

# CAUSALITY IN GUIDELINES

Causal language use and assumptions in clinical  
practice guidelines: evaluation of causality

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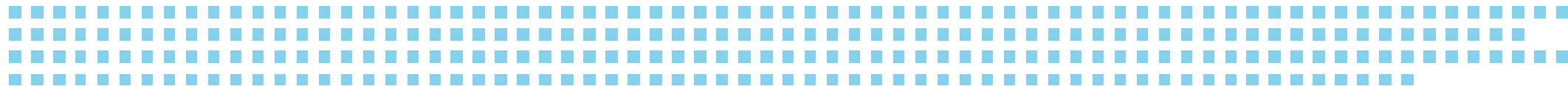
Supvr.: Dr. Jeremy Labrecque

Presentation of research proposal

# ABOUT ME

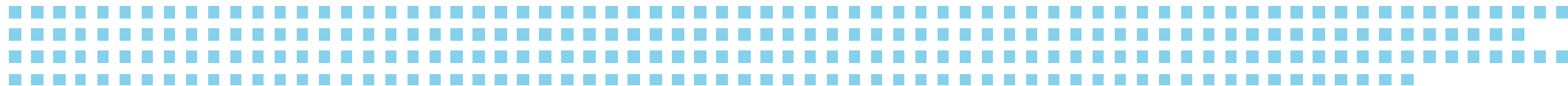
- First-year research master student
- Area of interest:
  - Causal inference
  - Endocrinology & Metabolism
  - Transgender health
  - Qualitative research

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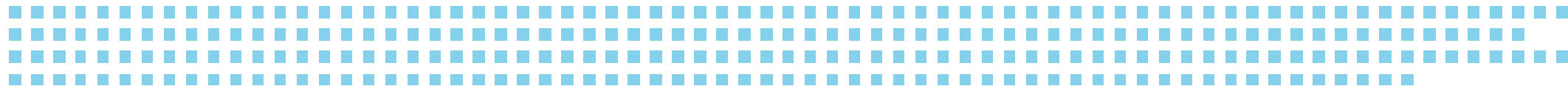
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1. Background: Causal statements in clinical guidelines
2. Aims
3. Material & Methods
4. Time schedule



# BACKGROUND

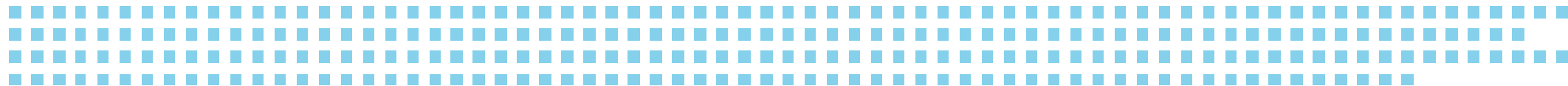
Causal statements in clinical guidelines: what, where, why, how?

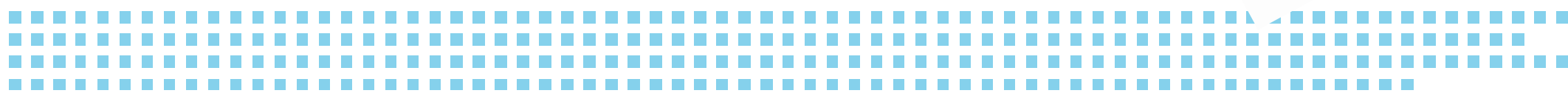
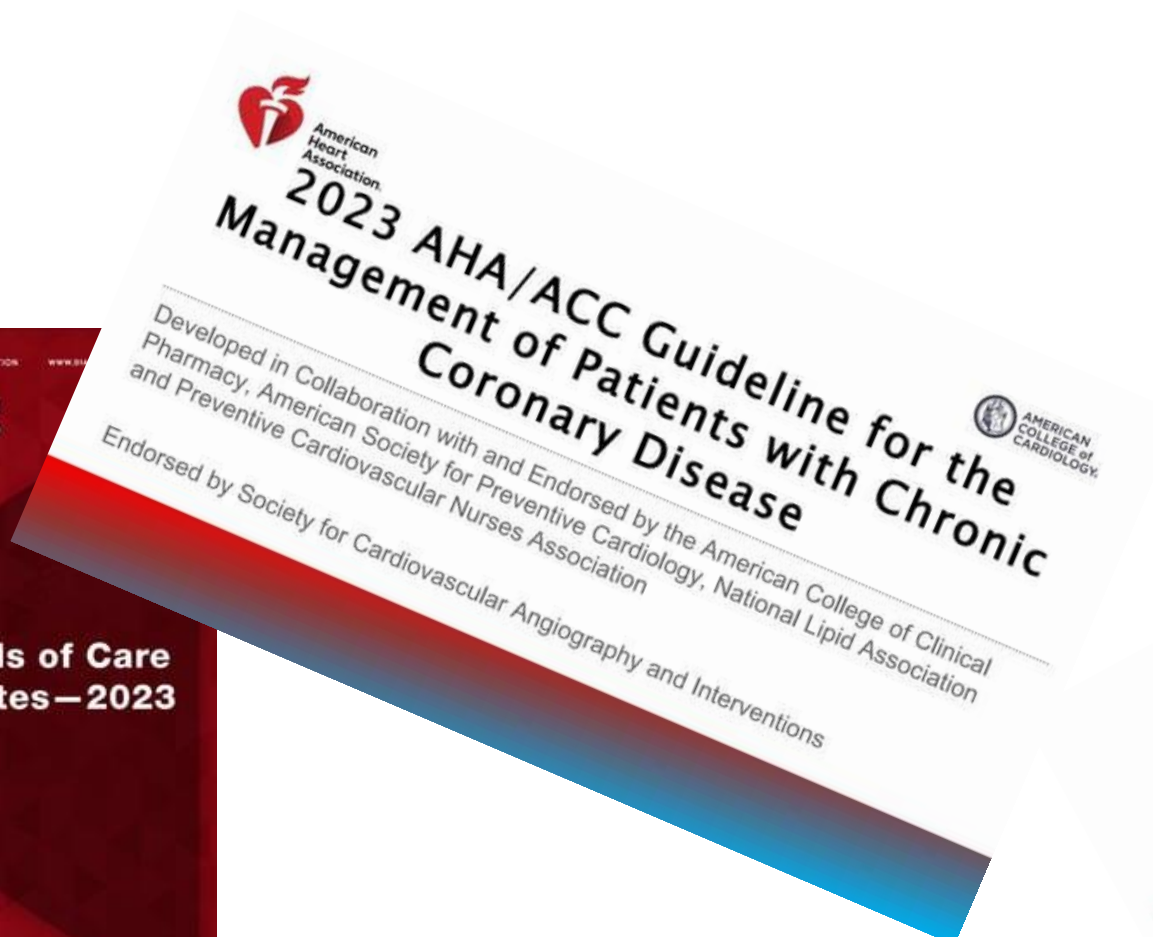
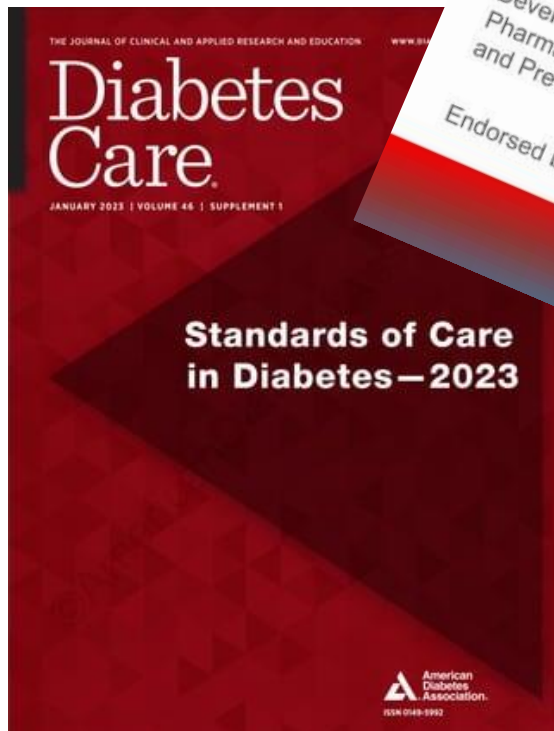


