

USE OF PRIMARY CARE DATABASES IN EPIDEMIOLOGIC RESEARCH

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The structure to successfully perform a pharmacoepidemiology study with automated primary care databases can be divided into the following items:

- **Hypothesis:** correct research question
- **Study design:** best suited design
- **Rich data source:** numbers and detail (quantity and quality)
- **Correct definition and classification** of the **outcome/exposure**
- **Analysis:** adequate analysis plan

- Statement about the relationship between a drug and a disease that can be tested

- Hypothesis definition requires the researcher to have knowledge on:
 - **Biological mechanism:** detailed knowledge about the study drug and disease; mechanism of action (i.e. whether the effect is acute or chronic, local or systemic, modified by other factors...)

 - **Data sources:** detailed knowledge about the source of information (i.e. population included, type of health system, strengths and limitations...)

Study Hypothesis

The study design and methodological approaches will be subject to the study question

- **When there are prior data available:**

- this must be considered when conducting a new study
- especially when a new study aims to replicate what was already observed in a previous one

- **When no prior data are available:**

- defining the hypothesis might be more challenging
- the marginal contribution of a single study is the greatest

How to decide the most appropriate design under the observational approach:

- **Cohort:** e.g. follow-up study, long-term outcomes, survival
- **Case-control:** e.g. specific dose/duration effect
- **Case-crossover:** e.g. transient exposures/acute/prompt outcomes
- **Drug utilization:** e.g. treatment patterns, switching patterns, comparison with guidelines recommendations
- **Meta-analysis:** e.g. pooled estimates to reach conclusions on hypothesized association performed by different studies

