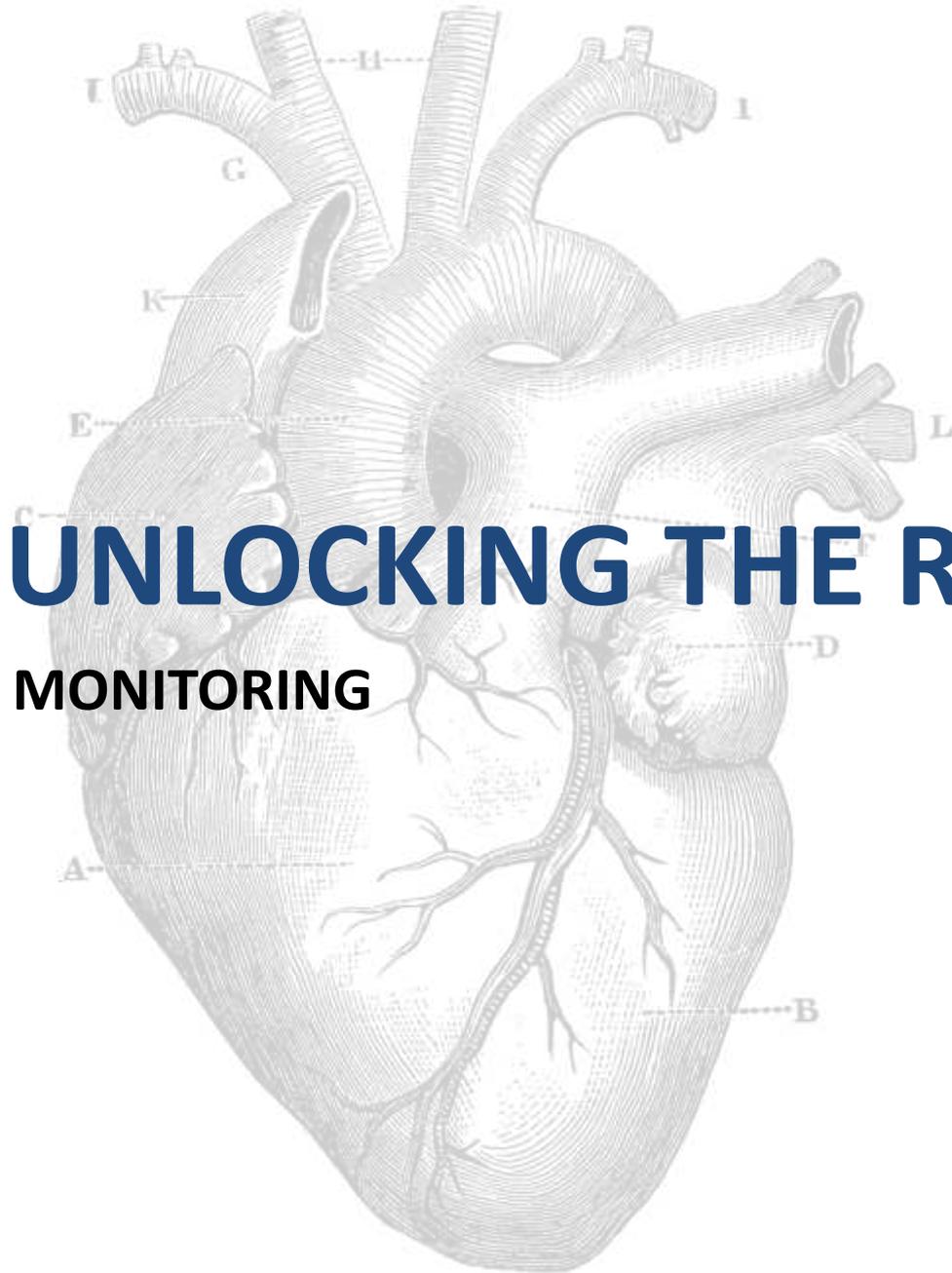


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\* Applies to analysing healthcare data also

