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*Seminario satellite di Farmacoepidemiologia – Associazione Italiana di
Epidemiologia*

**Nuovi approcci per controllare il
confondimento tramite acquisizione di dati
clinici: Esperienze nazionali ed internazionali**

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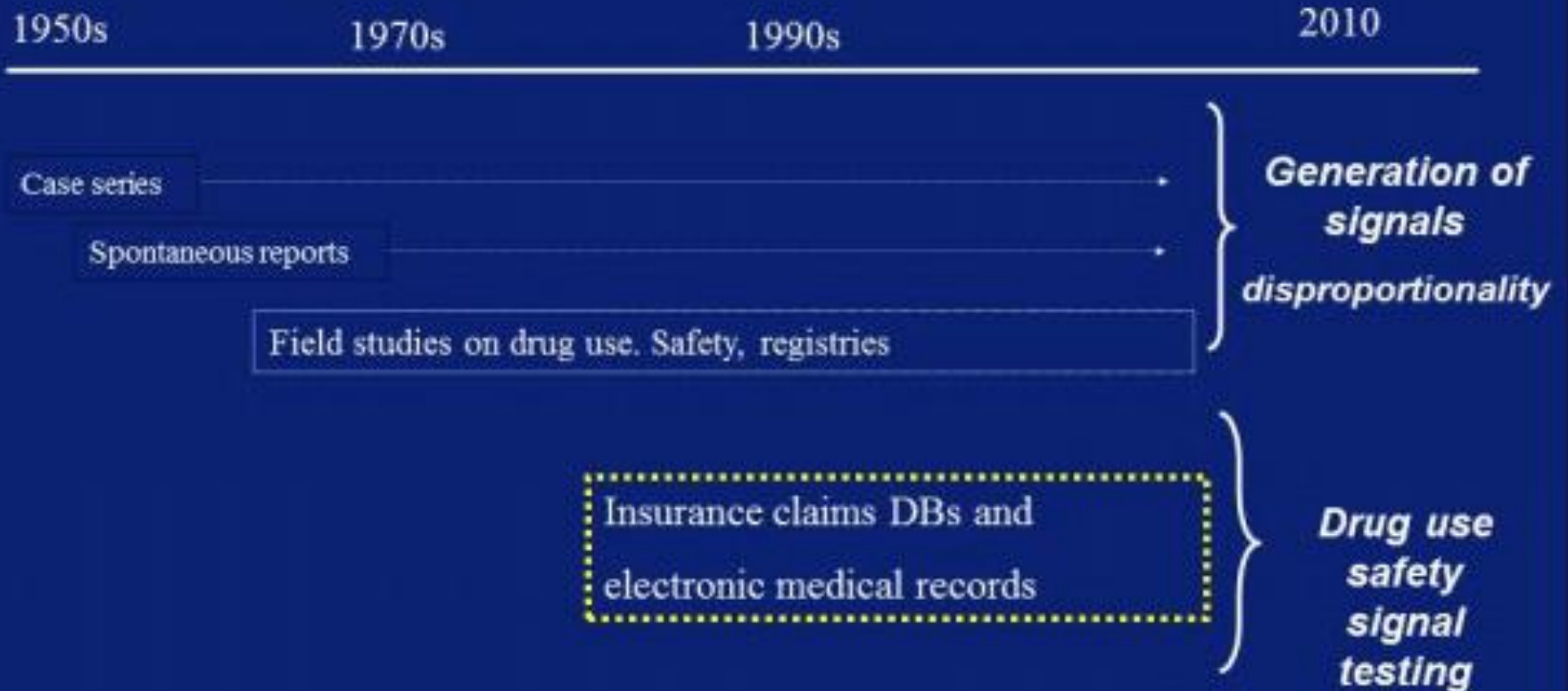
Erasmus University Medical Center, Rotterdam (Olanda)



Outline

- ❑ Come è cambiata la ricerca in farmacoepidemiologia?
- ❑ Acquisizione di dati clinici in studi su banche dati:
 - Perché?
 - Quali dati?
 - Quali tecniche di *confounding adjustment*?
- ❑ In prospettiva...

