

## Disclaimer

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## Why systematic reviews (in general)?

- Prevent waste in research
- Transparent overview of all relevant studies: revealing differences and shortcomings in design and conduct
- Meta-analysis (pooling) can increase the precision of the overall result
- Amount and sources of heterogeneity can be examined:
  - confirm or generate new hypotheses about relevant subgroups or impact design features
- Formulate recommendations about whether or which types of new studies to perform



UMC Utrecht

## Systematic Reviews and Meta-Analysis involving Individual Participant Data: IPD Reviews

Valentijn de Jong<sup>1,2</sup>, PhD

1. Julius Center for Health Sciences and Primary Care, UMCU
2. Data Analytics and Methods Task Force, European Medicines Agency



## Outline

- Why IPD reviews?
- What is an IPD review
- Benefits & Challenges
- Running an IPD review
- Reporting & Appraising an IPD review
- Impact of IPD

## IPD review: what is it?

### Why IPD reviews?

- Several potential advantages when IPD available
- Platinum standard of meta-analysis
- More time & effort to obtain IPD
- Specific threat: authors not providing data
- Increasingly popular
- Meta-analysis more complex
- Several recent methodological developments & remaining challenges



### What is IPD?

- Individual Patient (Participant) Data meta-analysis uses the original (raw, crude) data from individual patients to estimate summary measures of effect across studies
- Dataset: each row is an individual patient with his/her outcomes, patient characteristics (like in the original study), and added study characteristics like design, intervention features
- Data from different studies are stacked



### Aggregate data (AD) reviews

- Traditional reviews are based on published summary (aggregate) data from individual (primary) studies
- Dataset: one row per included study with the effect measure, its precision and study characteristics (design features, summary patient characteristics like % male, mean age)



# Similarities IPD and AD review

- Scientific enterprise
- Key review steps similar:
  - frame focussed review questions
  - systematic search to identify all relevant studies
  - appraise methodological quality included studies
  - sound statistical models to obtain pooled estimates, to assess heterogeneity and to perform meta-regression
  - complete, accurate and informative reporting

- IPD requires an International collaborative effort



# Potential benefits IPD review [1]

Having a collaborative group of dedicated researchers may improve:

- Trial inclusion:
  - supplement published & unpublished studies
  - discuss and apply consistent eligibility criteria
- Data quality and integrity:
  - include unreported data like excluded patients, more outcomes (reduce outcome reporting bias), longer FU
  - standardize outcome definitions and patient characteristics across studies
  - check integrity of data and query investigators



# Data structure IPD meta-analysis

Example of individual participant data from 10 hypertension trials that assess effect of treatment versus placebo on systolic blood pressure

Study ID	Patient ID	Age (years)	Sex (1=male, 0=female)	Treatment group (1=treatment, 0=control)	Systolic blood pressure (mm Hg)	
					pressure before treatment	pressure after treatment
1	1	46	1	1	137	111
1	2	35	1	0	143	133
...	...	...	...	...	...	...
1	1520	62	0	0	209	219
2	1	55	0	1	170	155
2	2	38	1	1	144	139
...	...	...	...	...	...	...
2	368	44	1	0	153	129
3	1	51	1	1	186	166
3	2	39	0	1	201	144
...	...	...	...	...	...	...
3	671	54	0	0	166	141
...	...	...	...	...	...	...
10	1	71	0	1	149	128
10	2	59	1	0	168	169
...	...	...	...	...	...	...
10	978	63	0	1	174	128

Dotted line indicates where non-displayed rows of data occur.

Hypothetical data based on Wang et al.<sup>27</sup>



# IPD Reviews: Overview of Potential Benefits

## Potential benefits IPD review [3]

Having the IPD may improve and expand:

- Analysis:
  - derive measures of effect directly from IPD
  - use consistent unit and method of analysis
  - handling missing data in a uniform way
  - check validity of assumptions
  - more detailed analysis for time-to-event data
  - greater validity and power to examine interactions with patient-level covariates (effect modification, subgroup analysis)
  - conduct more complex analyses (modelling)
  - use IPD for secondary questions like building prognostic models from RCT data



## Potential benefits IPD review [2]

Collaborative group of dedicated researchers may improve:

- Risk of bias assessment:
  - clarify trial design & conduct within IPD group
- Interpretation of results:
  - discuss the limitations & implications among the multidisciplinary group
- Designing new trials



## Why not IPD: Drawbacks

- Obtaining the data (ethical and privacy issues), cleaning and recoding takes time and effort
- IPD meta-analysis requires more statistical expertise
- Researchers may decide not to share their data which could generate distorted results (availability bias next to publication bias):
  - combine IPD and summary data into one meta-analysis?



