

# Considerations re. outcomes

Credit: Maja Hellfritzs

# Outcome / event

Mortality

Suicide attempts

High INR values

Stroke

AMI

Cancer

PCI / CABG

Initiation

Discontinuation

Switching

# **OUTCOME**

Disease

Surgery

Treatment initiation

Biochemical change

# Validity?

Will this proxy classify those with the outcome as having the outcome? And those without the outcome as not having the outcome?



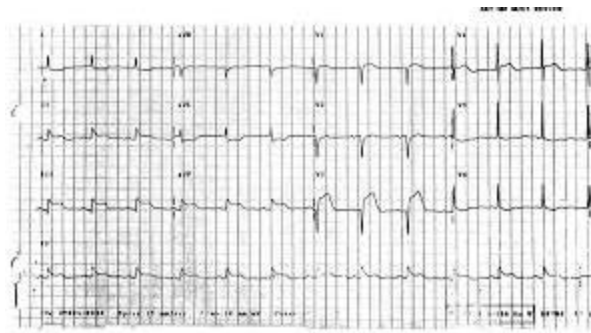
Is the proxy valid?

Myocardial infarction  
= ICD10-code I21

How to test this?



VS.



# BMJ Open Positive predictive value of cardiovascular diagnoses in the Danish National Patient Registry: a validation study

Jens Sundbøll,<sup>1,2</sup> Kasper Adelborg,<sup>1,2</sup> Troels Munch,<sup>1</sup> Trine Frøslev,<sup>1</sup> Henrik Toft Sørensen,<sup>1</sup> Hans Erik Bøtker,<sup>2</sup> Morten Schmidt<sup>1,3</sup>

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## ABSTRACT

**Objective:** The majority of cardiovascular diagnoses in the Danish National Patient Registry (DNPR) remain to be validated despite extensive use in epidemiological research. We therefore examined the positive predictive value (PPV) of cardiovascular diagnoses in the DNPR.

**Design:** Population-based validation study.

**Setting:** 1 university hospital and 2 regional hospitals in the Central Denmark Region, 2010–2012.

**Participants:** For each cardiovascular diagnosis, up to 100 patients from participating hospitals were randomly sampled during the study period using the DNPR.

**Main outcome measure:** Using medical record review as the reference standard, we examined the PPV for cardiovascular diagnoses in the DNPR, coded according to the International Classification of Diseases, 10th Revision.

**Results:** A total of 2153 medical records (97% of the total sample) were available for review. The PPVs

## Strengths and limitations of this study

- This is the first validation study to include all major cardiovascular diagnoses in the Danish National Patient Registry.
- We sampled patients only from hospitals in the Central Denmark Region. However, our results are most likely generalisable to other parts of the country as the Danish healthcare system is homogeneous in structure and practice.
- We only validated patients diagnosed during 2010–2012 and therefore cannot extrapolate our results to previous periods.

## INTRODUCTION

Remarkable improvements have occurred in the prevention and treatment of cardiovascu-

96 of 99 patient with (first)  
I21 code had an AMI.

Valid?



	<b>+ Disease</b>	<b>÷ Disease</b>
<b>+ Code</b>	True pos.	False pos.
<b>÷ Code</b>	False neg.	True neg.

	<b>+ Disease</b>	<b>÷ Disease</b>
<b>+ Code</b>	True pos.	False pos.
<b>÷ Code</b>	False neg.	True neg.

Positive predictive value (PPV): **96 of 99!**  
 Likelihood of disease given registration

Negative predictive value (NPV): ?  $\approx 100\%$ ?  
 Likelihood of absence of disease given no registration

Sensitivity (completeness): ???  
 Proportion of those with disease having registration

Specificity: ?  $\approx 100\%$ ?  
 Proportion of those with no disease having no registration