Traditional “differences” between cohort and nested case-control studies

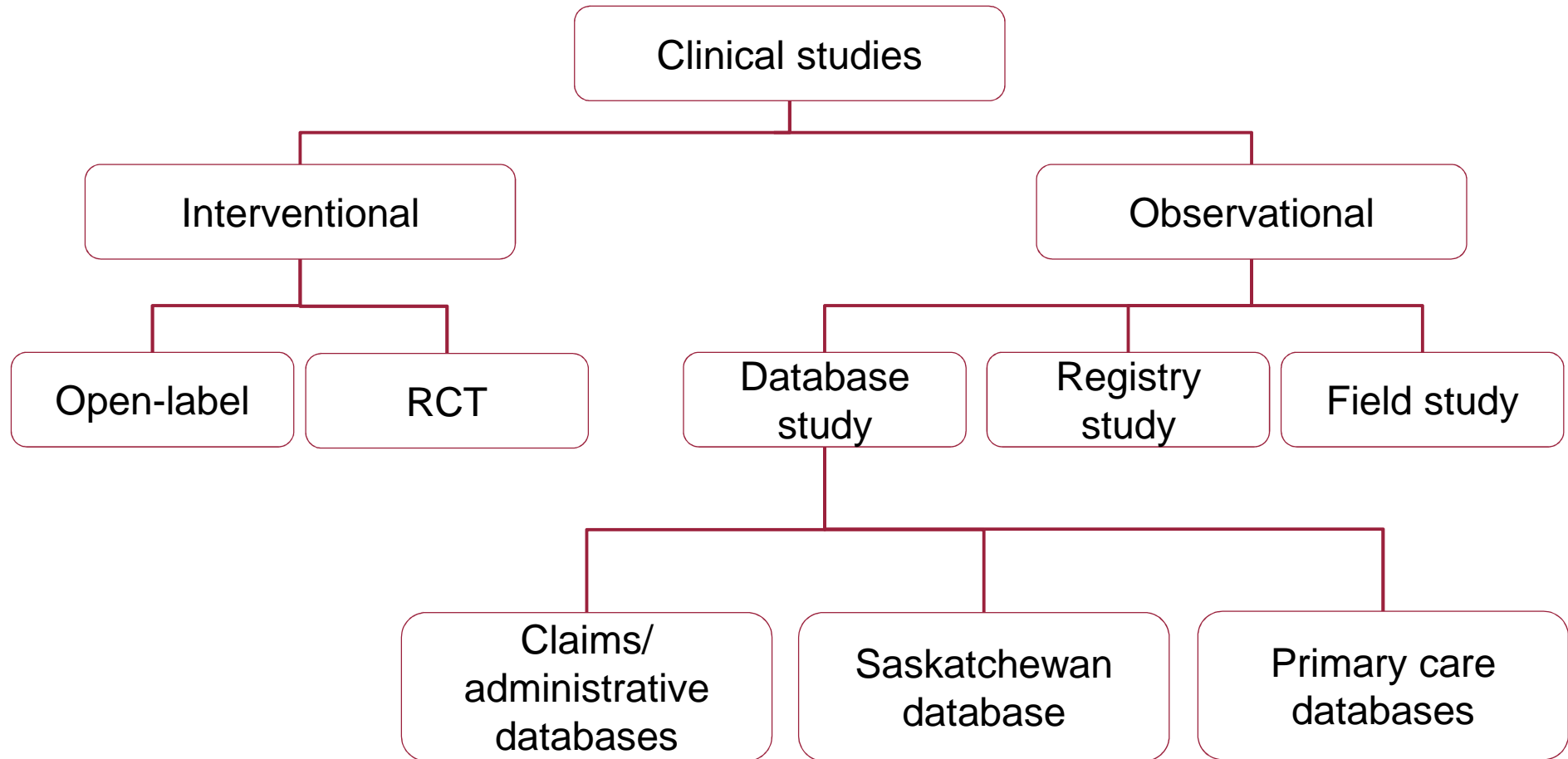
COHORT STUDIES

- Temporal sequence between exposure and outcome can be established
- Useful to study rare exposures, i.e. a specific chemical product
- Multiple outcomes associated with the exposure can be studied
- Information on confounding factors can be obtained
- Useful for estimating the risk of disease, the incidence rate and/or relative risks. Time-to-event analysis is possible as well
- Less prone to selection and information biases as compared to other designs

NESTED CASE-CONTROL STUDIES

- They may be less expensive and time consuming than cohort studies
- Rare diseases may be explored
- Diseases with long latency period can be studied
- It is possible to investigate multiple exposures
- When a risk set sampling is used to select the controls, the outcome estimate is similar to the risk ratio
- In "nested" case-control designs, information on exposures have been collected before cases had been diagnosed, and may be less prone to bias.

Clinical studies: where do pharmacoepidemiology (PE) studies fit in?



- **Field-based studies:** Researcher captures the information directly from the patient
 - Interview
 - Survey
 - Nurses
- **Registries:** Systematic collection of data about specific conditions. There can be population-based as well as hospitalized-based
 - Cancer
 - Pregnancy
 - Autoimmune diseases (Multiple Sclerosis)
- **Automated/computerized database:** Digital version of a paper chart that contains collections of clinical records with a defined structure and purpose. These databases include information at patient-level, on demographics, drug prescriptions, specialist referrals, hospital admissions, hospital discharge diagnoses, operations, ambulatory care

- **Claims/administrative databases:** Captured claims data for individuals or multiple insurers, describing all transactions that results in a claim for reimbursement.
 - **Medicaid:** Federal state program for financing medical care to low income population.
 - **HMO database:** Consortium of health care delivery organizations with integrated research divisions (Kaiser Permanente, Harvard Pilgrim), group health cooperative. Collected for administrative purposes. Drug inventory, hospital discharges and demographic accounting
 - **Commercial insurance databases:** HealthCore, PharMetrics
- **Saskatchewan databases:** Provincial health system (government held database) , universal coverage for most residents, information accumulated on computer. Possibility of linking to other files (death records, cancer registry, mental health services)
- **Primary care databases:** Electronic medical records

Revolution of primary care database started in the '80s

Some characteristics converged together to make the first EMR in the UK a possibility

- Universal Health Care system in the UK
- Replacement of medical charts with medical records (Alan Dean, VAMP, eventually EMIS, Vision, etc)
- Dictaphones to record diagnostic and treatment information
- Active counseling and training to primary care physicians willing to participate
- Validation exercises for recorded information to ensure quality of information (Boston Collaborative Drug Surveillance Program (BCDSP))

Pioneers sources of information in pharmacoepidemiology...