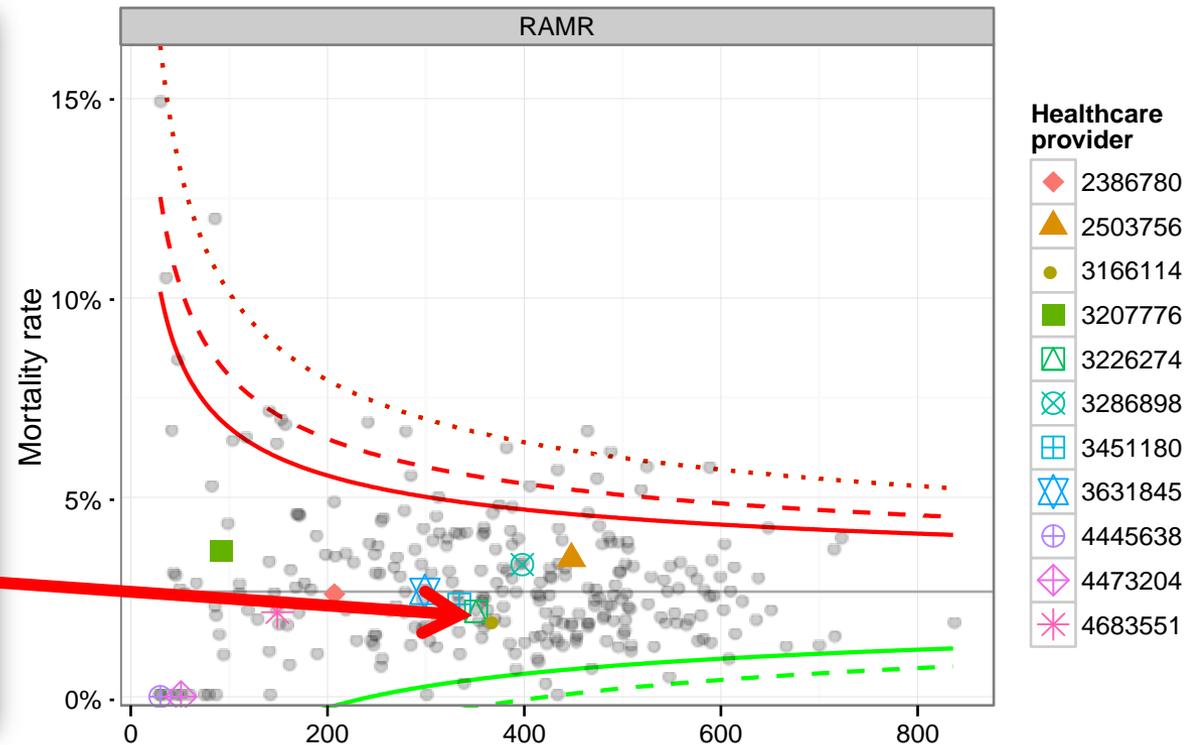
Fig. 37.