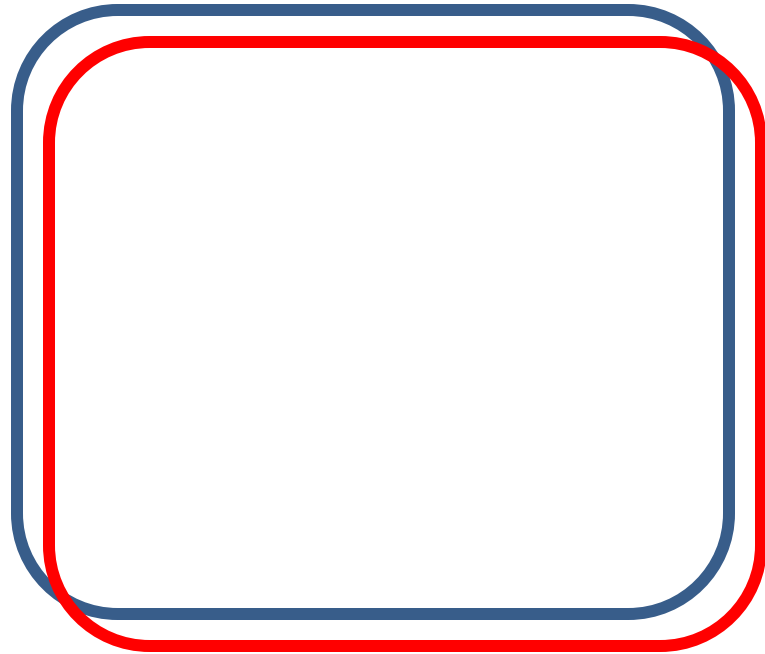
# The perfect proxy!

Proxy always represent an outcome  
(PPV = 100%)

An outcome will always trigger a proxy  
(Sensitivity = 100%)

**NOTE:** Validation often only adress PPV!

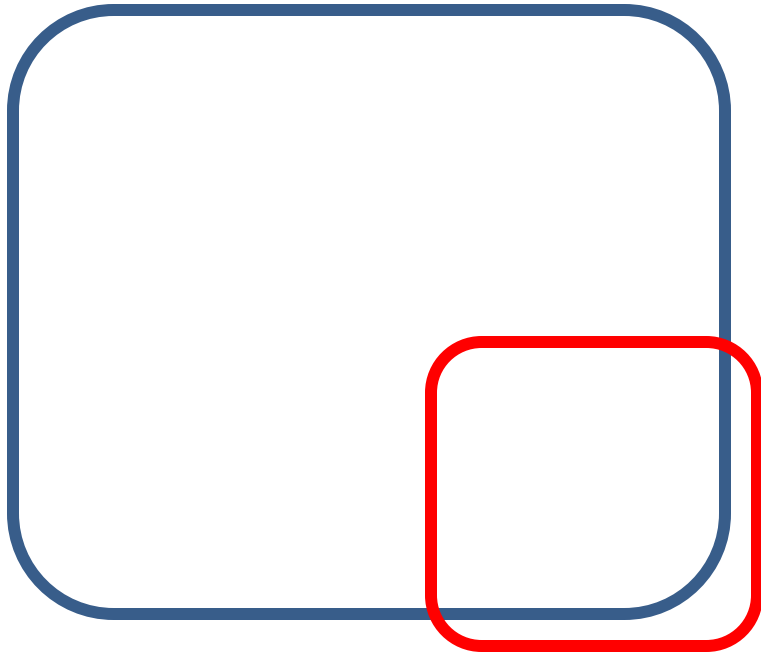
- Those with outcome
- Those with proxy



High PPV  
High sens.

Cancer?

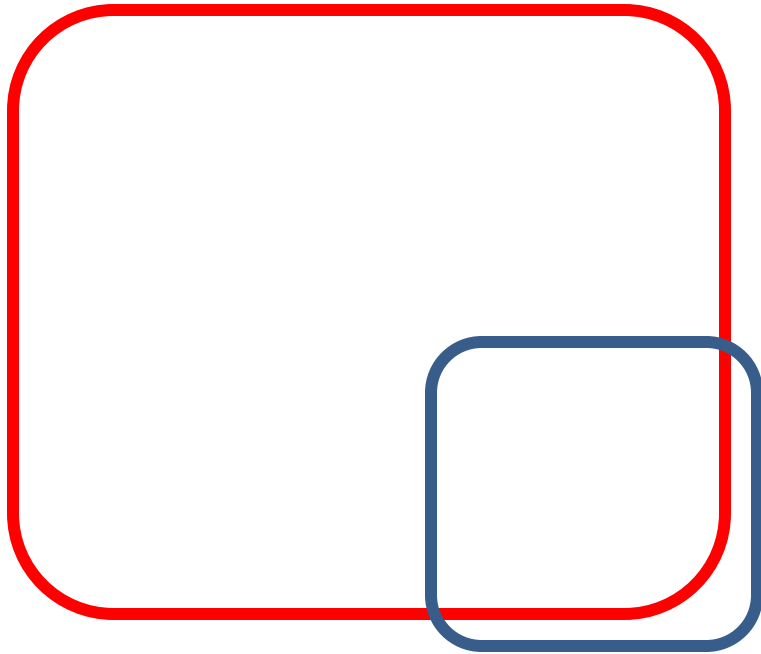
- Those with outcome
- Those with proxy



High PPV  
Low sens.