# BACKGROUND

## Clinical practice guidelines

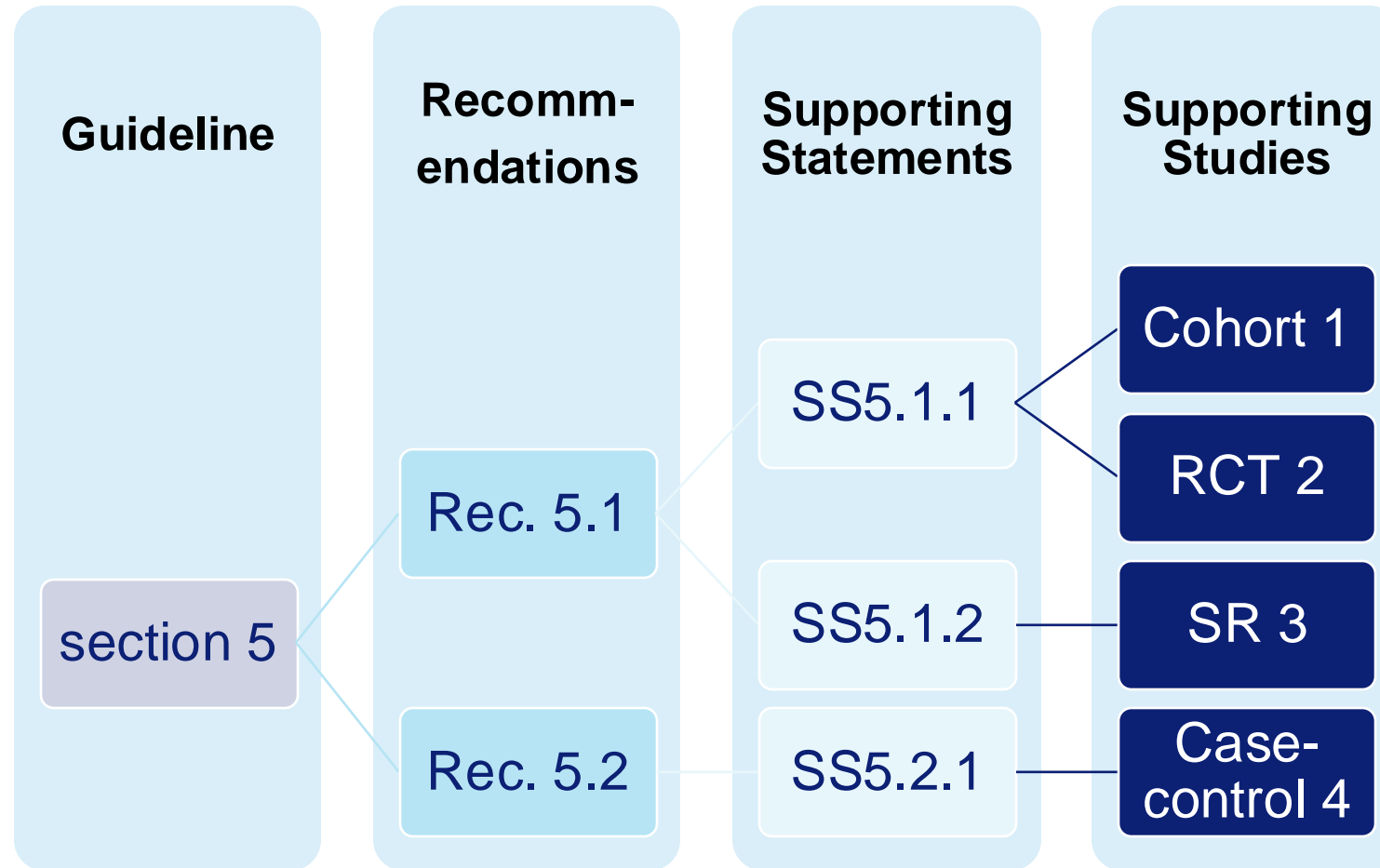
- Clinical practice guideline (CPG):
  - “a set of **statements** that include **recommendations** intended to optimize patient care that are informed by a systematic review of evidence and an assessment of the **benefits and harms** of alternative care options”
- “Clinical practice guidelines are ubiquitous in our healthcare system.” (1)
- Most real-world clinical practices **are ruled by** CPGs to date!
  - from cold and flu to cancers





# BACKGROUND

What does a guideline look like?



# BACKGROUND

## Causation in guidelines

- Recommendations attempt to **inform clinical practice**, and contain causal statements about **treatment effect**, benefits and harms, care strategy selection, etc.
- Supporting statements also contain causal language.





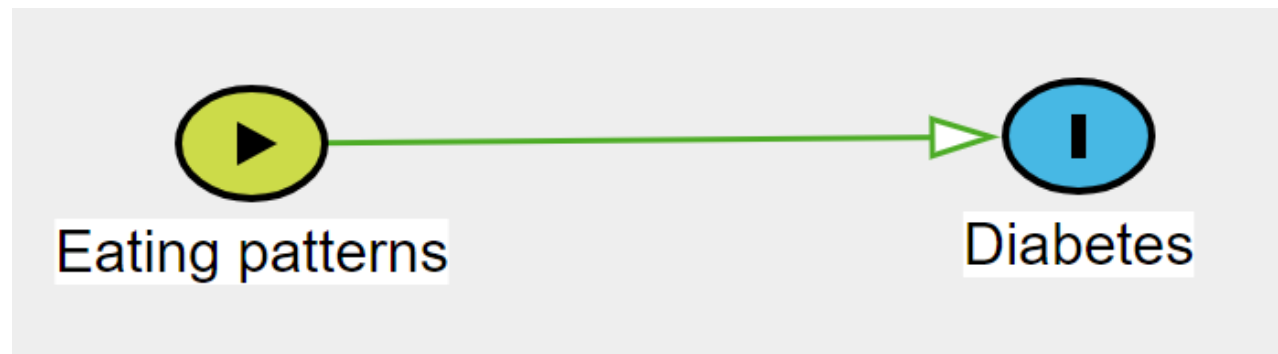
# BACKGROUND

## Causation in guidelines

- Example:

### Recommendation 3.3 (ADA Diabetes SoC 2023)

A variety of eating patterns can be considered to prevent diabetes in individuals with prediabetes. **B** <sup>(2)</sup>



$A$   $\longrightarrow$   $\gamma^a$

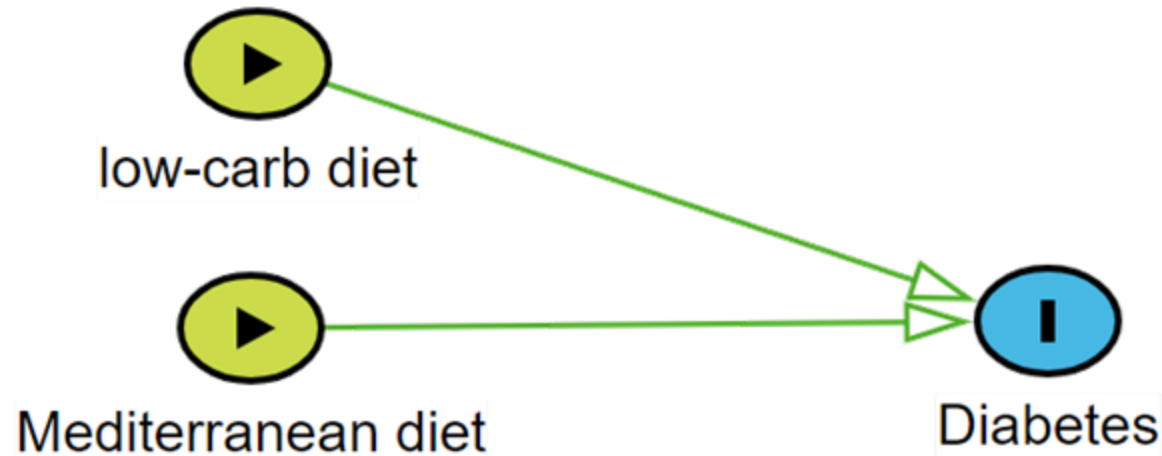
# BACKGROUND

## Causation in guidelines

- Example:

### Supporting statement for Recommendation 3.3

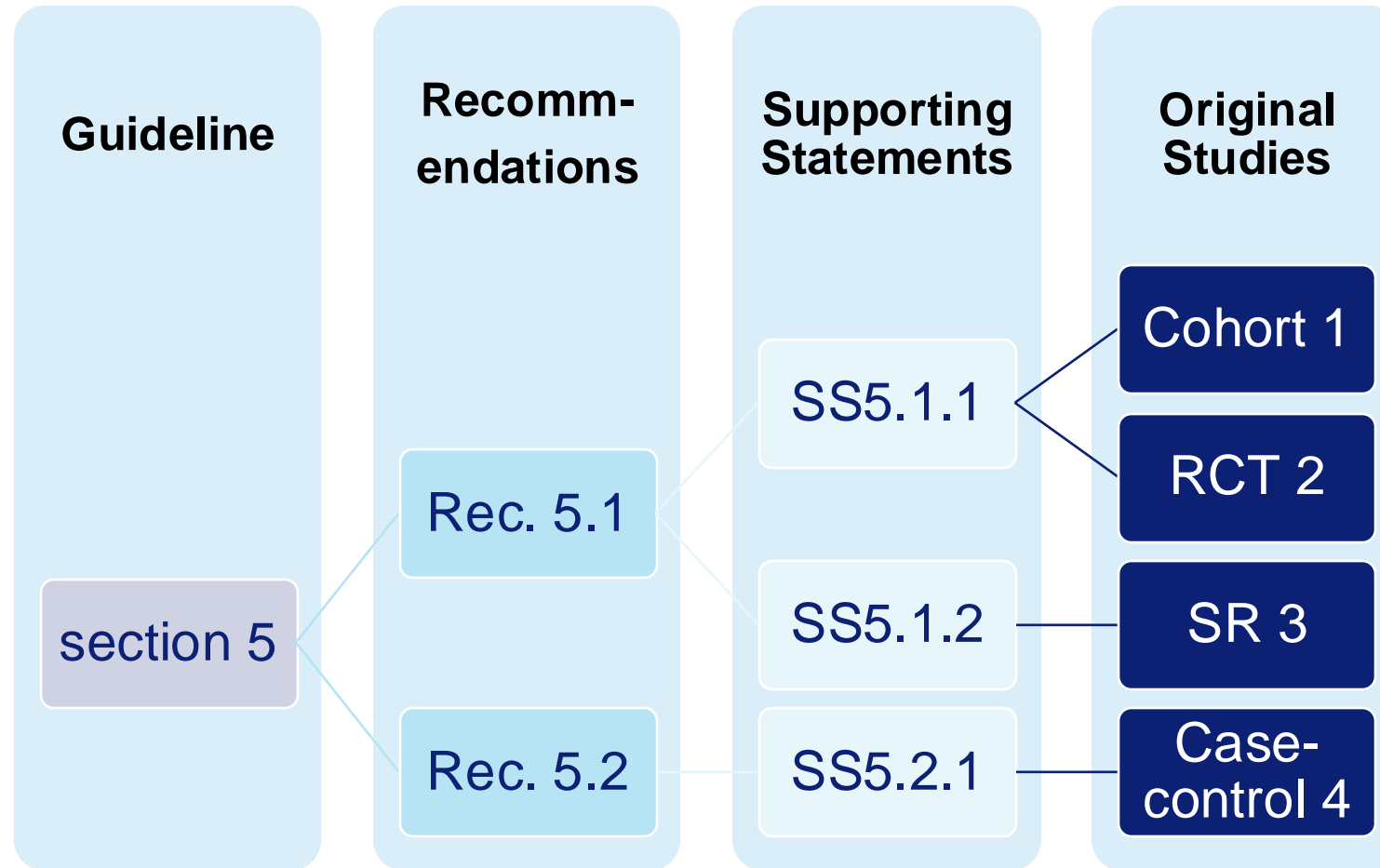
Based on other intervention trials, a variety of eating patterns... may also be appropriate for individuals with prediabetes (10), including Mediterranean-style and low-carbohydrate eating plans (12–15).<sup>(2)</sup>