# UNLOCKING THE REGISTRY

## MONITORING

# Publication of named healthcare provider outcomes



<http://www.scts.org/patients/>

# Publication of named healthcare provider outcomes

## FILTER DATA

```
subset
```

## RISK ADJUSTMENT

```
glm, glmer {lme4}, mfp  
{mfp}, predict, auc {pROC},
```

## CLASSIFICATION & PRESENTATION

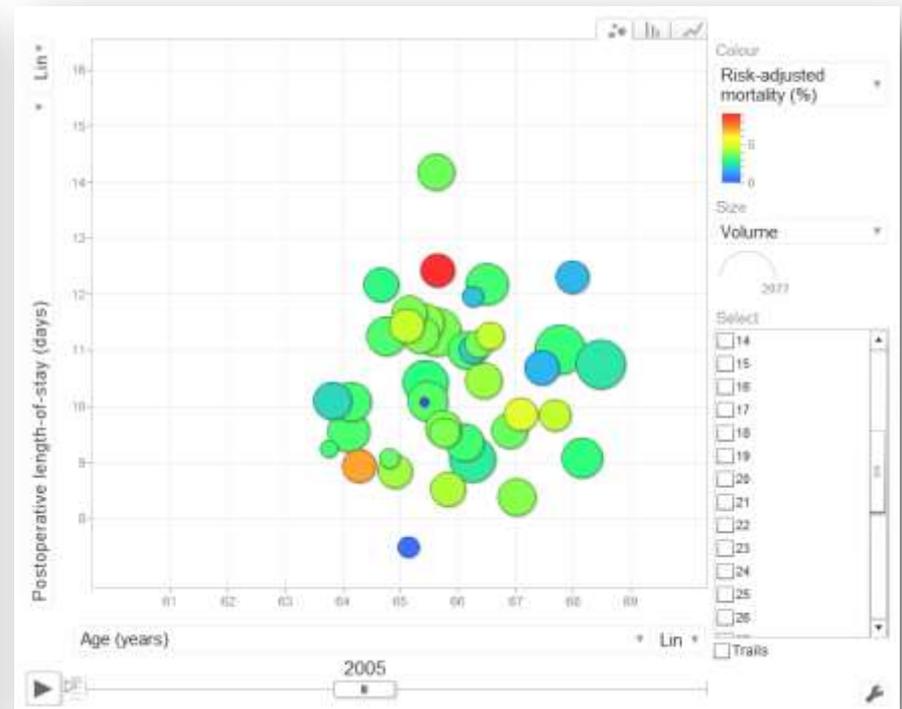
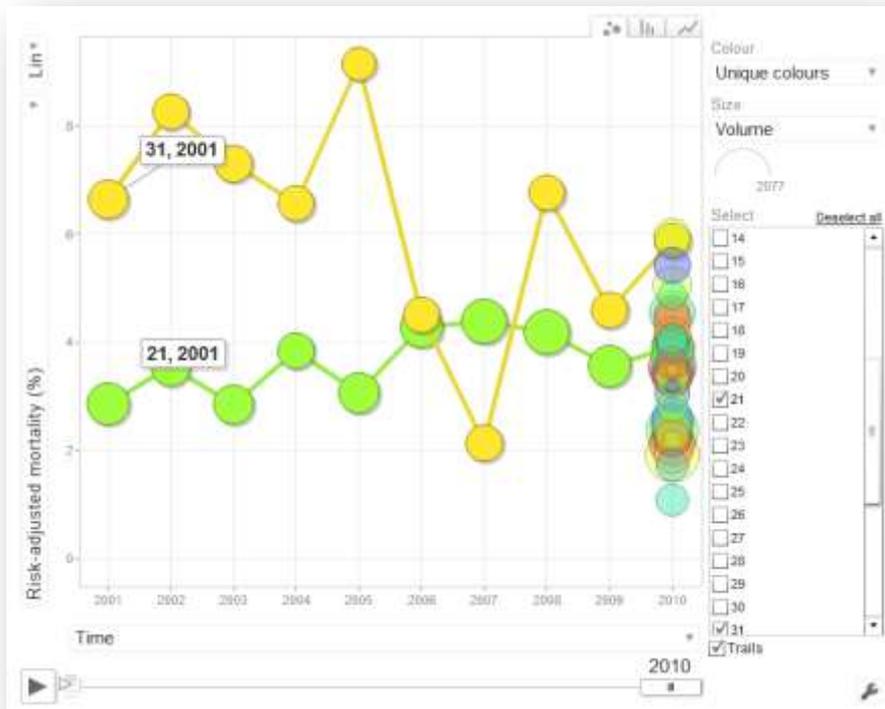
```
ggplot {ggplot2}, write.csv
```