Obesity diagnosis?

- Those with outcome
- Those with proxy



Low PPV  
High sens.

Gastrosocopy as proxy for intestinal bleeding?



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**Journal of  
Clinical  
Epidemiology**

**REVIEW ARTICLE**

A review of uses of health care utilization databases  
for epidemiologic research on therapeutics

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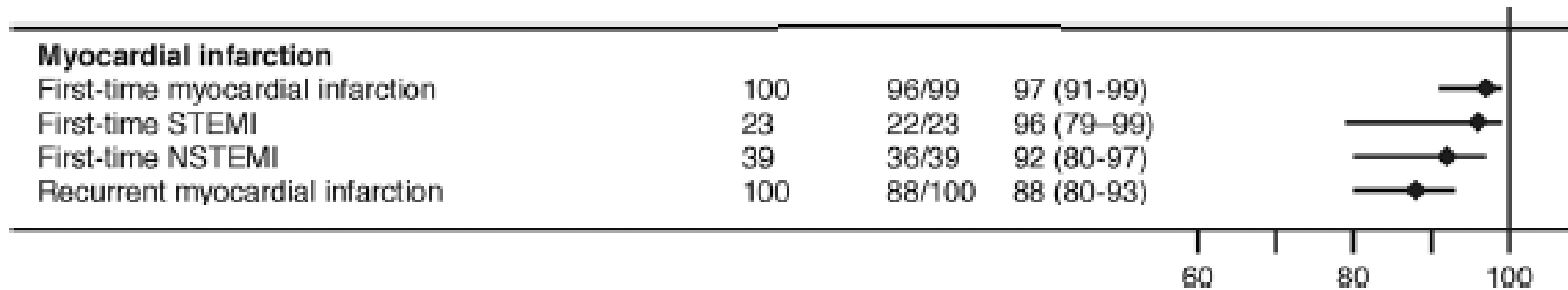
Accepted 16 October 2004

**PPV > Sensitivity**

(Most important that the registered outcomes are in fact outcomes!)

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Suboptimal validity...

Misclassification

What is the height difference  
between men and women?

# Suboptimal validity...

Misclassification of outcome status = information bias

Low PPV →

Those without outcome classified with outcome

Low sensitivity →

Those with outcome classified as not having outcome

As long as validity does not depend on exposure status, misclassification is non-differential and thus biases towards unity (making the groups appear alike)!

# How to increase validity?

Algorithms!

Validate!

Stick to codes with high PPV!

Restrict to incident outcomes, primary diagnoses,  
diagnoses from specialized departments!

Consider sensitivity analyses!

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# Identifying Patients with Myasthenia for Epidemiological Research by Linkage of Automated Registers

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Requiring both diagnosis and prescription yielded PPV of 93%!

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## Key Words

Myasthenia · Neuromuscular diseases · Neurological disorders · Epidemiology · Research methods

the positive predictive value of the register diagnosis was 92.9% (95% confidence interval, CI, 84.3–97.7), the false-positive rate was low (2.8%), and the sensitivity was acceptable (81.2%; 95% CI 71.2–88.8). **Conclusions:** Our data indicate that this novel approach of combining diagnosis register and

# Algorithms

## Excluding algorithms (increases PPV!)

Multiple requirements to count as outcome  
e.g. DVT diagnosis AND later AC treatment

## Inclusive algorithms (increases sensitivity!)

Multiple ways of counting as outcome  
e.g. diabetes diagnosis OR antidiabetic use

# Involve a clinician!



(and beware of pseudo-clinicians!)

# Validation?

We defined cases by fulfilment of three criteria: admission with peptic ulcer or gastritis as the main diagnosis to one of the county's hospitals during 1 January 2000 to 31 December 2004; significant bleeding defined by melaena, a subnormal haemoglobin, or the need for transfusions; and a potential bleeding source in the stomach or duodenum identified by endoscopy or surgery.

# The Danish National Patient Registry: a review of content, data quality, and research potential

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**Background:** The Danish National Patient Registry (DNPR) is one of the world's oldest nationwide hospital registries and is used extensively for research. Many studies have validated algorithms for identifying health events in the DNPR, but the reports are fragmented and no overview exists.

**Objectives:** To review the content, data quality, and research potential of the DNPR.

**Methods:** We examined the setting, history, aims, content, and classification systems of the DNPR. We searched PubMed and the *Danish Medical Journal* to create a bibliography of validation studies. We included also studies that were referenced in retrieved papers or known to us beforehand. Methodological considerations related to DNPR data were reviewed.