Come è cambiata la ricerca in farmacoepi?



Creation of networks of DBs for large size active surveillance (SENTINEL, VSD, OMOP, EU-ADR...)

Courtesy of M. Sturkenboom

Large consortia of multi-DB safety studies

US

- VSD
- Sentinel
- OMOP

Canada

- CNODES

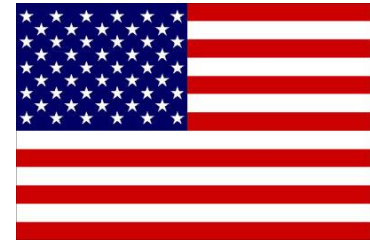
EU

- EU-ADR: www.euadr-project.org
- ARITMO: www.aritmo-project.org
- SAFEGUARD www.safeguard-diabetes.org
- PROTECT: www.imi-protect.eu
- VAESCO: www.vaesco.net
- EMIF: www.imi.europa.eu/content/emif

.....

Global

- GRIP: www.grip-network.org



Looking into the future!



8 European EHR databases
with access to 45+ million
patients from Italy,
Netherlands, UK, Germany
and Denmark

Does only size matter?



Family Matters

By Bonnie Rochman

OBESITY

Smaller Dishes Could Cut Childhood Obesity

By Bonnie Rochman @brochman | April 08, 2013 | 32 Comments

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Smaller plates, fewer calories? The latest study shows one way to fight childhood obesity may be to shrink the size of the dinner plate.

According research published in the journal *Pediatrics*, first-graders served themselves more and downed more calories when they used a large plate instead of a smaller one.

Simply advising parents — and kids — to eat less and exercise more hasn't turned the childhood obesity



Acquisizione di dati clinici in studi su banche dati

Perché?

Le informazioni nelle banche dati sanitarie

Fattore	Presente	Assente	Problema
Outcome	Registrazione evento come visita MMG, accesso in PS, causa di morte, ospedalizzazione	Data inizio sintomi/segni; validazione (miscoding); stadiazione	Outcome misclassification - bias
Esposizione	N. pezzi prescritti o dispensati, data prescrizione	Dose prescritta, compliance del paziente, OTC, farmaci di classe C, farmaci ospedalieri, integratori alimentari	Exposure miscl. and residual confounding – bias
Covariate	Comorbidità, farmaci rimborsati dal SSN e talvolta altre informazioni (esami lab., stili di vita, schede geriatriche, etc.)	Farmaci: vedi sopra Patologie: vedi sopra, severità patologia, esami laboratorio Stili di vita: dieta, fumo, alcol, esercizio fisico Status socio-economico	Residual confounding - bias

Acquisizione di dati clinici in studi su banche dati

Quali dati?

Outcome

Is outcome misclassification an issue when using EHR?



Common approach when using EHR



Common approach In SRS when using SRS (e.g. broad SMQ)

Aim

Primary objective

To explore the effect of outcome misclassification for the signal detection concerning Upper Gastrointestinal Bleeding (UGIB) in EU-ADR

Secondary objective

When using EHRs for drug safety signal detection, to evaluate the need of validation of automatically extracted events

The EU-ADR experience

Methodology - 1

Questionnaire for relevant
data collection



Validation algorithm



Manual chart review for
random sample (N=100) of
UGIB cases in 4 healthcare DBs

Electronic tool for event validation

Chameleon

Validation Upper GI Bleeding

Patient: ID : 00010001 553923800 (100510001 5539238)
Type: Upper GI Bleeding (UGIB)
Date: 06-08-2003

A) Information on characteristics and detection of UGIB

1. Was there any mention of gastrointestinal bleeding?
 2. Was there any specific mention of **upper** gastrointestinal bleeding?
 3. Was there any mention/evidence of melena/black stools/tarry stools?
 4. Was there any mention/evidence of hematemesis/blood vomiting?
 5. If the patient died: is there an explicit mention of UGIB as a cause of death?
- Is this patient a case?