- **CPRD** and **THIN** (two primary care databases in the UK) are gold-standard sources of information to perform pharmaco-epidemiologic studies
 - Strengths of these resources include:
 - i) Highly granulated dictionaries (Read, drug Gemscript)
 - ii) Drugs and devices prescriptions automatically recorded
 - iii) Completeness of information: primary care practitioners (PCPs) are gatekeepers in the health care system
 - iv) Feasibility of validation processes

Use of **large databases** with access to millions of patients enables the study of **rare diseases** or **outcomes difficult to capture**

- **Medical research database of systematically recorded anonymous patient records**
- **Validated for use in pharmacoepidemiology¹**
- **Contains details on close to 4 million patients currently registered with primary care physicians (PCPs) in the UK**
- **Prospectively recorded information on patients' demographics, medical history (symptoms, diagnoses), prescriptions, additional health data (laboratory results), details of outpatient visits and hospitalisations**
- **Free text comments are available**
- **Subset of practices linked to HES files**



¹Lewis JD *et al. Pharmacoepidemiol Drug Saf* 2007;16:393–401.

Choosing a good data source alone does not guarantee the validity of the study results

- Transforming data into relevant information regarding the study hypothesis will depend on researcher's ability to:

- **Extract**
- **Process**
- **View**
- **Analyze**

➡ Importance of using specific tools to support efficient data collection and analysis

How to start?

1) Outcome of interest

- Relevant operational definition: constructing specific diagnostic algorithms
- Validation of diagnostic algorithms



This validation process should include:

- I) **Manual review** of patients' profiles with anonymized free text comments
- II) **Questionnaires sent to Primary Care Physicians** requesting them to send anonymized copies of notes (hospital summaries, discharge/referral letters, reports of diagnostic procedures, etc.)

Outcome and exposure validation

- The full validation process, including both steps, should always be performed when:
 - There is **no prior experience** with the particular disease in the database
 - **Concerns exist regarding our ability to validly identify** cases using only coded information

- When validation of the entire case set might not be feasible for logistic reasons:
 - **Random subset(s)** of all computer-detected cases **is required to undergo validation**

Validation in primary care databases

The task of transforming these data into relevant information addressing the study hypothesis depends on researchers' expertise in extracting, processing and analysing the data.

The process of case ascertainment and validation of the outcome of interest is summarised below

A. Relevant operational definition for case ascertainment

Feasible operational definition

Constructing specific diagnostic algorithms

Objective eligibility criteria

B. Manual review of patient profiles for case validation

B (i) Manual review of patients' records (without free-text comments) identified by the algorithms. This is useful for assessing the validity of the initial computer search strategy and algorithms

B (ii) Manual review of the patients' records including anonymized free-text comments related to the outcome of interest. (e.g. PCP notes, hospital summaries, discharge/referral letters, reports of diagnostic procedures)

C. Questionnaires to PCPs for case confirmation

2) Drug exposure

- Classification of individuals or person-time according to recency, dose, and duration of exposure

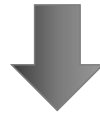


Extracting information from the database:

- Not always a straightforward process
- Often requires fairly **complex programming algorithms**, considering:
 - time period elapsed between repeat prescriptions, prescribed **daily dose** and number of pills in each prescription
 - should be able to deal with partial missing data and to assume some degree of non-compliance

- Classification of individuals or person-time according to recency, dose, and duration of exposure:
 - might **vary between studies** depending on the strategy followed
 - these **differences of drug exposure definition** could have an impact on the results
- Invalid exposure ascertainment might prevent documenting dose or duration response when inferring causality
- Errors in exposure measurement will compromise interpretation of the results

Our ability to correctly ascertain drug exposure might be limited by



quality of the information in the data source

e.g.