## AGGREGATION

```
summaryBy {doBy}, merge,  
arrange {plyr}
```

# Exploratory analyses

```
summaryBy {doBy} + gvisMotionChart {googleVis}
```



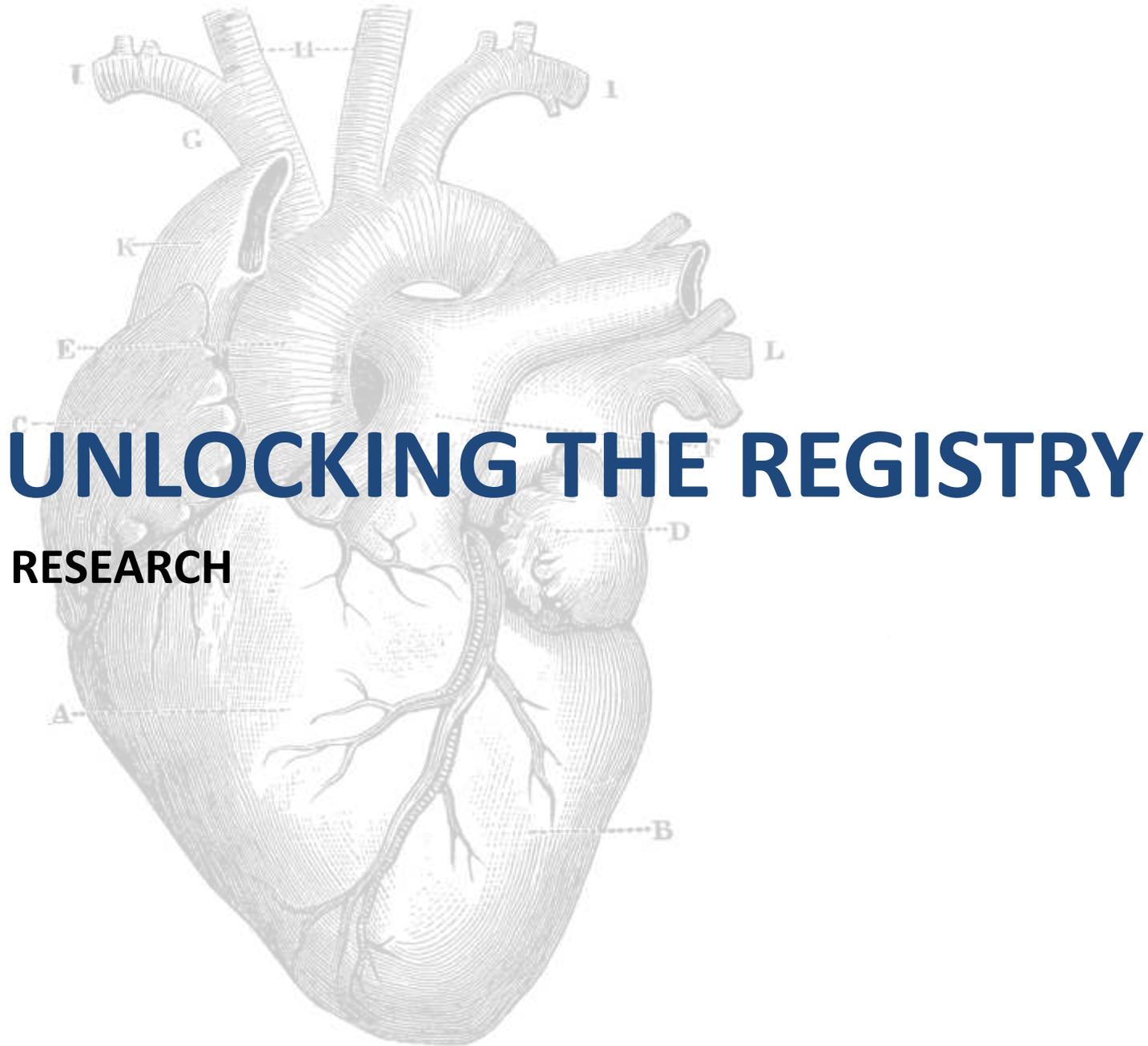
<http://www.scts.org/DynamicCharts/>

# Monitoring medical devices

- Currently does not happen in UK
- Data: **200** valve types entered **13,000** ways (free text)
- But R is good with **regular expressions**