Other comments:

Patie

Uplo

Exp

Down

Save

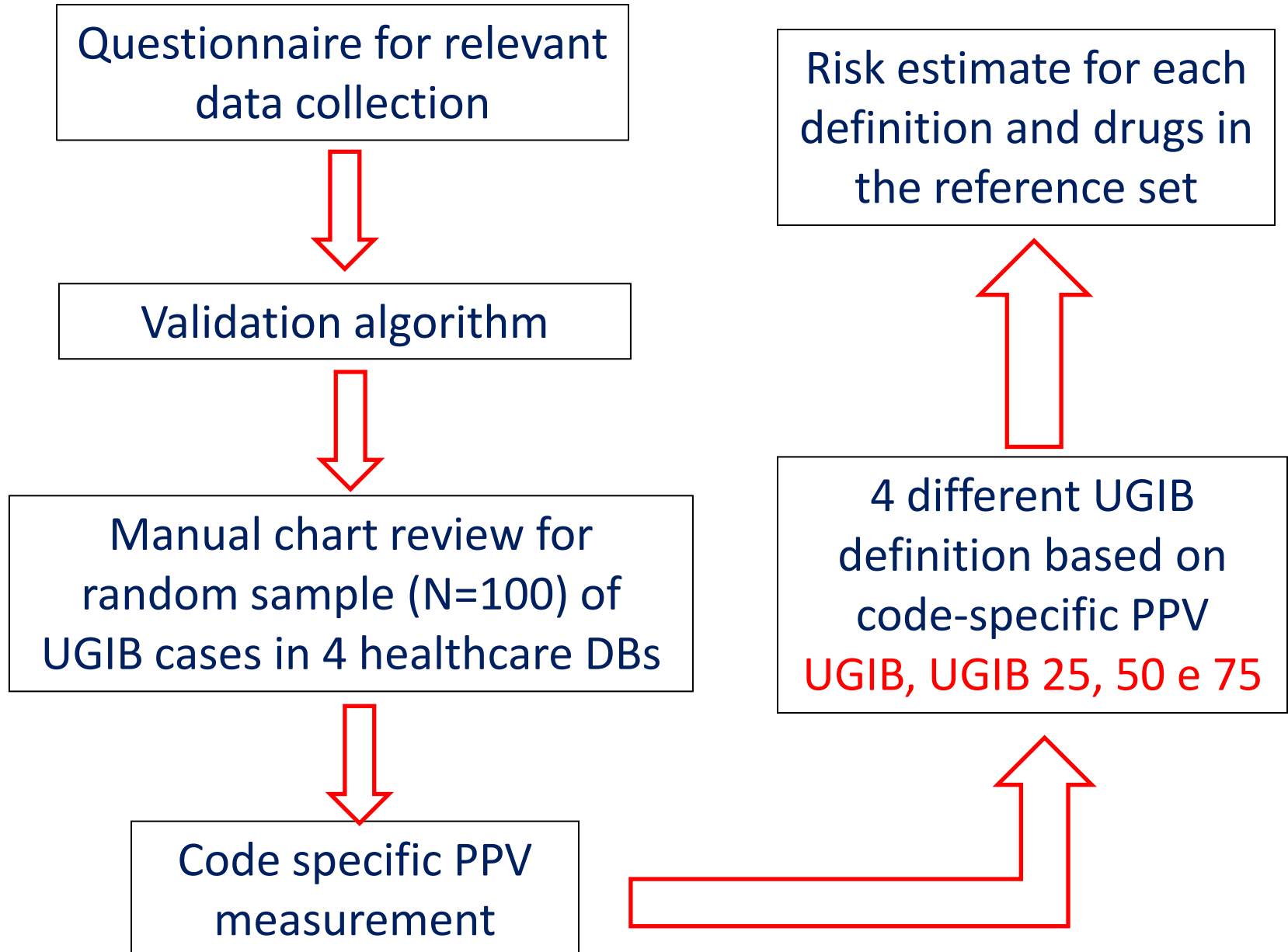
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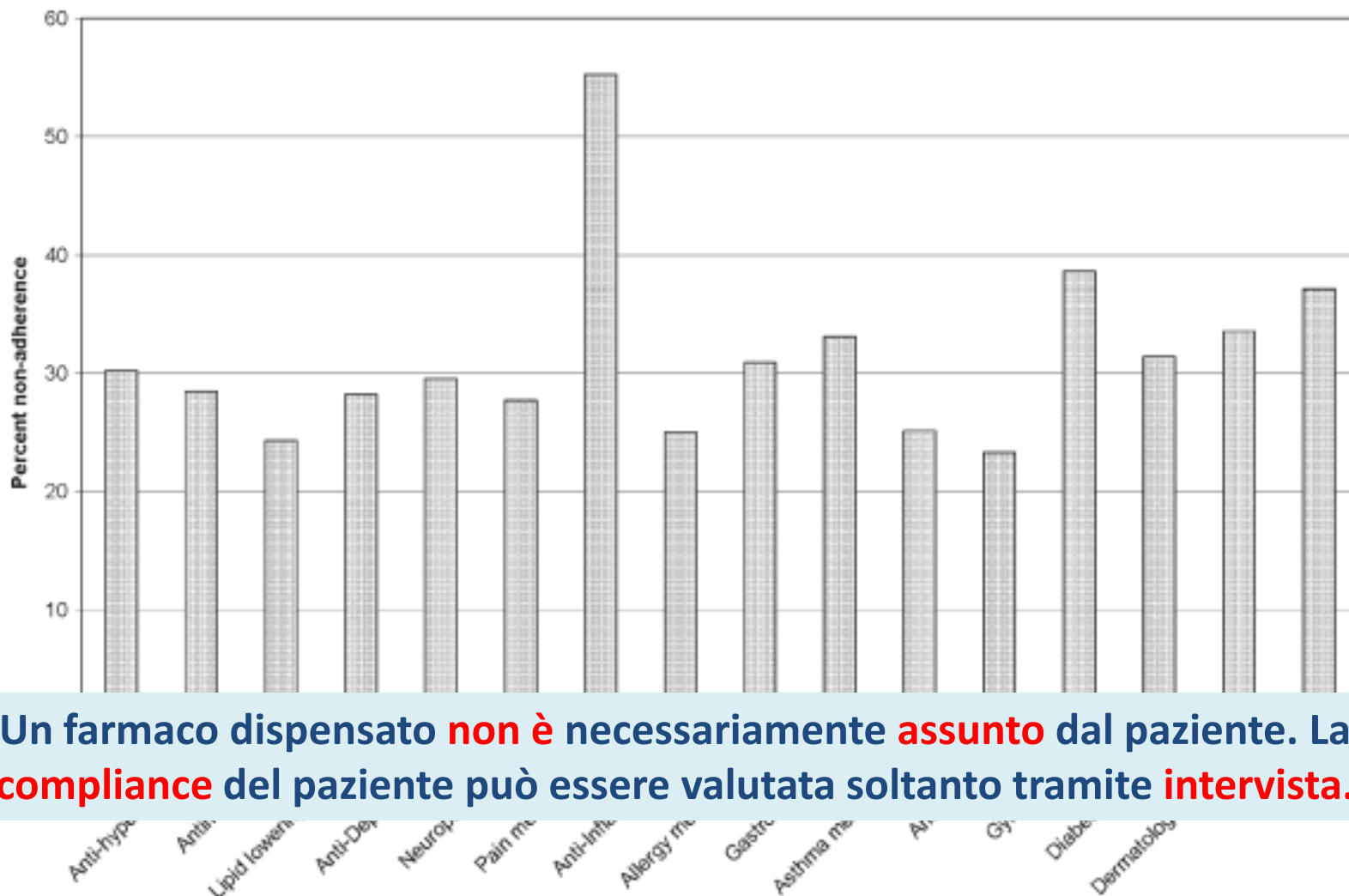
The EU-ADR experience

Methodology - 2



Esposizione

Prescription vs. Dispensing



Un farmaco dispensato **non è** necessariamente **assunto** dal paziente. La **compliance** del paziente può essere valutata soltanto tramite **intervista**.