- drug exposures obtained from biennial self-reported questionnaires (e.g. Health Professionals or Nurses' Health Study), or
- drug exposure ascertained at initial discharge from hospital and assumed to remain constant over a long follow-up period

Primary care databases based on prospective recording avoid the likelihood of recall biases present in sources of information with either retrospective recording or recording based on memory of participants

Outcome validation: True Positive

#	7	Id:0007-004426	FamId:0002067	Pract. Start: 1/07/1992	Vision Start:28/12/1995	Reg:24/05/1990	RST: DIED	Out:19/07/2001	DB:THIN1201	
MALE	DOB: 1/07/1929	Age at Ix: 70	Marit.Stat: ?	Drawdown:01/12	Urb/Rural:5	Townsend Idx:2	Rxs:156	Evs:250	Fds:29	T.R.:37
47526	15/02/2000	-----	Discharged from hospital	CVA RT HEMIPARESIS.	[O]	<8HE..00>				
			CT SCAN SHOWS INFARCT LEFT PARIETAL LOBE WITH SMALL BLEED. OLD INFARCT RT FRONTAL LOBE. CREAT 164 UREA 9.8 CHOLESTEROL 5.9 WARD [DELETED]							
47529	18/02/2000	-----	Monitoring of patient	NEVER GAVE HIM	[OF]	<8A...00>				
			ASPIRIN. DRAGGING TOES ARM CANT BE LIFTED. 4 HOME ASSESSMENT PHYSIO.							
47529	18/02/2000	<98776997>	4908 ASPIRIN	TAKE 1 OR 2, DAILY D=0		N=56				
47530	19/02/2000	-----	Letter encounter	4 OPD SPEECH THERAPY	[OF]	<9N33.11>				
47534	23/02/2000	-----								
47557	17/03/2000	Blood pressure	DIASTOLIC 75	SYSTOLIC 125		<246..00>	O/E - blood pressure reading			
47557	17/03/2000	-----	Monitoring of patient	OK WALKS WEAK R SIDE.	[OF]	<8A...00>				
			EXPRESSIVE DYSPHASIA SR BP OK.							
47561	21/03/2000	-----	Monitoring of patient	PAIN R KNEE ? OA	[OF]	<8A...00>				
			CO-CODAMOL 100							
47574	3/04/2000	-----	Telephone encounter		[OF]	<9N31.00>				
47581	10/04/2000	<96950997>	6138 AMIODARONE	1 EVERY DAY D=0		N=60				
47581	10/04/2000	<98776997>	4908 ASPIRIN	TAKE 1 OR 2, DAILY D=0		N=56				
47581	10/04/2000	<93212998>	6794 FRUSEMIDE W AMILORIDE	TAKE ONE EACH MORNING D=0		N=56				
47590	19/04/2000	Smoking	Smoking status - Ex smoker			<137..00>	Tobacco consumption			
47590	19/04/2000	Weight	WEIGHT(KG) 85	BMI 27.7		<22A..00>	O/E - weight			
47590	19/04/2000	-----	Had a chat to patient	NOT SLEEPING WHEN	[OF]	<8CB..00>				
			STOPS ZOPICLONE?ALSO BIT LOW,CONSTIPATION A PROB SINCE CVA AND NOT EATING MUCH,NO DYSPHAGIA,CHAT++,TRY VARIOUS,CHECK 1M							
47610	9/05/2000	-----	Ultrasound scan	RENAL TRACT	[OF]	<58D..00>				
			PINDERS-,NORMAL KIDNEYS APPART FROM SMALL SCAR R,150ML RESIDUAL URINE,GALL STONE NOTED							
47618	17/05/2000	Weight	WEIGHT(KG) 82	BMI 26.7		<22A..00>	O/E - weight			
47618	17/05/2000	-----	Had a chat to patient	MORE MOBILE,ATTENDS	[OF]	<8CB..00>				
			HYDROTHERPY,SLEEP AND MOOD BETER,SOME WT LOSS BUT EATING BETER NOW,SKIN BIT RED?AMIODARONE,KEEP ON DTP 9M,CHECK WT 2M							
47620	19/05/2000	-----	Seen in hospital casualty	CVA 18. [DELETED] A/E	[OF]	<9N19.00>				
47620	19/05/2000	4360	Stroke and cerebrovascular accident unsp	CT-CEREBRAL	[DF]	<G66..00>				
47620	19/05/2000	-----	INFARC-WARFARINIZED,MED [DELETED]							
47625	24/05/2000	-----	Telephone encounter	[DELETED]-UPDATED RE	[OF]	<9N31.00>				
			U/S RENAL TRACT AT [DELETED] AS [DELETED] IN HOSPITAL							
47641	9/06/2000	<93212998>	6794 FRUSEMIDE W AMILORIDE	TAKE ONE EACH MORNING D=0		N=56				
47644	12/06/2000	International normalised	2.7 ratio			<42QE.00>	International normalised ratio			
47644	12/06/2000	-----	International normalised ratio	2.7 CONTACTED LABS	[OF]	<42QE.00>				
			PREV RESULTS 3-2.9 CONT ON IMG CIW							
47644	12/06/2000	-----	Telephone encounter	[DELETED],FELL OVER	[OF]	<9N31.00>				
			TODAY,OK NOW,?WAS SYNCOPAL,CHAT RE VBI,REVIEW IN NEXT FEW DAYS							
47648	16/06/2000	<97119997>	5703 DIGOXIN	1 EVERY DAY D=0		N=60				
47648	16/06/2000	<95617998>	1904 WARFARIN	AS DIRECTED BY THE HOSPITAL D=0		N=100				