# BACKGROUND

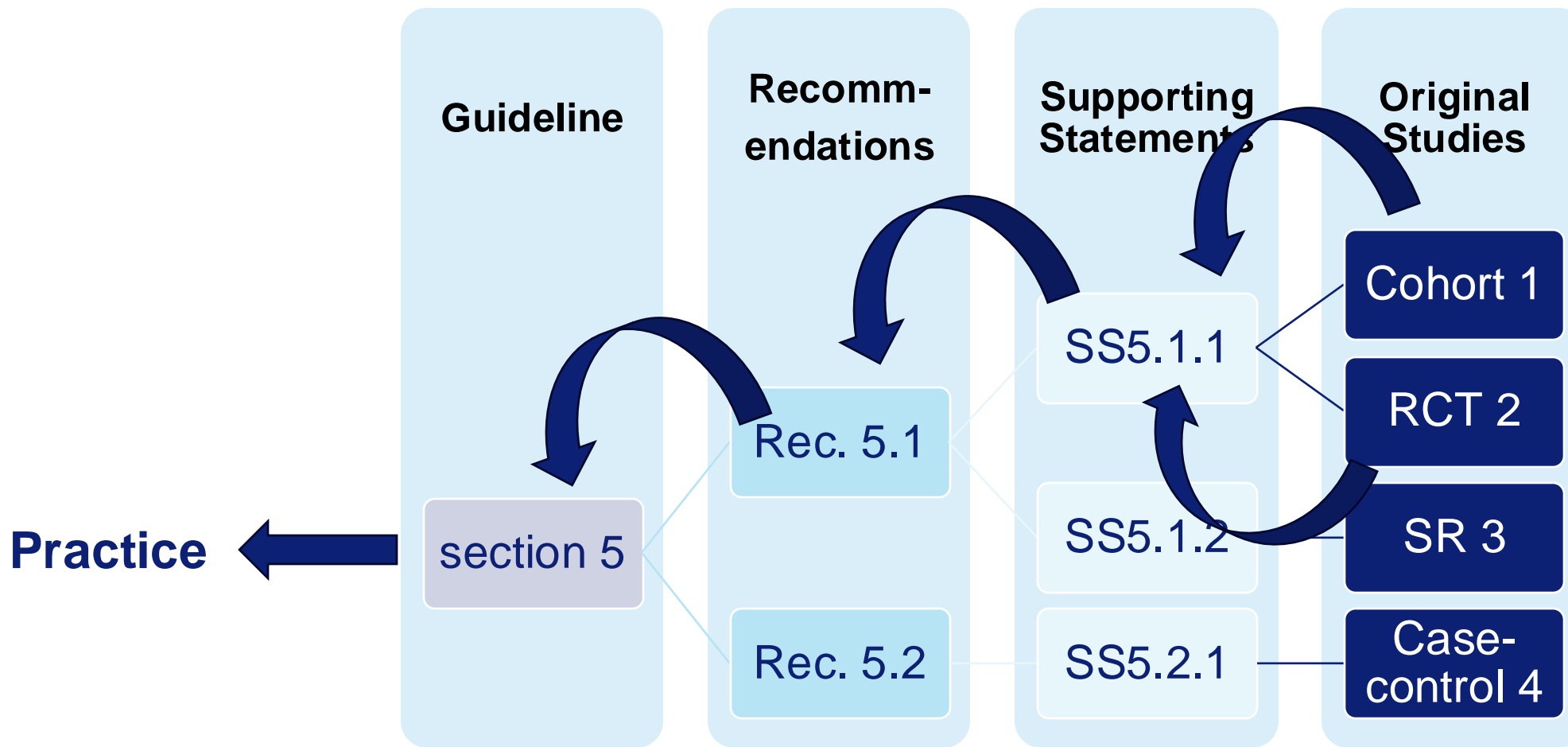
## Evidence passing

Practice

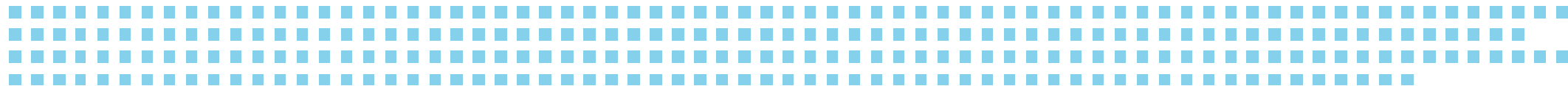


# BACKGROUND

## Evidence passing

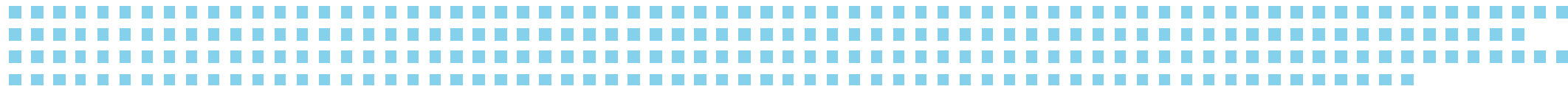


**Therefore, if a recommendation statement is causal, this causation should come from...**

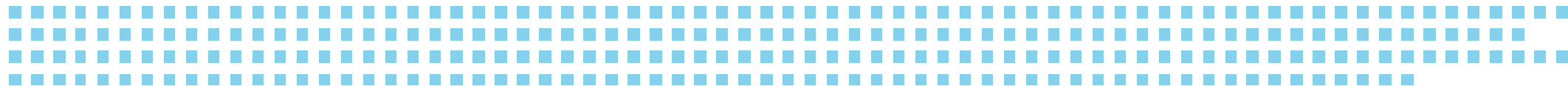


**Therefore, if a recommendation statement is causal, this causation should come from...**

**Original studies!**



**However...**



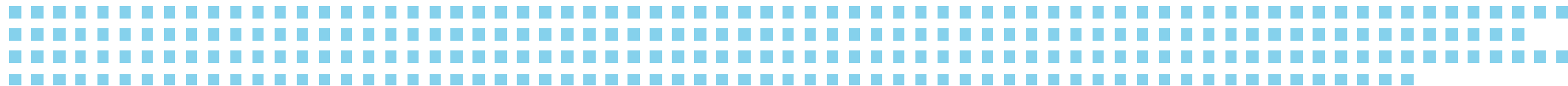
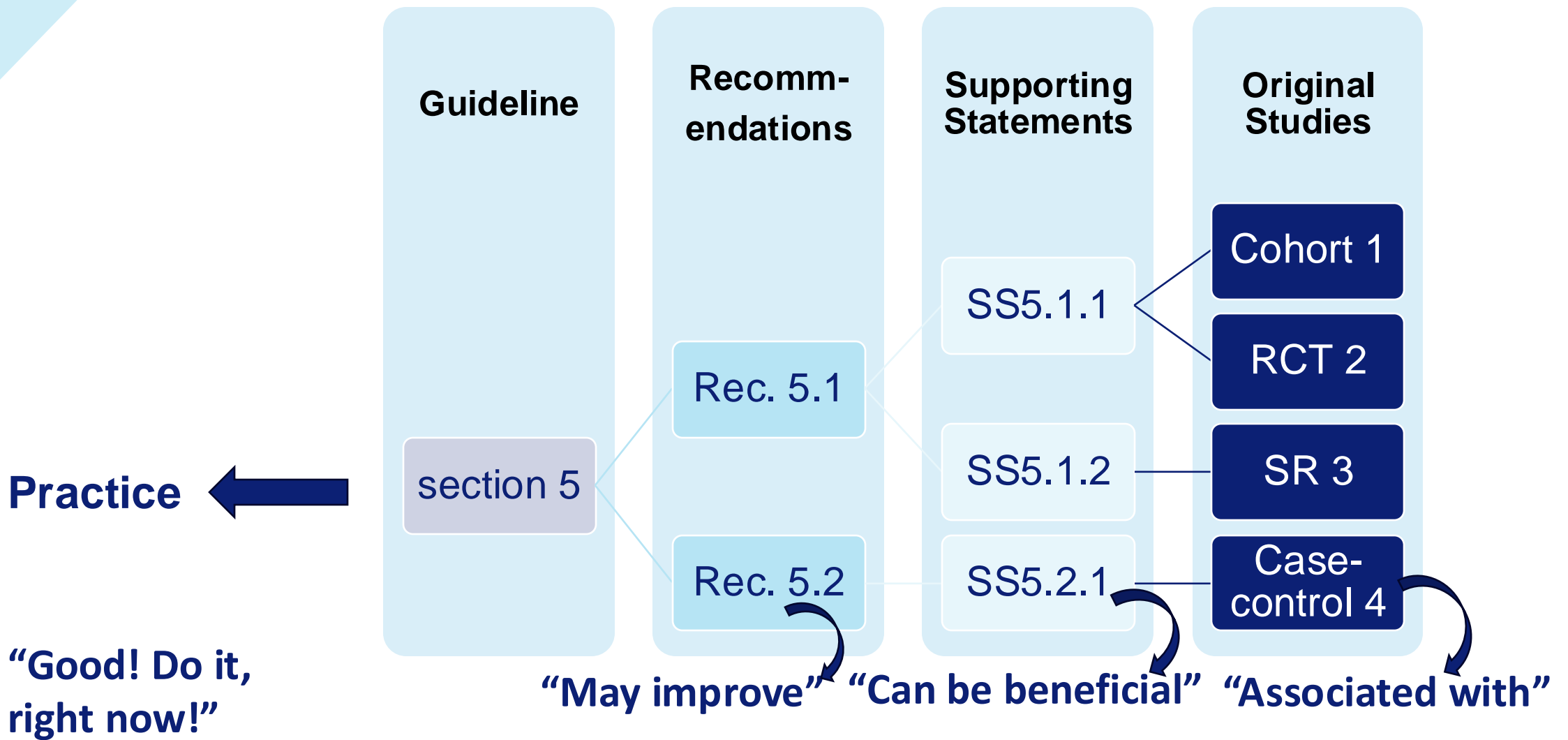
# BACKGROUND

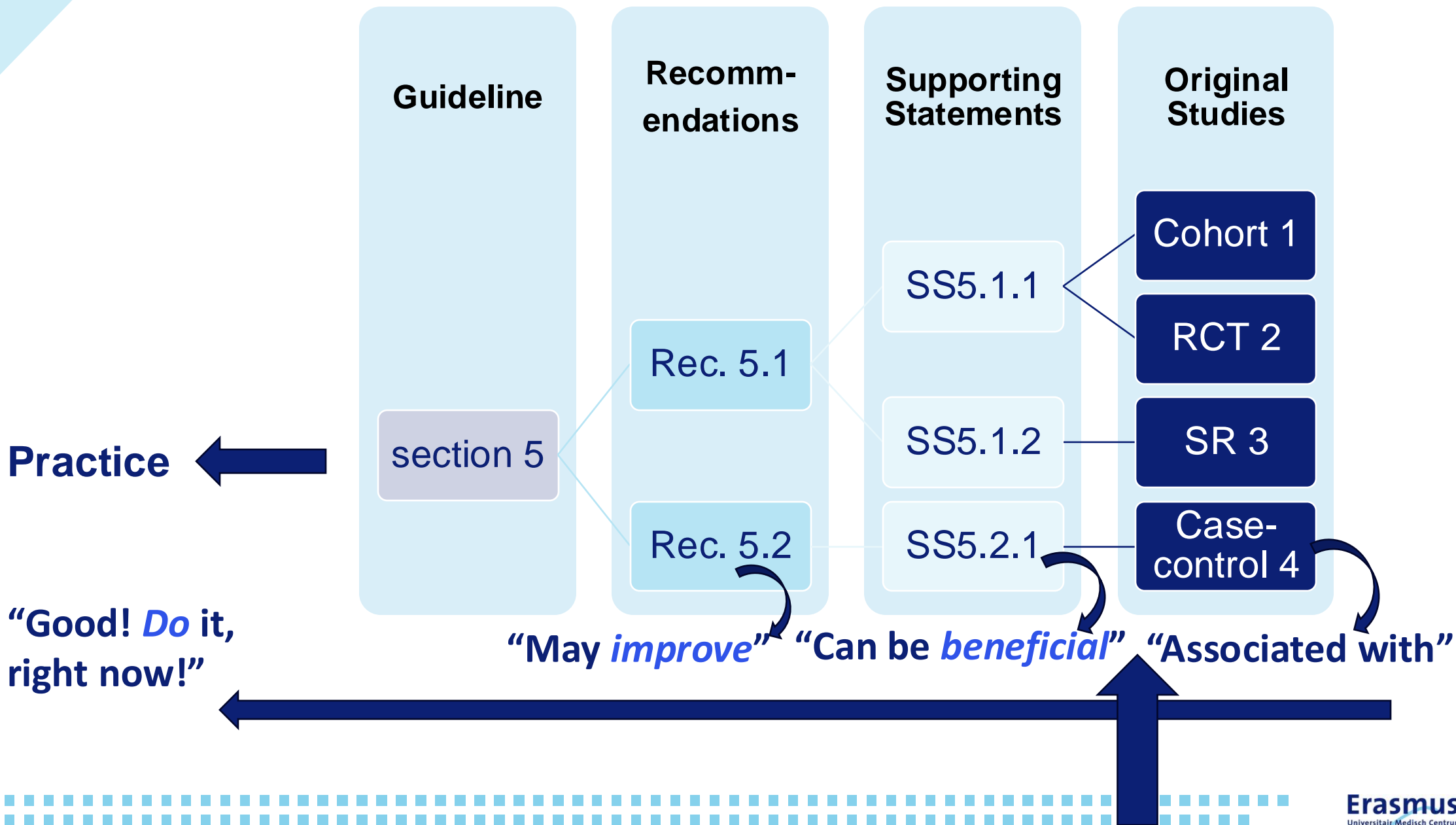
Causation jump

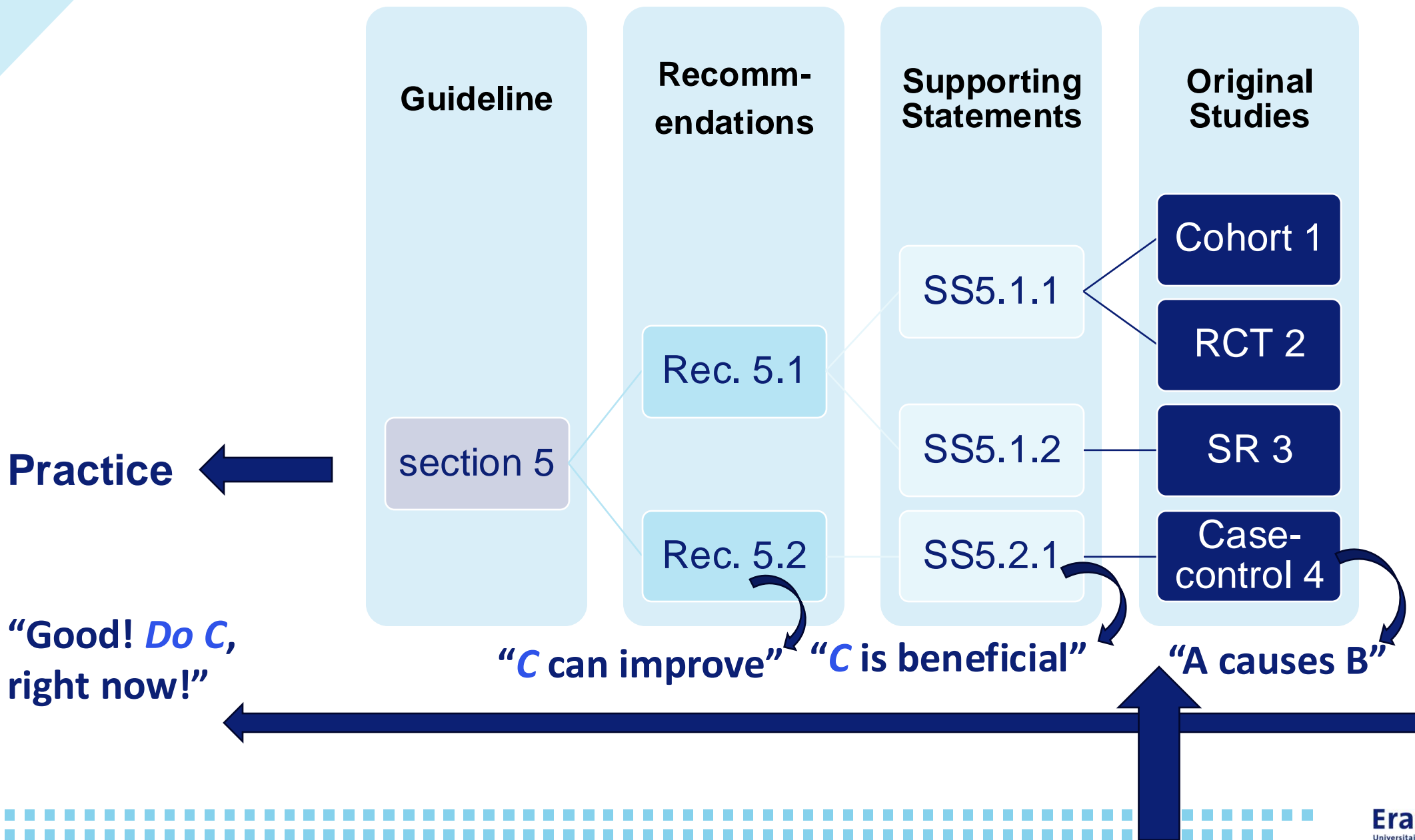
Causation *jump*...









