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# Benefit-Risk Assessment from a Clinical Point of View:

a structured approach with focus on transparency,  
clinical significance and visualization

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# Disclaimer

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# The benefit-risk balance



# Background

- Afzal and co-workers demonstrated that specific combinations of functional polymorphisms in dihydropyrimidine dehydrogenase (DPYD) and thymidylate synthase (TYMS) polymorphisms were associated with increased disease-free survival (DFS) in colorectal cancer patients receiving adjuvant 5-FU based treatment, HR 0.69 [0.49 – 0.98].\*

\*Afzal S, Gusella M, Jensen SA, Vainer B, Vogel U, Andersen JT, et al. The association of polymorphisms in 5-fluorouracil metabolism genes with outcome in adjuvant treatment of colorectal cancer. *Pharmacogenomics* 2011 Sep;12(9):1257-67.

# Aim of talk

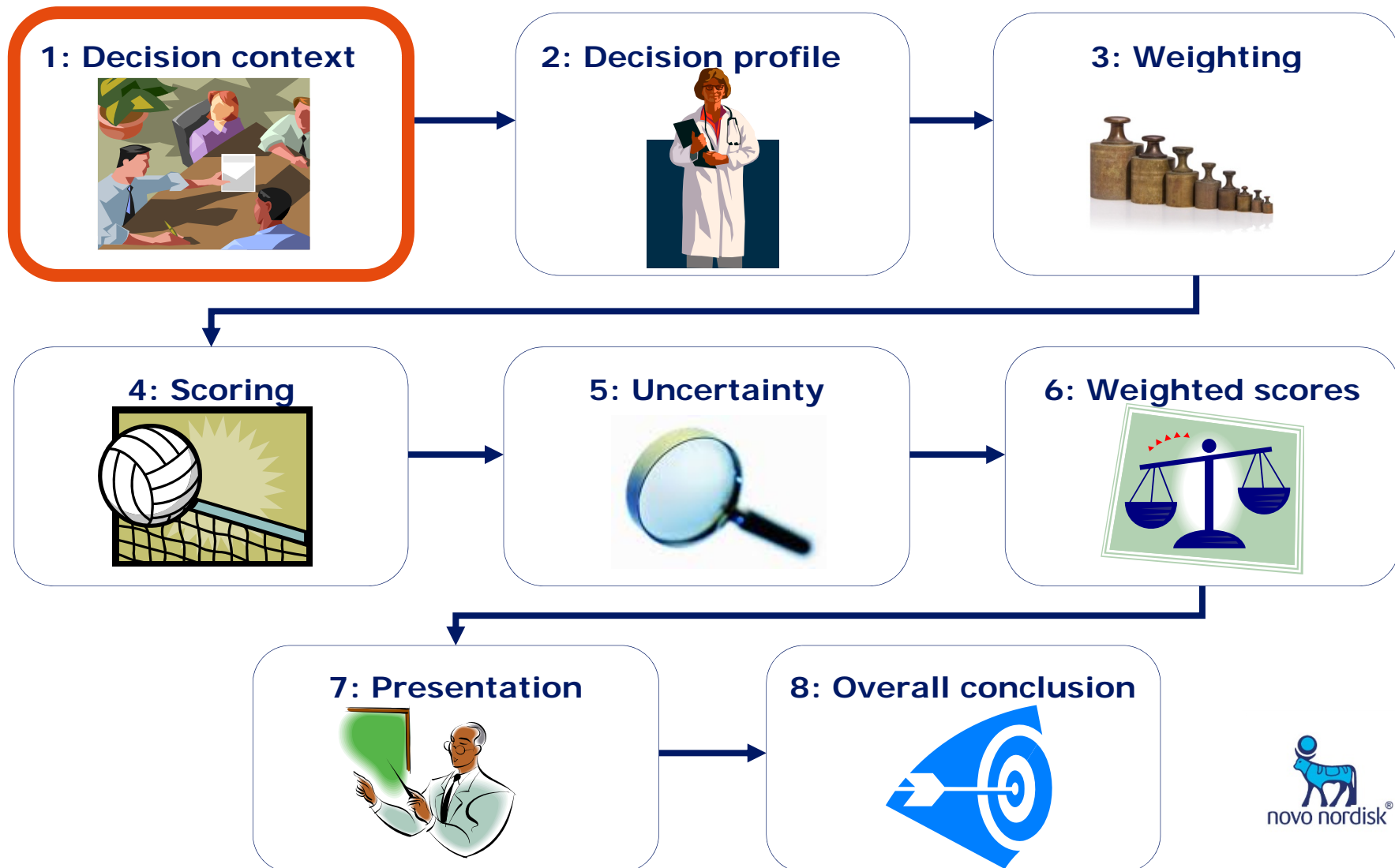
- Demonstrate a data-driven benefit-risk assessment method with focus on:
  - Transparency
  - Clinical significance
  - Visualisation
  - Communication
- Use 5-FU and the polymorphisms as a case.
- Same treatment, but different responses in subgroups.