Figure 1. Primary non-adherence to newly prescribed medications. Patients aged 19 and over.

Overexposure to NSAIDs as OTC

	Rheumatoid arthritis	Osteoarthritis
Patients' number	546	508
NSAIDs overusers (%)	216 (39.5)	240 (47)
Mean age (years) ± SD	65 ± 8 §	67 ± 11 £
Females/males	2.2	1.7
Reasons for NSAIDs overuse		
headache (%)	111 (19.5)	56 (11)
dental pain (%)	24 (4.5)	48 (9)
other reasons (%)	0 (0)	10 (2)
Not reported (%)	24 (4.5)	78 (16)
more than 1 reason (%)	57 (10)	48 (9)
Associated NSAIDs		
Prescribing NSAIDs (%)	111 (20.5)	160 (31)
Total OTC (%)	105 (19)	80 (16)
OTC ibuprofen (%)	81 (15)	60 (12)
OTC diclofenac (%)	24 (4)	20 (4)

Stimare % misclassificazione per farmaci in studio e valutare effetti su stime di rischio

Covariate

Misclassificazione

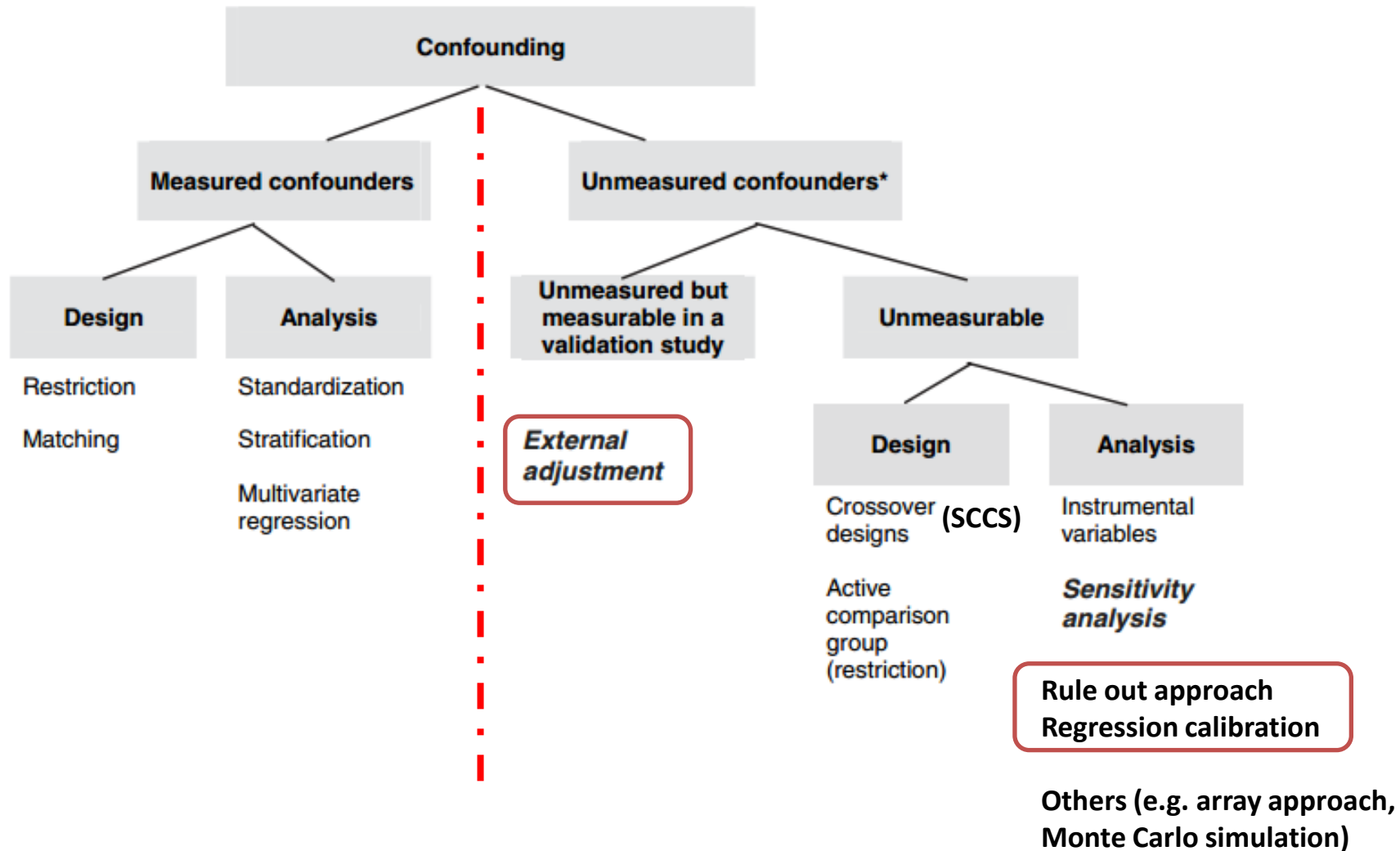
Unmeasured confounder
Unmeasurable confounder