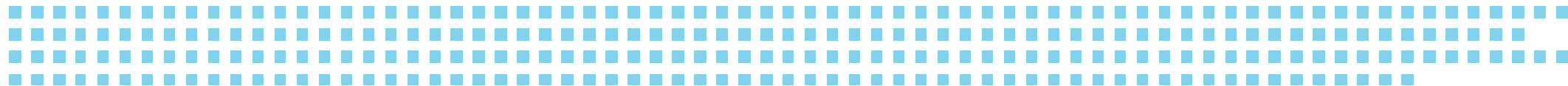


# BACKGROUND

## Causation jump

- Example: (ADA diabetes SoC 2023 Sec. 5)<sup>(2)</sup>

**Original study:** *For every kilogram of weight loss, there was a 16% reduction in risk, adjusted for changes in diet and activity.*



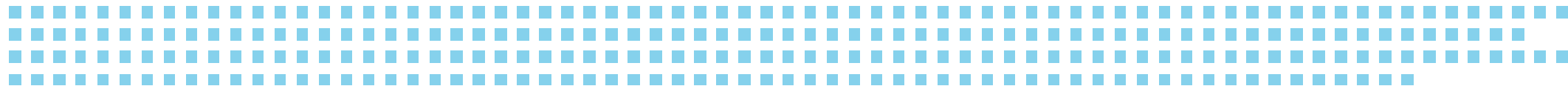
# BACKGROUND

## Causation jump

- Example: (ADA diabetes SoC 2023 Sec. 5)<sup>(2)</sup>

**Original study:** *For every kilogram of weight loss, there was a 16% reduction in risk, adjusted for changes in diet and activity.*

**Supp. Statements:** *In prediabetes, the weight loss goal is 7–10% for preventing progression to type 2 diabetes. (???)*



# BACKGROUND

## Causation jump

- Example: (ADA diabetes SoC 2023 Sec. 5)<sup>(2)</sup>

**Original study:** *For every kilogram of weight loss, there was a 16% reduction in risk, adjusted for changes in diet and activity.*

**Supp. Statements:** *In prediabetes, the weight loss goal is 7–10% for preventing progression to type 2 diabetes. (???)*

**Recommendation:** *For all people with overweight or obesity, behavioral modification to achieve and maintain a minimum weight loss of 5% is recommended.*



# BACKGROUND

## Our interest

- ***Evaluate the use of causal language*** both in guideline recommendations and in underlying original studies.
- Check sentences in guidelines → check original studies;



# BACKGROUND

## Our interest

- ***Evaluate the use of causal language*** both in guideline recommendations and in underlying original studies.
- Check sentences in guidelines → check original studies;  
*“Is causation adequately passed down without jumps?”*

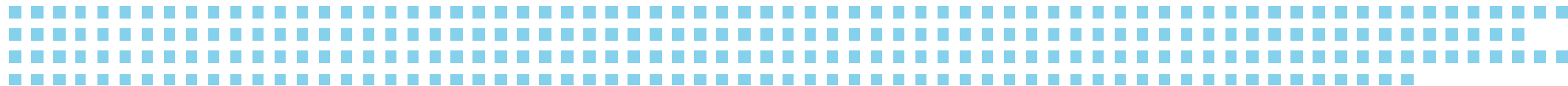




# BACKGROUND

## Our interest

- ***Evaluate the use of causal language*** both in guideline recommendations and in underlying original studies.
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- Check original studies → check causal assumptions made.



# BACKGROUND

## Our interest

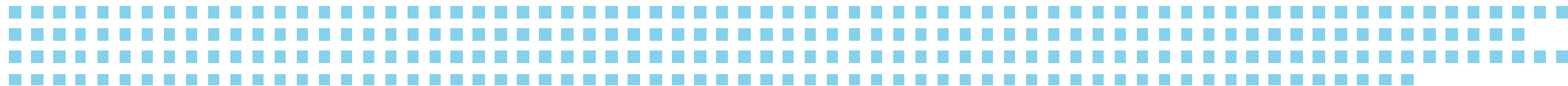
- ***Evaluate the use of causal language*** both in guideline recommendations and in underlying original studies.
- Check sentences in guidelines → check original studies;
- Check original studies → check causal assumptions made.

*“Do causal statements come with necessary assumptions in original studies?”*





# AIMS

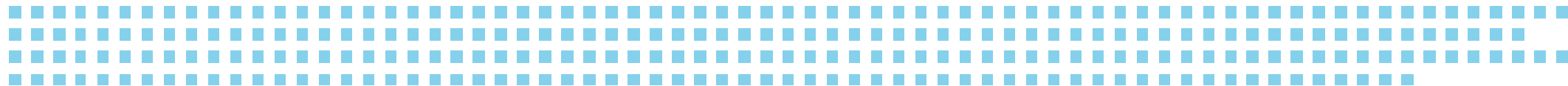


# AIMS

- 1. How different is the language with respect to causality different between the recommendations and the original studies?
- 2. How often are causal assumptions mentioned in the original studies, and how are their reporting quality?
- 3. How many statements in guidelines are causal or implying causation?

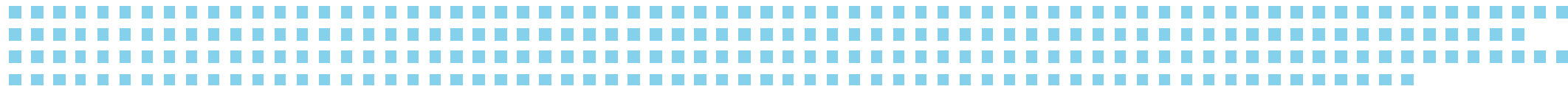
# MATERIAL & METHODS

All you want to know about our study...



## Material & Methods

- Study design
- Data source
- Eligibility criteria
- Data selection
- Data extraction
- Data analysis
- Evidence synthesis



# MATERIAL & METHODS

## Study design

- Scoping review
- Semi-systematic approach for data source
- Will register *a priori* at OSF (Open Science Framework)



Select guidelines and eligible recommendation parts

Sample sentences and rate for sentences

Extract original studies; if causal, rate for causation and check causal assumptions

Check differences

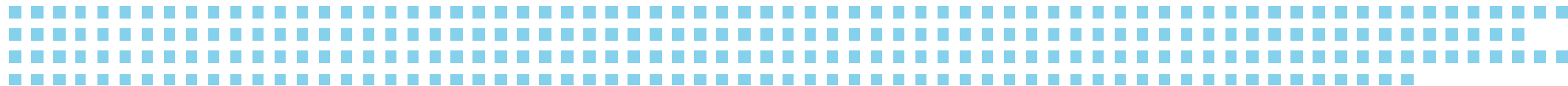
Reporting



# MATERIAL & METHODS

## Data source

We want a semi-systematic approach to pick guidelines out...



# MATERIAL & METHODS

## Data source

We want a semi-systematic approach to pick guidelines out...

We want to pick the most important ones...