## IPD Reviews: Potential drawbacks & Challenges

TABLE 2  
Factors That May Influence the Systematic Review Approach

When Individual Patient Data May Be Beneficial	When Individual Patient Data May Not Be Beneficial
Poor reporting of trials: Information inadequate, selective, or ambiguous	Detailed and clear reporting of trials (CONSORT quality)
Long-term outcomes	Short-term outcomes
Time-to-event outcome measures	Binary outcome measures
Multivariable or other complex analyses	Univariate or simple analyses
Differently defined outcome measures	Outcome measures defined uniformly across trials
Subgroup analyses of patient-level characteristics important	Patient subgroups not important
Individual patient data available for high proportion of trials/individuals	Individual patient data available for only a limited number of trials

From: Stewart LA, et al. *To IPD or not to IPD: Evaluation & the Health Professions* 2002



## AD vs IPD: when results different?

- No or small differences when same underlying data and focus on single summary estimate
- Differences may arise through:
  - other underlying data (more or less studies / patients, longer follow-up, consistent in- and exclusion, quality check)
  - standardization of outcomes & variables
  - uniform approach to missing values
  - same analysis approach
  - more flexibility and higher validity when examining subgroup effects



## Running an IPD review

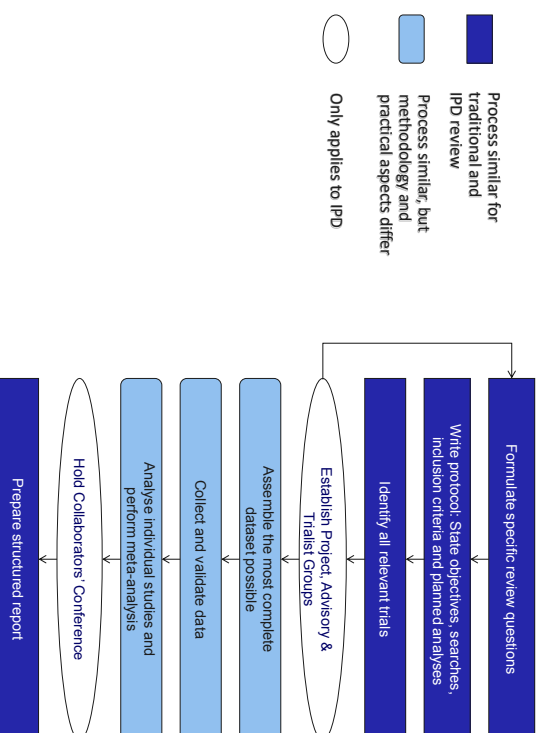
- International collaborative effort:
  - small management group
  - advisory group
  - trialists who provide data
- Project leader / initiator:
  - expert in the field
  - performed at least one relevant trial
- Most effort is required to establish and maintain collaboration and process data
- Least problematic area might be the analysis itself



## Running an IPD review

## Establishing & maintaining collaboration

- Initial letter inviting collaboration should explain:
  - main aims and objectives
  - importance of the collaborative group
  - publication policy
  - confidentiality of data
  - offer an official agreement
- Ask for trial protocol, questionnaires etc.
- If necessary, arrange a meeting



## Which trial level data to collect

- Data to adequately describe the trial:
  - trial ID and title
  - randomisation method
  - method of allocation concealment
  - planned treatments
  - recruitment and stopping information
  - information that is not clear from trial report



## Formal protocol

- Design a review (IPD meta-analysis) with the same rigour as a primary study
- Write a protocol:
  - Specify rationale & main review questions
  - Specify a priori(?) hypotheses and methods
  - Register protocol (PROSPERO, but also see osf.io)
  - Increase transparency & streamline discussions