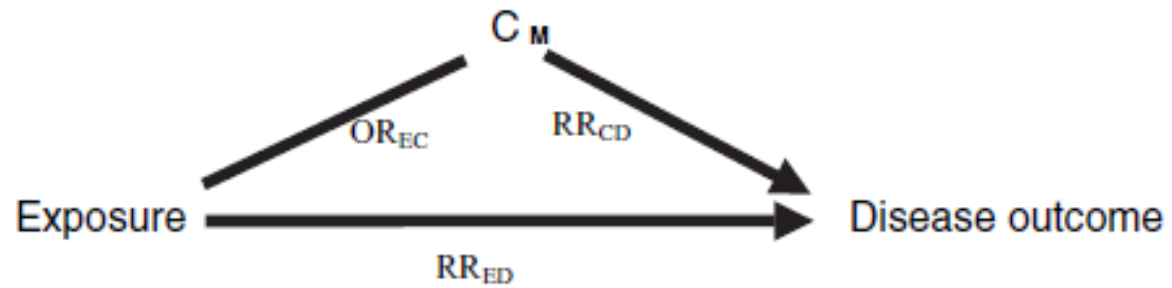
Residual Confounding

Acquisizione di dati clinici in studi su banche dati

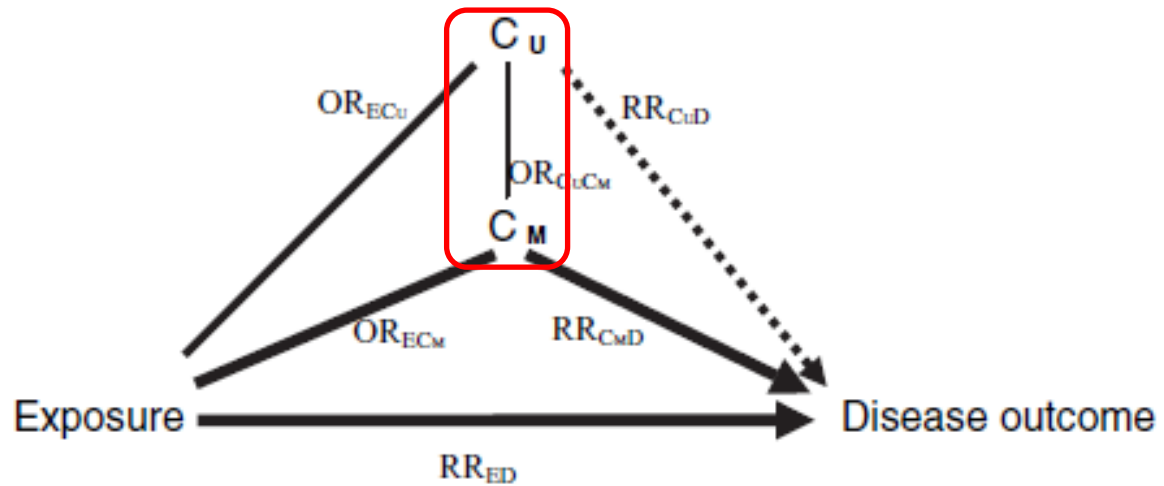
Quali tecniche di *confounding adjustment*?