Global disease burden, DALYs (6)

Global  
Both sexes, All ages, 2019, DALYs attributable to All risk factors

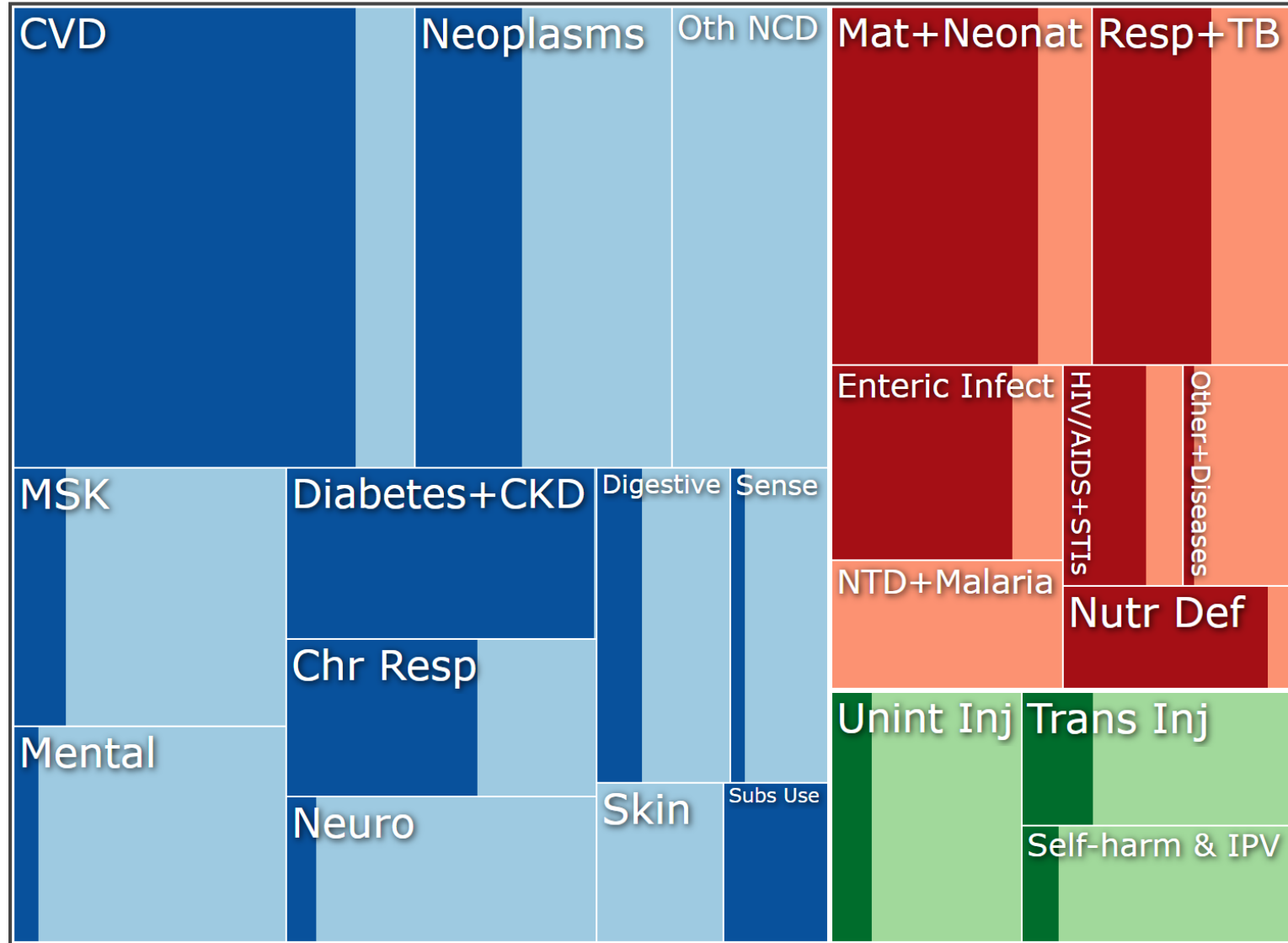
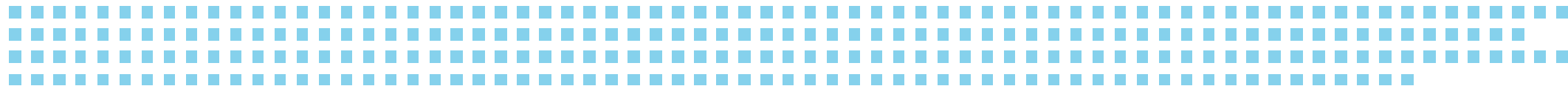


Table 1: **Eligible clinical practice guidelines**

<b>Disease</b>	<b>CPGs</b>
CVD	2023 AHA guideline: management of chronic CD <a href="#">13</a>
	2023 ESC guideline: management of acute CD <a href="#">14</a>
	2019 AHA guideline: CVD primary prevention <a href="#">15</a>
	2021 ESC guideline: CVD prevention <a href="#">16</a>
Diabetes	2023 ADA guideline: Standard of Care <a href="#">2</a>
	2019 Endocrine Society guideline: prevention <a href="#">17</a>
Obesity	2020 Canadian MA: Obesity in adults <a href="#">18</a>
	2016 AACE/ACE guideline: obesity <a href="#">19</a>
Cirrhosis and CLD	2023 AASLD guideline: NAFLD <a href="#">20</a>
	2022 AACE/AASLD guideline: NAFLD <a href="#">21</a>

CPG, clinical practice guideline; CVD, cardiovascular disease; AHA, American Heart Association; CD, coronary disease; ESC, European Society of Cardiology; ADA, American Diabetes Association; MA, medical association; AACE, American Association of Clinical Endocrinology; ACE, American College of Endocrinology; CLD, chronic liver disease; AASLD, American Association for the Study of Liver Diseases; NAFLD, non-alcoholic fatty liver disease.



# MATERIAL & METHODS

## Eligibility criteria

Eligible sentences:

- (1) part of formal recommendations and supporting statements that are intended to provide evidence;
- (2) focus on *non-pharmaceutical treatment or preventive* strategies;
- (3) explicitly *contain* causal linking terms or imply causation.



# MATERIAL & METHODS

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Eligible studies:

All citations (interventional/observational/SR studies) following the sentence.



# MATERIAL & METHODS

## Eligibility criteria

Eligible sentences:

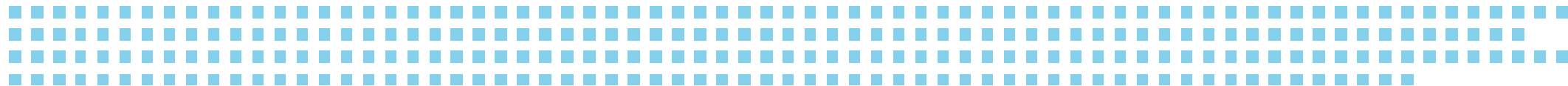
- (1) part of formal recommendations and supporting statements that are intended to provide evidence;
- (2) focus on *non-pharmaceutical treatment or preventive* strategies;
- (3) explicitly *contain* causal linking terms or imply causation.

Eligible studies:

**All** citations (interventional/observational/SR studies) following the sentence.

Sometimes a causal statement is not supported by any citations.

... A variety of eating plans, varying in macronutrient composition, ***can be used effectively and safely*** in the short term (1–2 years) to achieve weight loss in people with diabetes. These plans include ***structured low-calorie meal plans with meal replacements (106,117,119)***, a ***Mediterranean eating pattern (120)***, and ***low-carbohydrate meal plans*** with additional support (121,122).

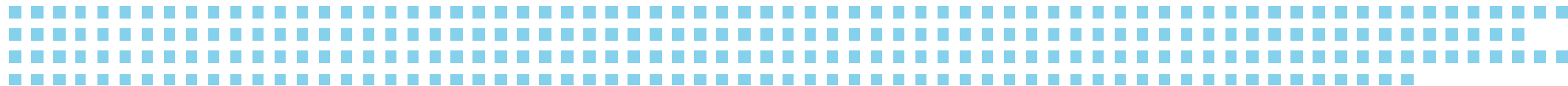




# MATERIAL & METHODS

## Data selection

However, a guideline often has thousands of sentences and hundreds of recommendations...



# MATERIAL & METHODS

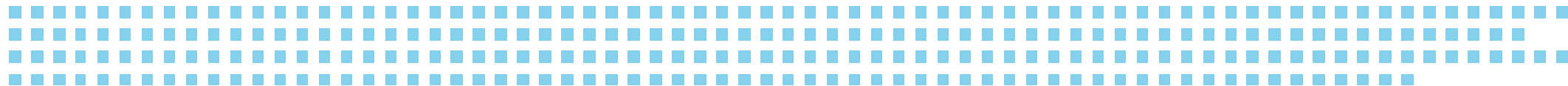
## Data selection

However, a guideline often has thousands of sentences and hundreds of recommendations...

We have a maximal capacity of approx. 300 sentences and 300 original studies. We have to sample from the entire guideline (or eligible sections).

Stratified sampling if there are multiple guidelines (or guideline sections).

If one of the capacities (sentence or study) is reached we will stop sampling.



Coding each sentence  
into our database

```
graph TD; A[Coding each sentence into our database] --> B[Sample one and check causation]; B --> C[Causal? Include! Otherwise, throw away!];
```

Sample one and check  
causation

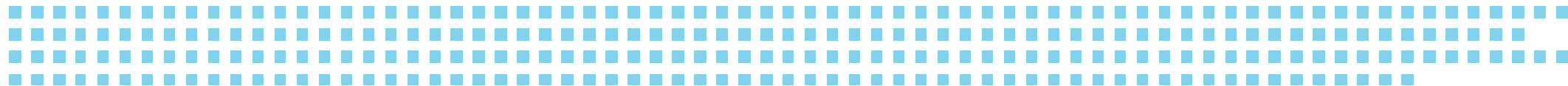
Causal? Include!  
Otherwise, throw away!