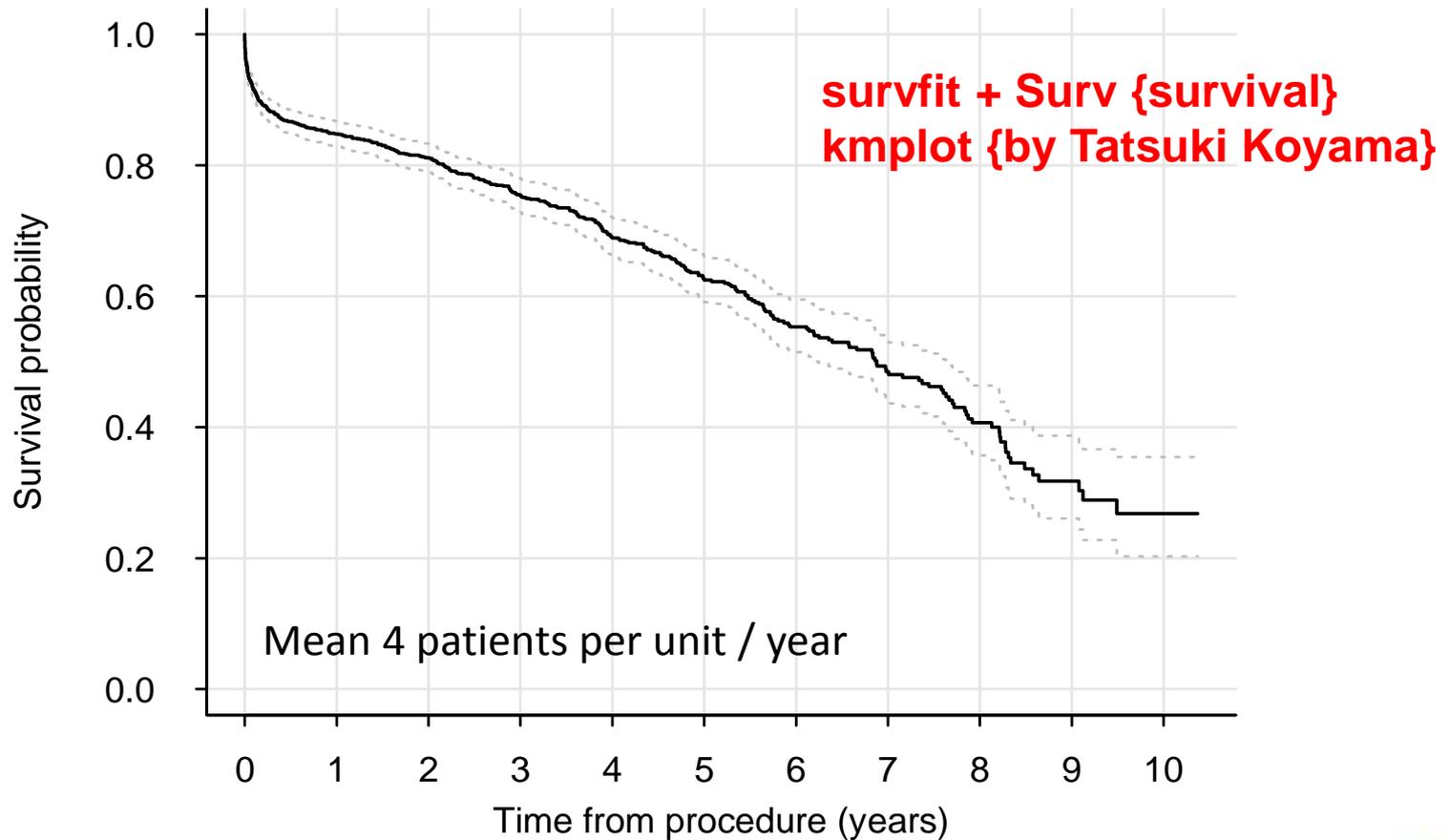


Fig. 37.