(a) Measured confounding



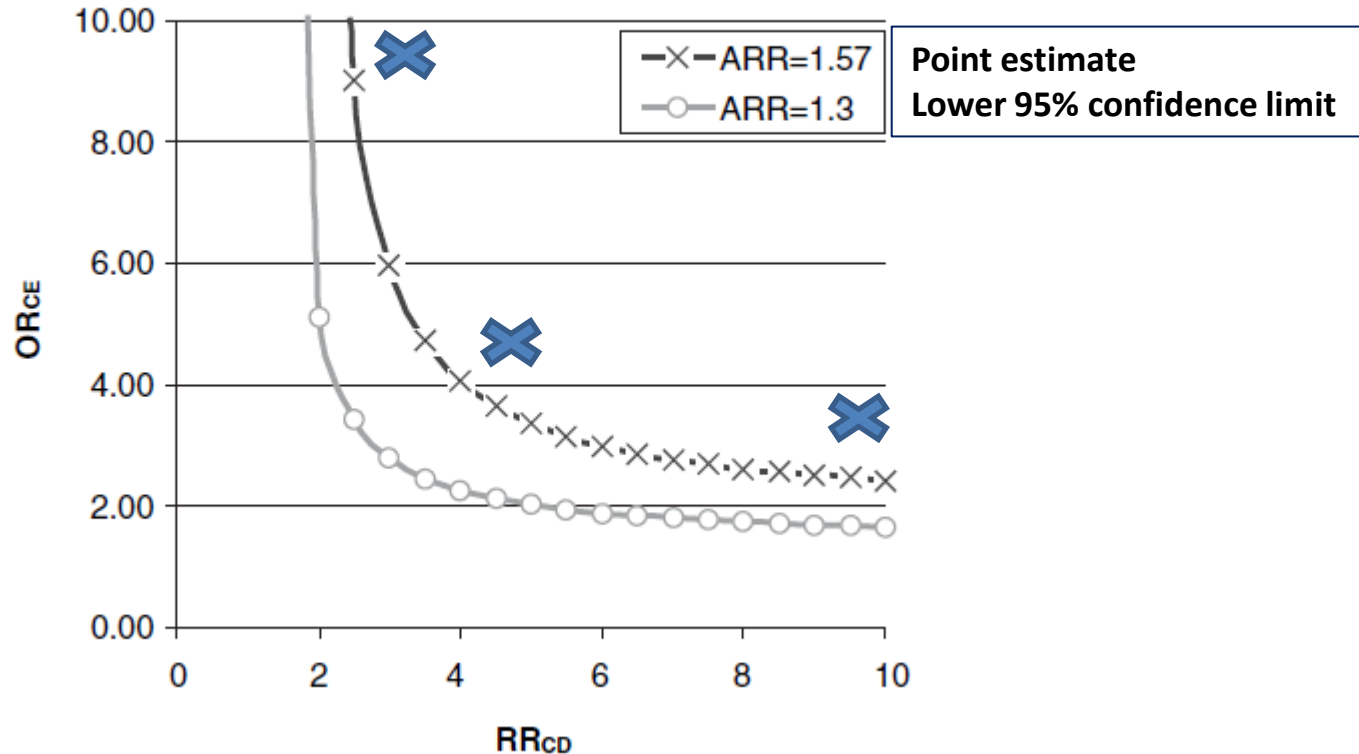
(b) Measured and unmeasured confounding



Rule out approach

(a) P_E is constant at 0.01 and P_C is constant at 0.2:*

Apparent RR= True RR* Bias



1. To find all combinations of OR_{rec} and RR_{cd} necessary to move the observed point estimate of RR to 1
2. To rule out a number of possible unmeasured confounders as they cannot be strong enough confounders to explain the observation