# MATERIAL & METHODS

## Data selection

Data selection will be performed by at least two researchers independently.

(But sampling will not be.)



# MATERIAL & METHODS

## Data extraction

A pre-defined data extraction form...

Will be double-checked.



A	B	C	D
<b>Name</b>	<b>Meaning</b>	<b>Type</b>	<b>Length</b>
glInfo	guideline information	table	13
glSent	guideline sentences (statements)	table	10
recInfo	recommendation information	table	4
osInfo	original study information	table	10
osStatements	statements in original studies	table	11
osComponents	Trial emulation components	table	13
osArms	Arms (different treatment strategies) in origin	table	5
gl_No	guideline identifier	integer	1
gl_Title	guideline title	character	128
gl_Year	guideline year of publication	integer	1
gl_Topic	guideline topic (of disease)	character	32
gl_Org	guideline organization	character	32
sec_Title	section title	character	128
sec_Rec_Number	total number of recommendations in section	integer	1
sec_Sent_Number	total number of sentences in section	integer	1
sec_Sent_Sampled	number of sampled sentences in section	integer	1
sec_Sent_Sampfrac	fraction of sampled sentences in section	float	1
sec_Excl_Number	number of excluded sentences in section	integer	1
sec_Incl_Number	number of included sentences in section	integer	1
sec_Incl_Frac	fraction of inclusion in section	float	1
rec_No	recommendation identifier	integer	1

25	sent_Link_Phrase	(causal) linking phrase	character	32
26	sent_Link_Phr_Root	(causal linking root word	character	5
27	sent_Causal_Exps	Exposure implied by sentence	character	64
28	sent_Causal_Otcm	Outcome implied by sentence	character	64
29	os_Number	number of corresponding original studies	integer	1
30	os_No	original study identifier	integer	1
31	os_Title	original study title	character	128
32	os_Firstauthor	original study first author	character	32
33	os_Year	original study year of publication	integer	1
34	os_Nation	original study origin of first author	character	16
35	os_Journal	original study journal of publication	character	64
36	os_Cited	original study total cited number	integer	1
37	os_Abs_Concl_cont	conclusive sentence in abstract	character	512
38	os_Abs_Concl_Link_Phr	linking phrase of conclusive sentence in abstract	character	32
39	os_Abs_Concl_Link_Phr_Ro	linking phrase root of conclusive sentence in ab	character	5
40	os_Abs_Concl_Causal_Exps	Exposure implied by conclusive sentence in abs	character	64
41	os_Abs_Concl_Causal_Otcm	Outcome implied by conclusive sentence in abs	character	64

< >

Codebook

glInfo

glSent

reclInfo

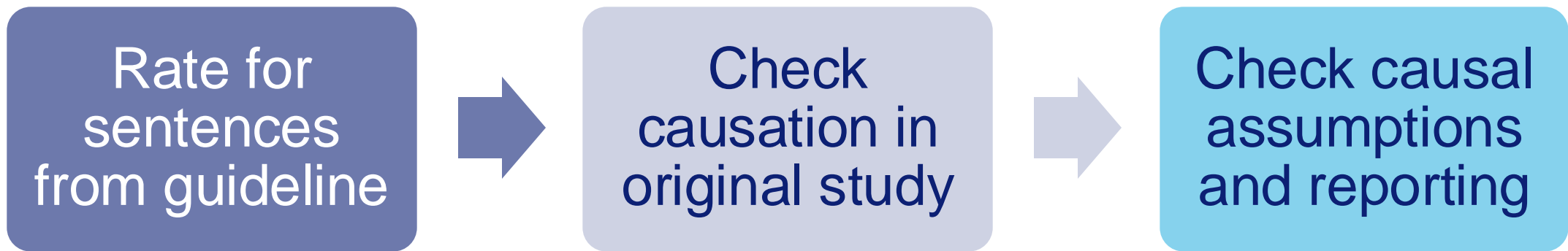
osInfo

osStatements

osCompon

# MATERIAL & METHODS

## Data analysis





# MATERIAL & METHODS

## Data analysis

- Rate for causality

**Table 2**

Causal Implication Strength Rating Scale for an Analysis of Causal and Associational Language in Observational Health Research

Rating	Linking Sentence	Action Recommendation
N/A		No action recommendation exists.
None	The linking sentence does not imply in any way that a causal relationship was identified.	The action recommendation would be made appropriately in the absence of any causal relationship.
Weak	The linking sentence might imply that a causal relationship was identified, but it is unclear or not possible to come to that conclusion in the absence of any causal inference.	The action recommendation may be made appropriately had a causal relationship been identified, but it is unclear or not possible to come to that recommendation in the absence of any causal inference.
Moderate	The linking sentence mostly implies that a causal relationship was identified, but it is unclear or not possible to come to that conclusion in the absence of any causal inference.	The action recommendation most likely could only be made appropriately had a causal relationship been identified, but it is unclear or not possible to come to that recommendation in the absence of any causal inference.
Strong	The linking sentence clearly implies that causality had been identified.	The action recommendation could only be made appropriately had a causal relationship been identified.

# PREVIOUS STUDIES

## Haber et al. 2022: rating of causal statements

- Haber et al. (2022). **Causal and Associational Language in Observational Health Research: A Systematic Evaluation.** *Am J Epidemiol* 191(12):2084-97.<sup>(3)</sup>
- 1,170 articles published in last decade **screened**.
- **Degree of causality** implied in **abstracts and full text** for exposure/outcome linking language and action recommendations **rated**.
- Most common **linking phrases** and how strong these words implying causality **marked**.
- **Correlation heatmap** to depict results.

**Table 2**

## Causal Implication Strength Rating Scale for an Analysis of Causal and Associational Language in Observational Health Research

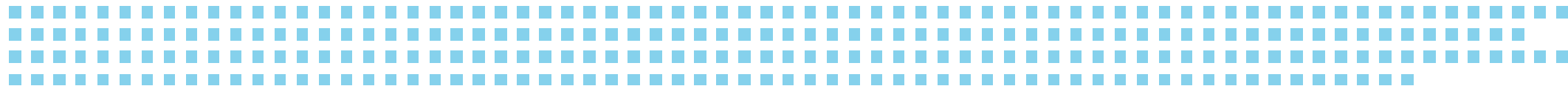
Rating	Linking Sentence	Action Recommendation
N/A		No action recommendation exists.
None	The linking sentence does not imply in any way that a causal relationship was identified.	The action recommendation would be made appropriately in the absence of any causal relationship.
Weak	The linking sentence might imply that a causal relationship was identified, but it is unclear or not possible to come to that conclusion in the absence of any causal inference.	The action recommendation may be made appropriately had a causal relationship been identified, but it is unclear or not possible to come to that recommendation in the absence of any causal inference.
Moderate	The linking sentence mostly implies that a causal relationship was identified, but it is unclear or not possible to come to that conclusion in the absence of any causal inference.	The action recommendation most likely could only be made appropriately had a causal relationship been identified, but it is unclear or not possible to come to that recommendation in the absence of any causal inference.
Strong	The linking sentence clearly implies that causality had been identified.	The action recommendation could only be made appropriately had a causal relationship been identified.



# MATERIAL & METHODS

## Data analysis

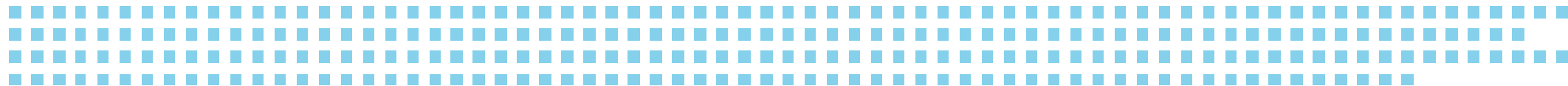
- Check causation in original studies
- Conclusive sentences in abstract and in conclusion section will be checked and rated for.



# MATERIAL & METHODS

## Data analysis

- Check causal assumptions and reporting.
- For assumptions....., only check (conditional) exchangeability.



# MATERIAL & METHODS

## Data analysis

- Check causal assumptions and reporting.
- For assumptions....., only check (conditional) exchangeability.
- Check causal reporting quality according to Target Trial Framework.



# PREVIOUS STUDIES

## Smit et al. 2023: checking causal reporting quality

- Smit JL et al. (2023). **Causal inference using observational intensive care unit data: a scoping review and recommendations for future practice.** *NPJ Digit. Med.* 6:221.<sup>(4)</sup>
- ***(Causal) reporting quality*** of studies introducing models for causal inference in ICU evaluated.
- ***Target trial components*** and ***causal assumptions*** evaluated.



**Table 2.** Components of the target trial framework included in the reporting quality assessment with examples for the ICU setting.