Low dose ASA initiation
CVD indication

Follow up contribution

New Episode

Outcome validation: False Positive

#	Date	Event	Code	Description	ICD-9	ICD-10	Notes
# 117				Id:0181-009456 FamId:0006125 Pract. Start: 1/07/1992 Vision Start:26/06/1997 Reg:28/02/1984 RSt: DIED Out: 7/10/2008 FEMALE DOB: 1/07/1936 Age at Ix: 70 Marit.Stat:MARRIED Drawdown:01/12 Urb/Rural:4 Townsend Idx:1 Rxs:295 Evs:392 Fds:73 T.I			
50088	20/02/2007	-----		Telephone encounter ON WELL , SPEECH IS COMING BACK, WANTS TO COME HOME ? FIT ENOUGH, HE WILL SEE SPECIALIST ON THURSDAY			FROM HUSBAND, GETTING [OF] <9N31.00>
50091	23/02/2007			CAT scan			<567..13> Computerised tomograph
50091	23/02/2007			Echocardiogram			<5853.11> Echocardiogram
50091	23/02/2007	-----		Letter from specialist HOSPITAL GASTROENTEROLOGY			CLINICAL LETTER OTHER [O] <9N36.00>
50091	23/02/2007	-----		Letter from specialist HOSPITAL GASTROENTEROLOGY			CLINICAL LETTER OTHER [O] <9N36.00>
50092	24/02/2007	-----		Discharged from hospital LETTER/SUMMARY OTHER HOSPITAL			DISCHARGE [O] <8HE..00>
50092	24/02/2007	-----		Discharged from hospital LETTER/SUMMARY OTHER HOSPITAL			DISCHARGE [O] <8HE..00>
50097	1/03/2007			Urine test			<46...11> Urine tests
50097	1/03/2007			Urine test			<461..00> Urine exam. - general
50097	1/03/2007			Urinalysis - Protein			<467..00> Urine protein test
50097	1/03/2007			Urine Biochemistry			<46N..00> Urine protein
50097	1/03/2007			Other Bacteriology Tests			<4J15.11> Culture sensitivity
50097	1/03/2007			Urine Dipstick for Nitrit			<46X2.00> Urine dipstick for niti
50097	1/03/2007			Blood pressure	DIASTOLIC 70	SYSTOLIC 130	<246..00> O/E - blood pressure re
50097	1/03/2007	-----		Urinalysis - general LEIUKS ETC , TO LAB			POSITIVE , PROTEIN [OF] <461..00>
50097	1/03/2007		4360	Stroke and cerebrovascular accident unsp AND DAY HOSPITAL			REFER STROKE CLINIC , [OF] <G66..00>
50097	1/03/2007			<93619997> 19103 SIMVASTIN			1 EVERY NIGHT D=0 N=56
50097	1/03/2007			<97217998> 6716 BENDROFLUMETHIAZIDE			1 EVERY MORNING D=0 N=56
50097	1/03/2007			<96950997> 6138 AMIODARONE			1 EVERY MORNING D=0 N=56
50097	1/03/2007			<98776997> 4908 ASPIRIN			1 EVERY MORNING D=0 N=56
50097	1/03/2007			<89659997> 6188 BISOPROLOL FUMARATE			1 EVERY MORNING D=0 N=56
50098	2/03/2007	-----		-----			
50102	6/03/2007	-----		Other rehabilitation			[6 S] <8F...00>
50103	7/03/2007	-----		-----			
50103	7/03/2007		4360	Stroke and cerebrovascular accident unsp			[R S] <G66..00>
50104	8/03/2007	-----		Seen in speech and language clinic [DELETED] PCT SPEECH AND LANGUAGE THEREPY			CLINICAL LETTER [O] <9N0Q.00>
50105	9/03/2007	-----		Urine tests PRESCRIPTION/[DELETED]			ON CORRECT [O] <46...11>
50108	12/03/2007	-----		Encounter administration PATIENT HAS APPT WITH SPEECH THERAPY AT 9 AM AND APPT IN DR [DELETED] CLINIC AT 11 AM ON WEDNESDAY. [DELETED] SECRETARY, WANTS TO KNOW WHICH APPT SHOULD BE GIVEN PRIORITY AS IT WON'T BE POSSIBLE FOR HER TO ATTEND BOTH. [DELETED] GIVEN MESSAGE TO CALL [DELETED]			DR [DELETED]SEC RANG. [O] <9N...11>
50109	13/03/2007			Blood pressure	DIASTOLIC 60	SYSTOLIC 110	<246..00> O/E - blood pressure re