**Which IPD to collect: all patients**

- Investigators in primary studies frequently exclude patients from analyses:
  - legitimate reasons to exclude certain participants
- Collect data on excluded patients and reasons:
  - ineligibility, protocol violation, missing outcome data, withdrawal, 'early' outcome
- Allows analyses:
  - as done in original studies
  - all participants by intention to treat
  - applying exclusion criteria consistently across studies

[illegible]

# Reporting & Appraising an IPD review



## Which IPD to collect: variables

- What variables are required for your analysis?
- What do you need to adequately describe trials?
- Publications can indicate:
  - which variables will be present
  - but more data may be collected than reported
- Provide a provisional list of planned variables in protocol/form to establish feasibility



## Reporting IPD review

- PRISMA checklist +
  - if trialists identified extra studies
  - inclusion criteria applied at trial or patient level
  - if data on unreported outcomes were obtained
  - methods for checking the integrity of IPD and reporting of findings (might be sensitive)
  - exploring variation in treatment effect
  - many modifications in wording
- Leading to a specific extension: PRISMA-IPD

Stewart et al. Preferred Reporting Items for a Systematic Review and Meta-analysis of Individual Participant Data  
The PRISMA-IPD Statement. JAMA 2015



## Presenting and publishing results

- Project management group draft presentation / report with input from Advisory Group
- Circulate to all collaborators for comment once, twice, ...
- Summarise and respond to comments
- Achieve consensus
- On behalf of collaborative group:
  - Present at conference
  - Submit to journal



## Impact of IPD

## Appraisal of IPD review: key questions

AMSTAR 2: critical appraisal tool for systematic intervention reviews (Not specific to IPD) *BMJ* 2017;358:j4008

*Tierney et al. Individual Participant Data (IPD) Meta-analyses of Randomised Controlled Trials: Guidance on Their Use. PLOS Medicine* 2015 :

1. Is the IPD meta-analysis part of a systematic review?
2. Were all eligible trials identified?
3. Were IPD obtained for most trials?
4. Was the integrity of the IPD checked?
5. Were the analyses pre-specified in detail?
6. Was the risk of bias of included trials assessed?
7. Were the methods of analysis appropriate?
8. Does the report adhere to the PRISMA-IPD statement?





## Impact IPD review on trial design & analysis

- Trials design:
  - collaboration IPD group continues into new trial
  - choice of comparator
  - defining the population
  - determining sample size & further recruitment
- Trial analysis:
  - prognostic model from IPD to stratify new patients
  - choice of subgroup analysis
  - stopping ongoing trials

*Tieney J et al. How individual participant data meta-analyses have influenced trial design, conduct, and analysis. J Clin Epidemiol 2015*



## IPD use and uptake

- Descriptive study of uptake of 33 IPD reviews in 177 matching clinical guidelines
- Findings:
  - 37% of the guidelines cited the IPD review
  - reasons for not citing unclear for the vast majority of guidelines
  - if used, one third of these guidelines critically appraised the IPD review



*Voie et al. Uptake of systematic reviews and meta-analyses based on individual participant data in clinical practice guidelines: descriptive study. BMJ 2016*

## Summary

## Prospective meta-analysis (PMA)

- PMA is a meta-analysis of studies identified and determined to be eligible before the results of any of those trials became known
- Benefits:
  - hypotheses to be specified really a priori
  - a priori statements of intended (subgroup) analyses before looking at the data
  - prospective application of selection criteria
  - opportunities to standardise
  - often collect individual participant data

Next-generation systematic reviews:  
prospective meta-analysis,  
individual-level data, networks  
and umbrella reviews  
*John Ioannidis*



## To IPD or not to IPD

- Considerable investment of time & effort
- Potential benefits IPD meta-analysis:
  - use of additional data, in particular longer follow-up, other outcome data
  - check integrity of data
  - standardization across studies to repair inconsistencies in outcomes, effect measures, adjustment, subgroup definition, handling of missing values, etc
  - subgroup analysis: more flexibility & higher validity & more power
- IPD no cure for poorly designed studies



## Indirect benefits IPD

- Improve trial identification & interpretation through collaborative approach
- IPD results better incorporated in guidelines
- Collaboration can lead to and improve the design of future studies
- Improve methods for IPD and other evidence synthesis approaches:
  - use IPD as resource for research into bias, analysis methods, eg. how to impute missings (Koopman et al, Am J Epidemiol 2008)