# Evidence based medicine

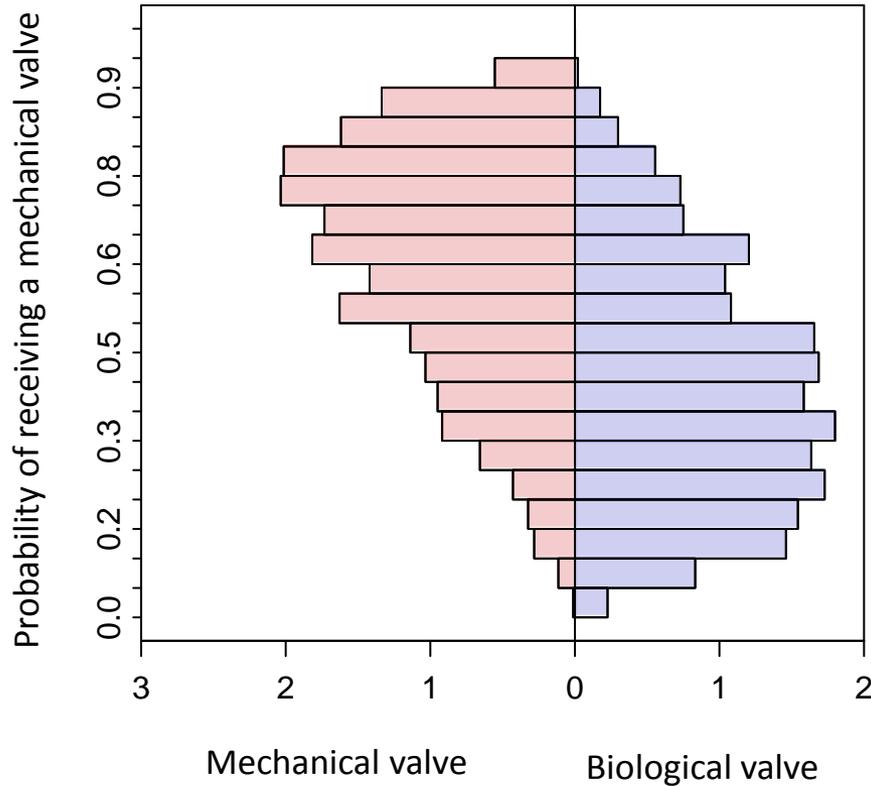
Octogenarians having Mitral Valve Surgery ± CABG ± TV repair  
over 10-year window



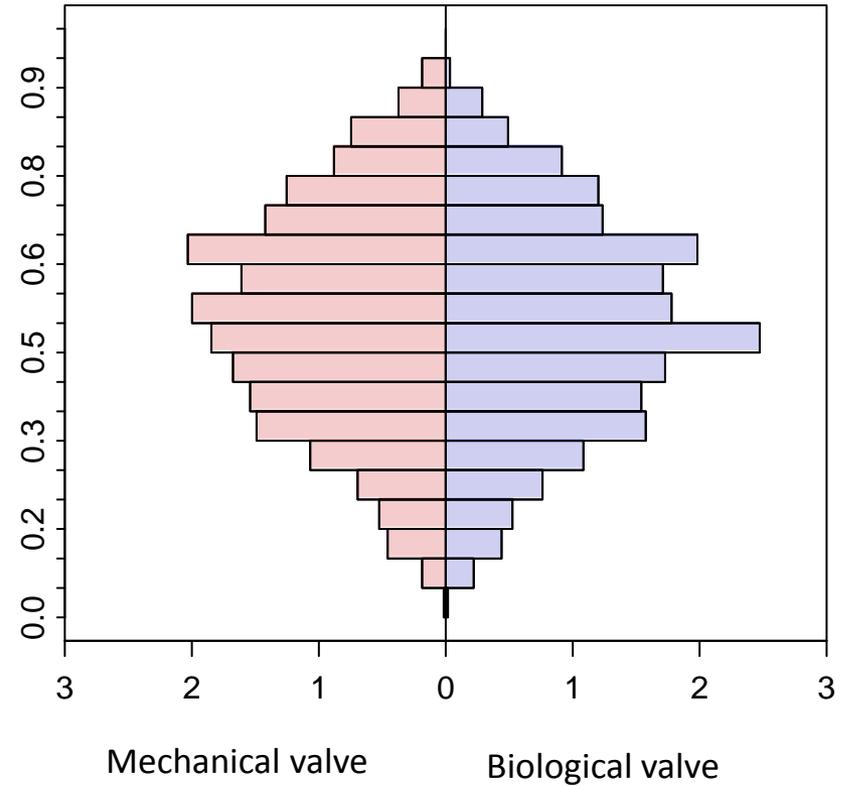
No. at risk      1415   991   779   559   398   276   180   114   64   23   6