**Results:** During 1977–2012, the DNPR registered 8,085,603 persons, accounting for 7,268,857 inpatient, 5,953,405 outpatient, and 5,097,300 emergency department contacts. The DNPR provides nationwide longitudinal registration of detailed administrative and clinical data. It has recorded information on all patients discharged from Danish nonpsychiatric hospitals since 1977 and on psychiatric inpatients and emergency department and outpatient specialty clinic contacts since 1995. For each patient contact, one primary and optional secondary diagnoses



Table S1 (Continued)

ICD codes <sup>a</sup>	Condition	Study period (contact type; diagnosis type)	ICD codes/algorithm <sup>b</sup>	n <sup>c</sup>	PPV; NPV; sensitivity; specificity <sup>d</sup>	
I21	Acute myocardial infarction	1996–2009 (IN; * A)	I21	148	PPV = 100 (97.5–100)	
		1998–2007 (IN/OUT; A)	I21, I22, I23	50	PPV = 98.0 (89.5–99.7)	
		1993–2003 (IN/ OUT/ED; A/B*)	410; I21	1,072	PPV <sub>IN/OUT/ED</sub> = 81.9 (79.5–84.1); PPV <sub>IN; AB</sub> = 92.4 (90.4–93.9); PPV <sub>IN; A</sub> = 94.4 (92.6–95.7)	
		1982–1991 (IN; A/B)	410, 427.24, 427.27, 427.91, 427.97	5,022	PPV <sub>A</sub> = 94.3 (93.6–94.9); PPV <sub>A; B</sub> = 93.4 (92.6–94.0); Se <sub>A</sub> = 62.8 (61.7–64.0); Se <sub>A; B</sub> = 69.5 (68.4–70.6)	
		1979–1980 (IN; A/B)	410–414	527	PPV = 92.4 (89.8–94.4)	
I26	PE	1994–2006 (IN/ OUT/ED; A/B)	450.99; I26	353	PPV <sub>All</sub> = 67.4 (62.4–72.1); PPV <sub>IN/OUT</sub> = 82.1 (77.2–86.1); PPV <sub>ED</sub> = 29.6 (22.0–38.5); PPV <sub>A</sub> = 87.0 (81.9–90.9)	
		PE during pregnancy and postpartum	1980–2001 (IN; * A*)	450.00–450.99; I26.0–I26.9 + (650–666; O80–84)	22	PPV <sub>preg+postpartum</sub> = 81.8 (59.7–94.8); <sup>‡</sup> PPV <sub>preg</sub> = 63.6 (40.7–82.8) <sup>‡</sup>
		PE after stroke	2003–2006 (IN; A/B)	I26 (after admission to stroke units and age ≥ 18 y)	11	PPV = 90.9 (62.3–98.4); NPV = 97.4 (95.8–98.4); Se = 0.0 (0.0–32.4); Sp = 100 (99.3–100)
I46	Cardiac arrest	1993–2003 (IN/ OUT/ED; A/B*)	427.27; I46	42	PPV <sub>IN/OUT/ED</sub> = 50.0 (35.5–64.5); PPV <sub>IN</sub> = 53.1 (36.5–69.1)	
I48	Atrial fibrillation or flutter	1993–2009 (IN/ OUT/ED; A/B)	427.93, 427.94; I48	284	PPV <sub>All</sub> = 92.3 (88.6–94.8); PPV <sub>IN/OUT</sub> = 94.0 (90.5–96.3) (independent of diagnosis type and department specialty); PPV <sub>ED</sub> = 64.7 (41.3–82.7)	
		1980–2002 (n/a; n/a)	427.93, 427.94; I48	174	PPV = 98.9 (95.9–99.7)	
		1980–2002 (n/a; n/a)	427.93, 427.94; I48	116	PPV = 96.6 (91.5–98.7)	
		1977–1999 (IN/ OUT/ED; A/B)	427.94; I48.9A	108	PPV = 50.0 (40.7–59.3)	
I48.9A	Atrial flutter					
I50	Heart failure	1998–2007 (IN/OUT; A)	I50, I11.0, I13.0, I13.2	50	PPV = 100 (92.9–100)	

# Considerations re validity

## **What is most important?**

To identify all outcomes (high sensitivity)?

To make sure outcomes are correct (high PPV)?

# Considerations re validity

What is most important?

To identify all outcomes (high sensitivity)?

To make sure outcomes are correct (high PPV)?

Unless specific considerations:

$PPV > \text{Sensitivity}$