External adjustment - 1

- If **additional information** is available (e.g. **survey** in a sample of the main database study), adjustment for confounders unmeasured in the main study is possible;
- If internal validation study is not feasible, **external data sources** can be used under certain assumptions.
- Given estimates of **ORec** and **RRcud** for each of the unmeasured confounder, adjustment for these factors can be achieved;
- Due to limited size of validation studies, **confounder-outcome association** (RRcud) can be rarely evaluated, but can be abstracted from the **literature**.

External adjustment - 2

Table 3. COX2 external adjustment: quantitative assessment of confounding bias in relative risk estimates of the association between the selective COX-2 inhibitor rofecoxib and myocardial infarction compared with naproxen

Potential confounder Data source:	RR _{CD} literature	P _C MCBS	OR _{EC} * MCBS	RR assumed	P _E MCBS	ARR [†]	Percent bias [‡]
Obesity (BMI ≥30 kg/m ² versus <30 kg/m ²)	1.7	0.20	1.00	1.00	0.51	1.000	0.01
Aspirin use (use versus non-use)	0.7	0.10	1.60	1.00	0.51	0.987	-1.28
Smoking (current versus former/never)	3.1	0.07	0.95	1.00	0.51	0.994	-0.61
Educational Attainment (≤high school versus >high school)	2.1	0.70	0.64	1.00	0.51	0.944	-5.61
Income status (≤\$20,000 versus >\$20,000)	2.1	0.51	0.63	1.00	0.51	0.922	-7.78
Net confounding							
Sum of all negative biases:							-15.3
Weighted average:							-5.10
Sum of all positive biases:							0.01

*Age- and sex-adjusted.

[†]Apparent relative risk between exposure (COX-2 use) and MI outcome if the potential confounder was not controlled, under the assumption that the fully adjusted relative risk RR equals 1.0.

[‡]Bias = [(ARR - RR)/RR] × 100.

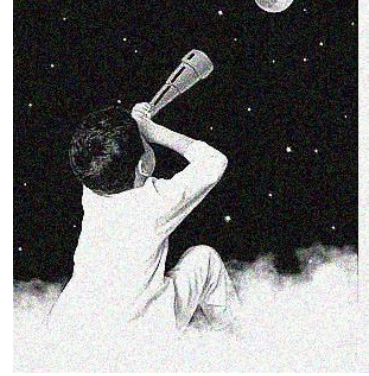
The **joint distribution** of unmeasured confounder can rarely be assessed with this approach because stable literature estimates are usually **not available** for several **confounding combinations**. A practical solution is to **sum biases estimates** of all confounders **weighted by the prevalence of each confounder** in the validation sample

Regression Calibration

- When external data are available on **multiple unmeasured confounders**, the method of propensity score calibration may be used to adjust estimates.
- Regression calibration is a statistical method for **adjusting point and interval estimates** of effect obtained from regression models for bias due to **measurement error** in assessing specific variables.
- Regression calibration is appropriate when a gold standard is available in a **validation study** and a linear measurement error with constant variance applies.

*Am J Clin Nutr 1997;65(suppl):1179
Stat Med. 1989; 8: 1051-1069.*

In prospettiva...



- ❑ **Armonizzazione** a livello Europeo della legge su tutela privacy faciliterà uso secondario delle banche dati!?!
- ❑ Comprendere ed accettare i **limiti** delle banche dati per valorizzarne al meglio le **potenzialità**;
- ❑ Scegliere con attenzione disegni di studio e tecniche di *confounding adjustment*, e se necessario e possibile, acquisire **dati clinici aggiuntivi**;
- ❑ **Integrazioni** di banche dati non solo con **dati clinici**, ma anche con “**i clinici**”!

“Il pessimista vede delle difficoltà in ogni opportunità. L’ottimista vede delle opportunità in ogni difficoltà”
Winston Churchill

Grazie per la vostra attenzione

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