# Contemporary statistical methodology for retrospective data

Unmatched



Matched



**matchit {MatchIt}**

# Risk prediction: *status quo*

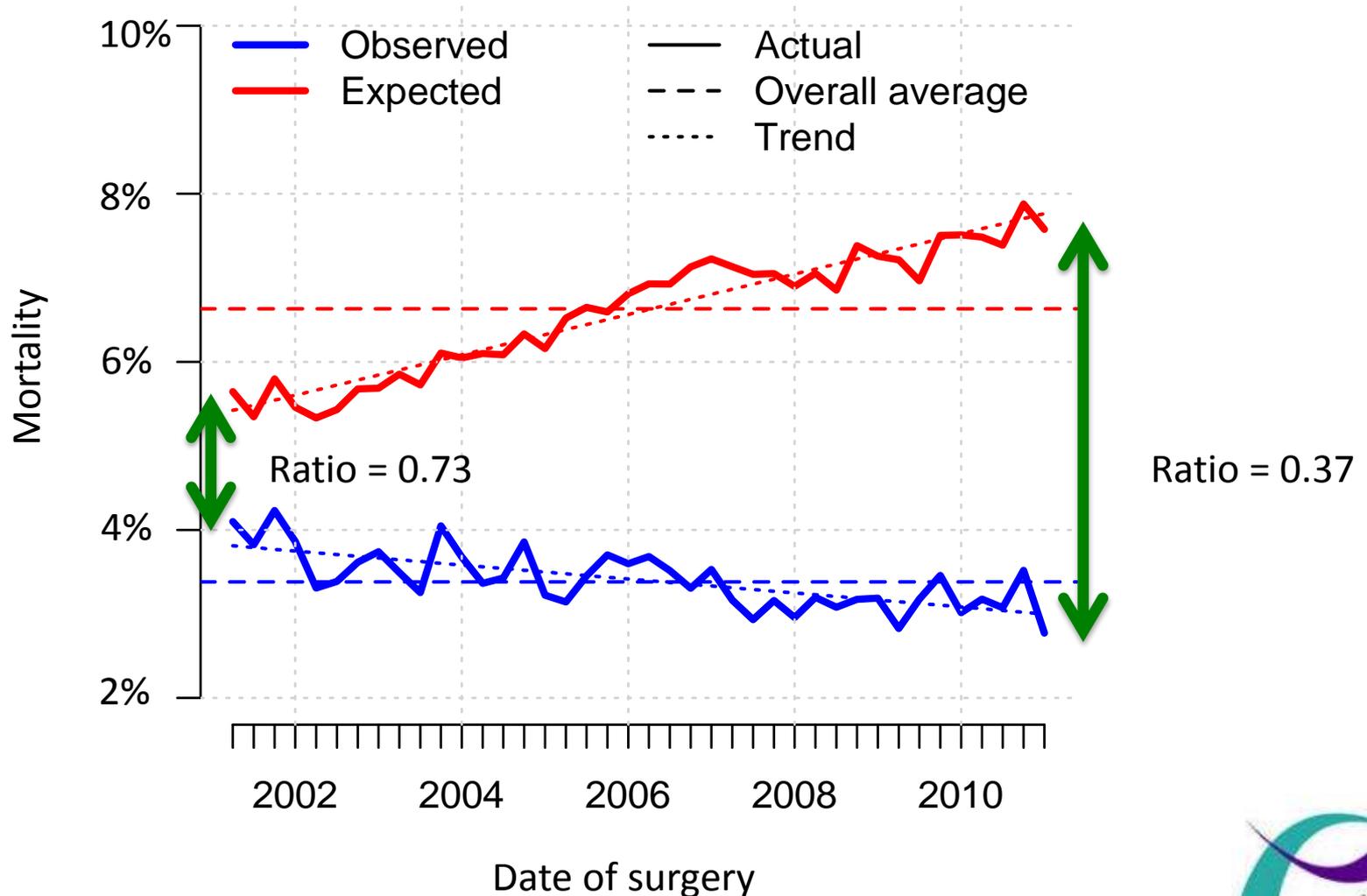
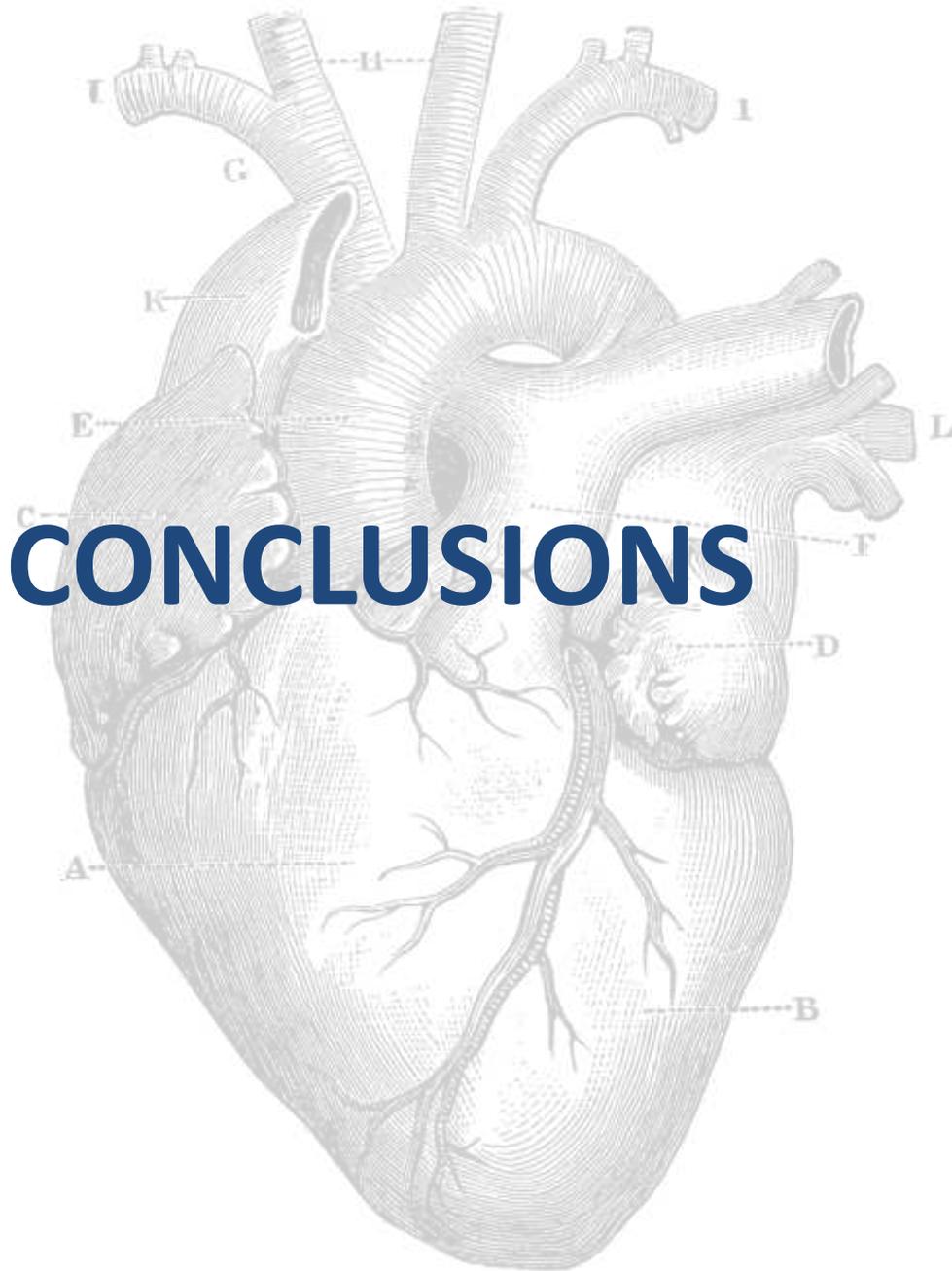




Fig. 37.



# CONCLUSIONS

# Conclusions

- We need to **unlock** healthcare registries to:
  - Monitor quality & avoid a repeat of Bristol
  - Revalidation of professional credentials
  - Facilitate patient choice
  - Develop & validate evidence based medicine
  - Increase in demand
- We can do it all in R!



# Acknowledgements

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## Comments & suggestions

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