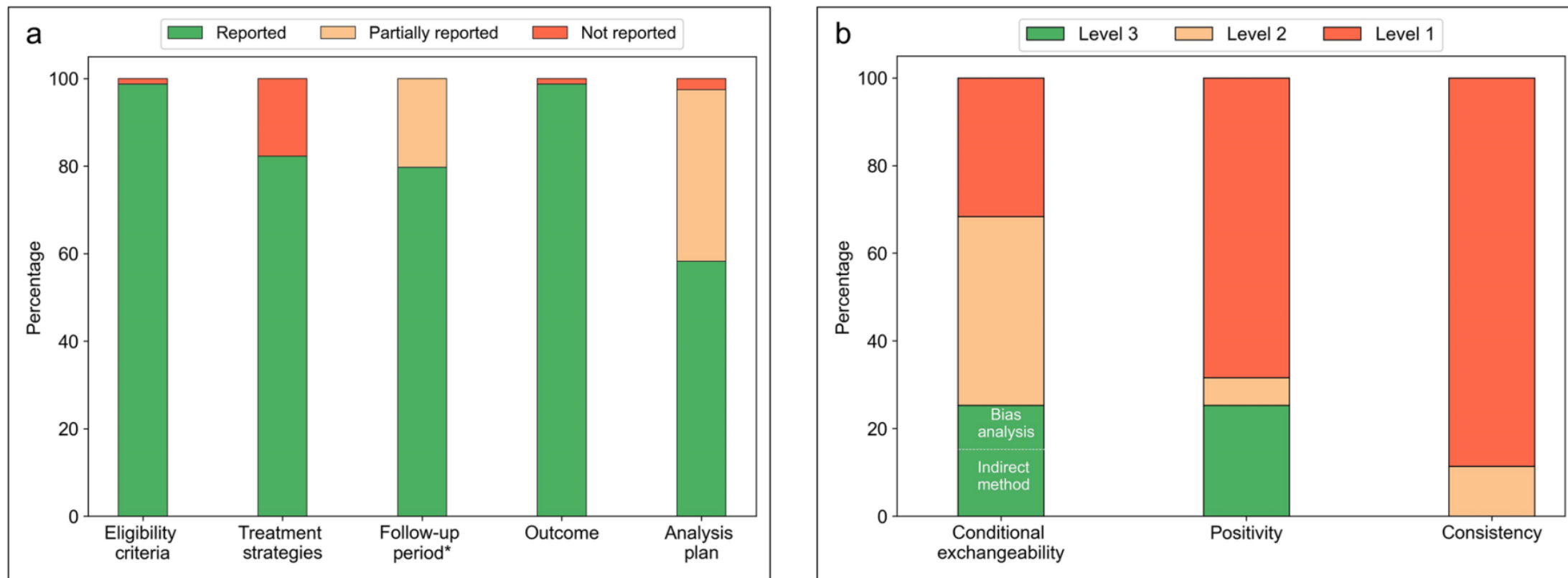
Component	Subcomponent	Included for QOR assessment	ICU example
Eligibility criteria	–	✓	Individuals aged 65 years or older admitted to the ICU meeting Sepsis-3 criteria upon admission.
Treatment strategies	–	✓	1. Liberal fluid therapy (administration of intravenous fluid boluses during the first several hours of treatment) 2. Restrictive fluid therapy (Intravenous fluid boluses during ICU stay in only in case of severe hypoperfusion)
Assignment procedures	–	–	Unblinded, random assignment to one of the treatment strategies.
Follow-up period	Start of follow-up	✓	Time of ICU admission.
	End of follow-up	✓	Death, ICU discharge, or loss to follow-up, whichever occurs first.
	Time resolution	✓	Hourly weights were applied to adjust for the impact of time-varying confounders on the hourly risk of adhering to one of the two treatment strategies.
Outcome	–	✓	All- cause mortality.
Causal contrasts of interest	–	–	Per-protocol effect.
Analysis plan <sup>a</sup>	–	✓	Per-protocol effect will be estimated adjusting for pre- and postbaseline confounders by a marginal structural model using IPTW. <sup>b</sup>

<sup>a</sup>The analysis plan component is subdivided in a specific set of subcomponents depending on the modeling strategy used, these are summarized in Supplementary Table 9.

<sup>b</sup>This description would not be considered as sufficient reporting of the analysis plan component, but simply serves as an example.

## Target trial components framework from Hernán MA et al.<sup>(5)</sup>



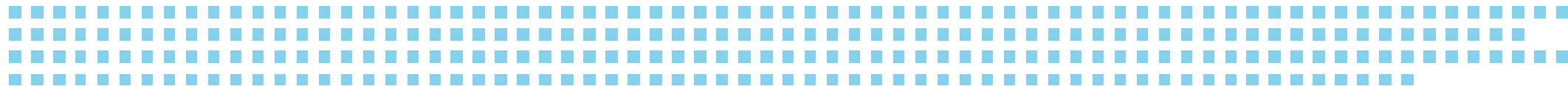


**Fig. 3 Quality of Reporting summary plots. a** Reporting quality of the target trial components. \*For the follow-up component, the studies that used simulated patient data ( $n = 5$ ) are not taken into account. **b** Reporting quality of causal assumptions (level 1 = assumption not mentioned, level 2 = assumption mentioned, level 3 = attempt to check for potential violations of the assumption reported).

# MATERIAL & METHODS

## Evidence synthesis

- It is estimated that **xx% (95%CI xx, xx)** of the statements in the guidelines are causal or implied causation;
- “Benefit/beneficial” was used in xx% of the causal statements; “prevent” xx%, “reduce” xx%, ...
- Causal statements are rated as x.x/4 on average....,
- xx% of the original studies reported full analysis plan...



Study \ Guid.	No	Weak	Some	Strong
No	86	33	18	3
Weak	-	95	...	...
Some	-	-	...	...
Strong	-	-	-	...

**Cohen's  $\kappa = .533$  (95%CI .495, .580)**  
**Spearman  $r_s = .627$  (95%CI .599, .672)**  
 **$P_s = .0013$**

**Example**

Study	No	Weak	Some	Strong
R.				
Poor	75	35	27	3
Some	23	24	...	...
Good	...	...	...	...

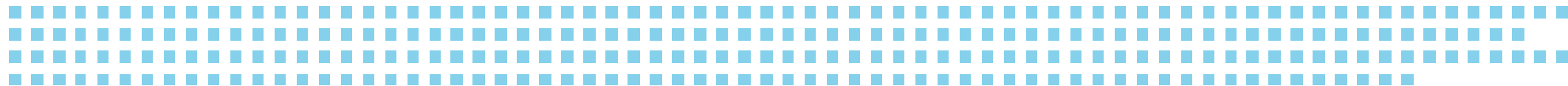
Spearman  $r_s = .627$  (95%CI .599, .672)  
 $P_s = .0013$

Example

# MATERIAL & METHODS

Evidence synthesis

**... And we can run other analyses of correlation/difference if we want.**

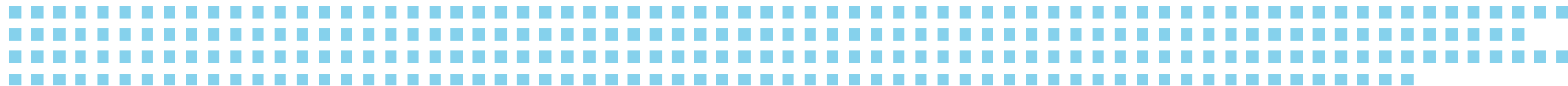


# TIME SCHEDULE



Table 2: **Time schedule**

<b>Time interval</b>	<b>Duration</b>	<b>Progress</b>
Feb - Apr 2024	3 month	Data selection
May - Jul 2024	3 months	Data extraction
Aug - Nov 2024	4 months	Causal statement annotation and rating
Dec 2024 - Feb 2025	3 months	Causal assumption check
Mar 2025	1 month	Data mapping and evidence synthesis
Apr - May 2025	2 months	Manuscript writing and defense preparation



# QUESTIONS?

And suggestions?





# REFERENCES

- (1) Graham R, et al., ed. Clinical Practice Guidelines We Can Trust. Washington DC: National Academies Press; 2011. <https://www.ncbi.nlm.nih.gov/books/NBK209538/>
- (2) ElSayed NA, et al. 3. Prevention or Delay of Type 2 Diabetes and Associated Comorbidities: Standards of Care in Diabetes—2023. *Diabetes Care* 2023;46(Suppl. 1):S41–8. doi: 10.2337/dc23-S003
- (3) Haber NA, et al. Causal and Associational Language in Observational Health Research: A Systematic Evaluation. *Am J Epidemiol* 2022; 191(12):2084-97. doi: 10.1093/aje/kwac137
- (4) Smit JL, et al. Causal inference using observational intensive care unit data: a scoping review and recommendations for future practice. *NPJ Digit Med* 2023;6:221. doi: 10.1038/s41746-023-00961-1
- (5) Hernán MA, et al. Target Trial Emulation: A Framework for Causal Inference From Observational Data. *JAMA* 328(24):2446-2447. doi: 10.1001/jama.2022.21383.
- (6) IHME. Global Burden of Disease Study. <https://www.healthdata.org/research-analysis/gbd> (visited on 01/30/2024).