Low dose ASA initiation
CVD indication

Refer to prior event

Over-the-counter low-dose aspirin use Questionnaire

Practice ID	Patient ID	Sex	Age on 1/1/2013

Please answer all the questions according to the information held in the patients written records by ticking the appropriate box or writing in the space provided.

1. Is the patient currently taking low-dose aspirin or in the last three months?
 Yes No Unknown

If YES:

- Are they taking prescription aspirin or over-the-counter aspirin?
- How long have they been taking aspirin?
- What is the indication for low-dose aspirin use?
 - Primary Prevention
 - Myocardial Infarction
 - Unstable Angina
 - Revascularization
 - Cerebrovascular disease (including stroke or transient ischaemic attack)
 - Other (please specify) _____

If NOT:

2. Did the patient ever take low-dose aspirin?
 Yes No Unknown

If yes:

- were they taking prescription aspirin or over-the-counter aspirin?
- When did they stop taking low-dose aspirin?
- What was the reason to stop taking low-dose aspirin?

Adverse event: (list which _____) Change antiplatelet Other

- What was the indication for low-dose aspirin use?
 - Primary Prevention
 - Myocardial Infarction
 - Unstable Angina
 - Revascularization
 - Cerebrovascular disease (including stroke or transient ischaemic attack)
 - Other (please specify) _____

3. Is the patient currently or in the last three months taking over-the-counter one of the following drugs?

a. Proton Pump inhibitors Yes No Unknown
 Please specify name of individual PPI:

b. H₂ receptor antagonists Yes No Unknown
 Please specify name of individual H₂RA:

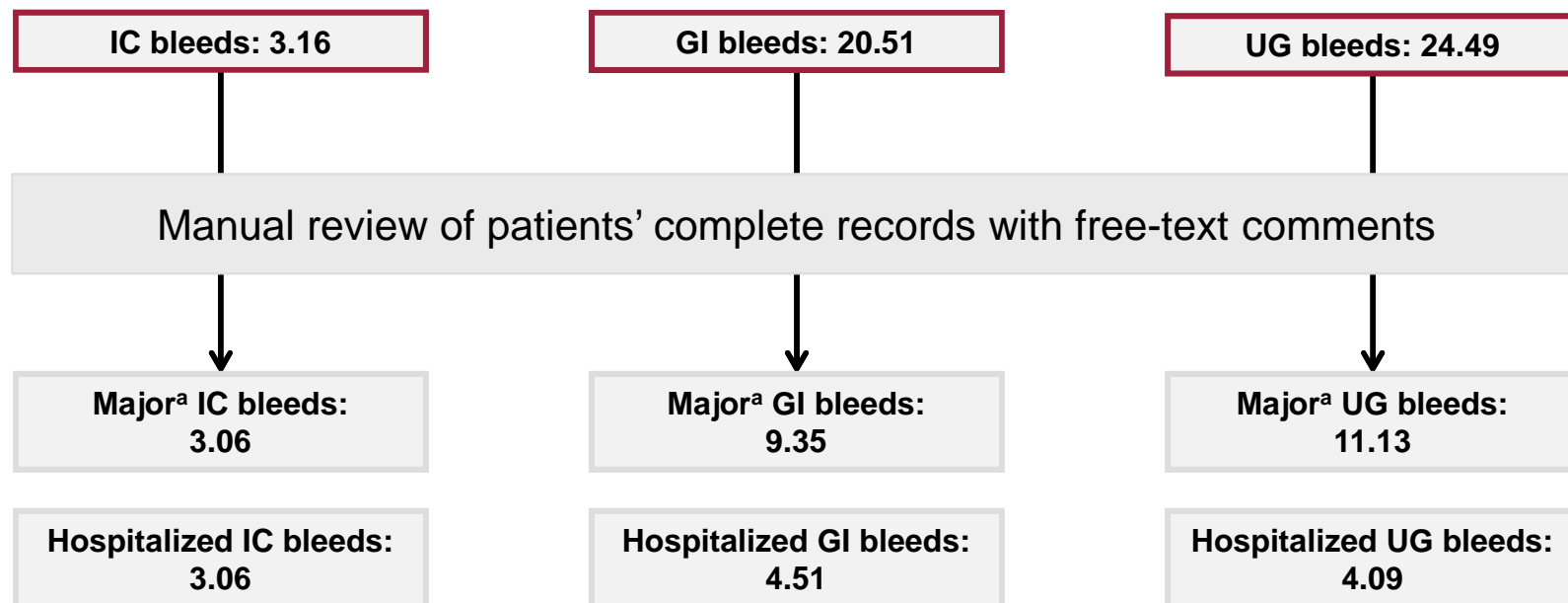
c. NSAIDs Yes No Unknown
 Please specify name of individual NSAID:

Impact of case validation in THIN

Incidence of major bleeds among combined study cohorts

Including all bleeds identified by Read codes leads to misclassification of outcome and corresponding over-estimation of incidence of major bleeds

IC, GI and UG bleeds identified by Read codes (incidence per 1,000 person-years)



^aMajor bleed = requiring referral or hospitalization

GI, gastrointestinal; IC, intracranial; UG, urogenital

Use of **large databases** with access to millions of patients enables the study of rare diseases or outcomes difficult to capture

Yet caution is needed:

- This phenomenal statistical power ensures precision on study results irrespective of their validity; this “amplifying” effect is particularly pernicious when erroneous data management or study design led to invalid estimates
- Requires careful planning and data analysis by experienced researchers
- Facilitate methodological mistakes translate into flawed conclusions

Good hypothesis, good data source, and a good design might not be enough...we might spoil it in the analyses

▪ Issues to take into account:

- **Discuss an analysis plan**
- **Minimizing confounding**

- Identify all potential confounders
- Use the most adequate statistical test and other analyses such as stratification

- **Sensitivity analysis**

In general, the use of complicated analytical methods is not recommended, unless they are well understood and **add** documented relevant contributions to conventional analyses

- **Observational studies that use electronic medical records provide valuable data and can be just as important as RCTs**
- **UK primary care data are of global significance**
- **The quality/experience of the researchers, as well as the quality of the data source, is key**