# Data material

- The MDR-1 group consists of patients with the combination of variant alleles in the DPYD gene and the TYMS VNTR polymorphism, selected by the Multifactor Dimensionality Reduction algorithm as being associated with improved DFS.

	Number of patients ( $N = 302$ )
MDR-1	111
MDR-0	158
Missing	33

# Method overview

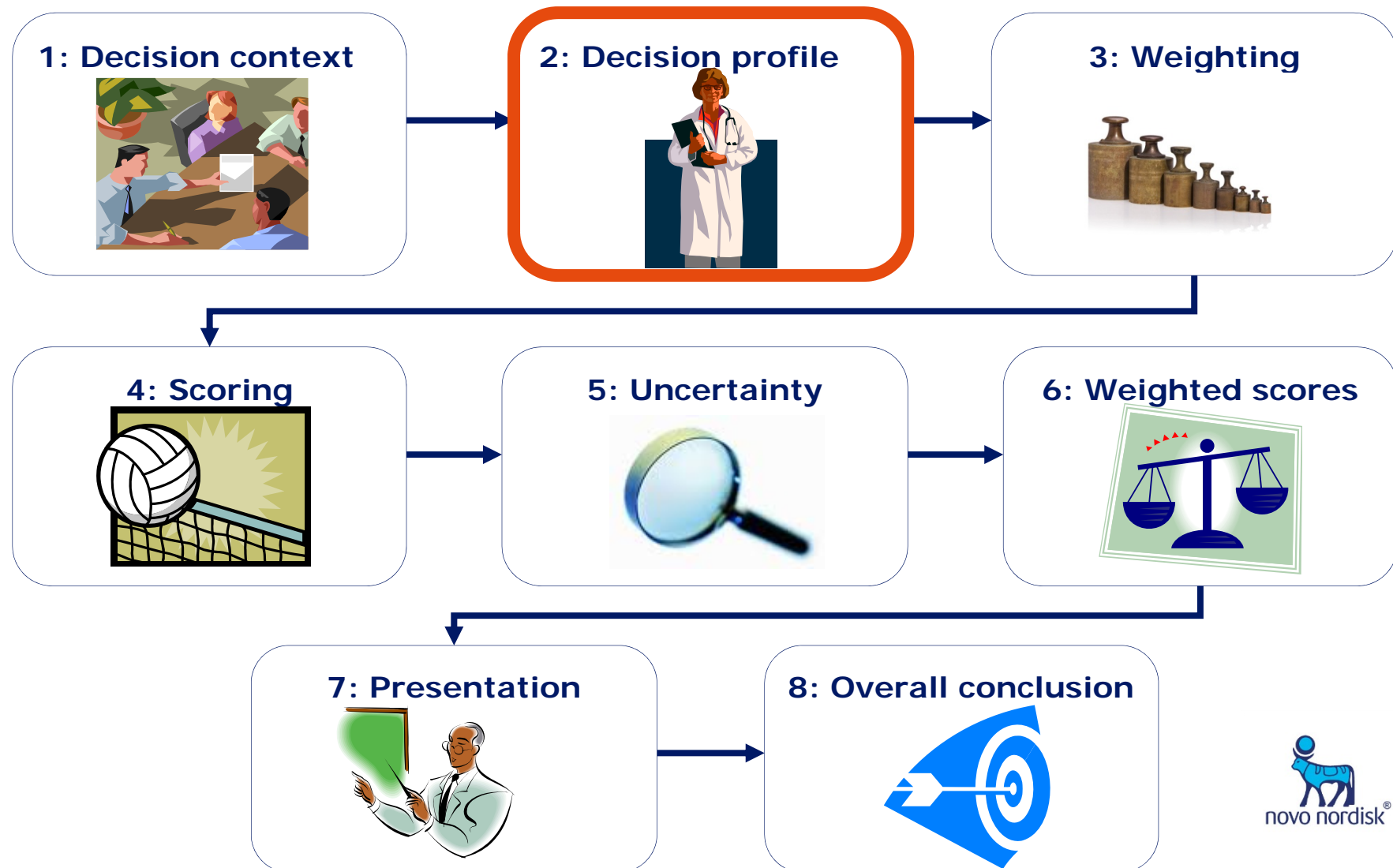


# 1: Decision context

- **The question:** How well do two groups (MDR-1 and MDR-0) of patients with the same disease, but different genetics respond to the same treatment?
- **Disease:** Colorectal cancer.
- **Treatment:** Chemotherapeutic agent (5-FU).
- **The aim:** A head to head comparison on:
  - Cure rate
  - Survival rate
  - Time-to-death (TTD)
  - Time-to-relapse (TTR)
  - Main adverse events.
- **Expectations:** Based on former knowledge, we expect that the specific combination of genetic polymorphisms in the MDR-1 group will have an advantage with reference to DFS.



# Method overview



## 2: Decision profile

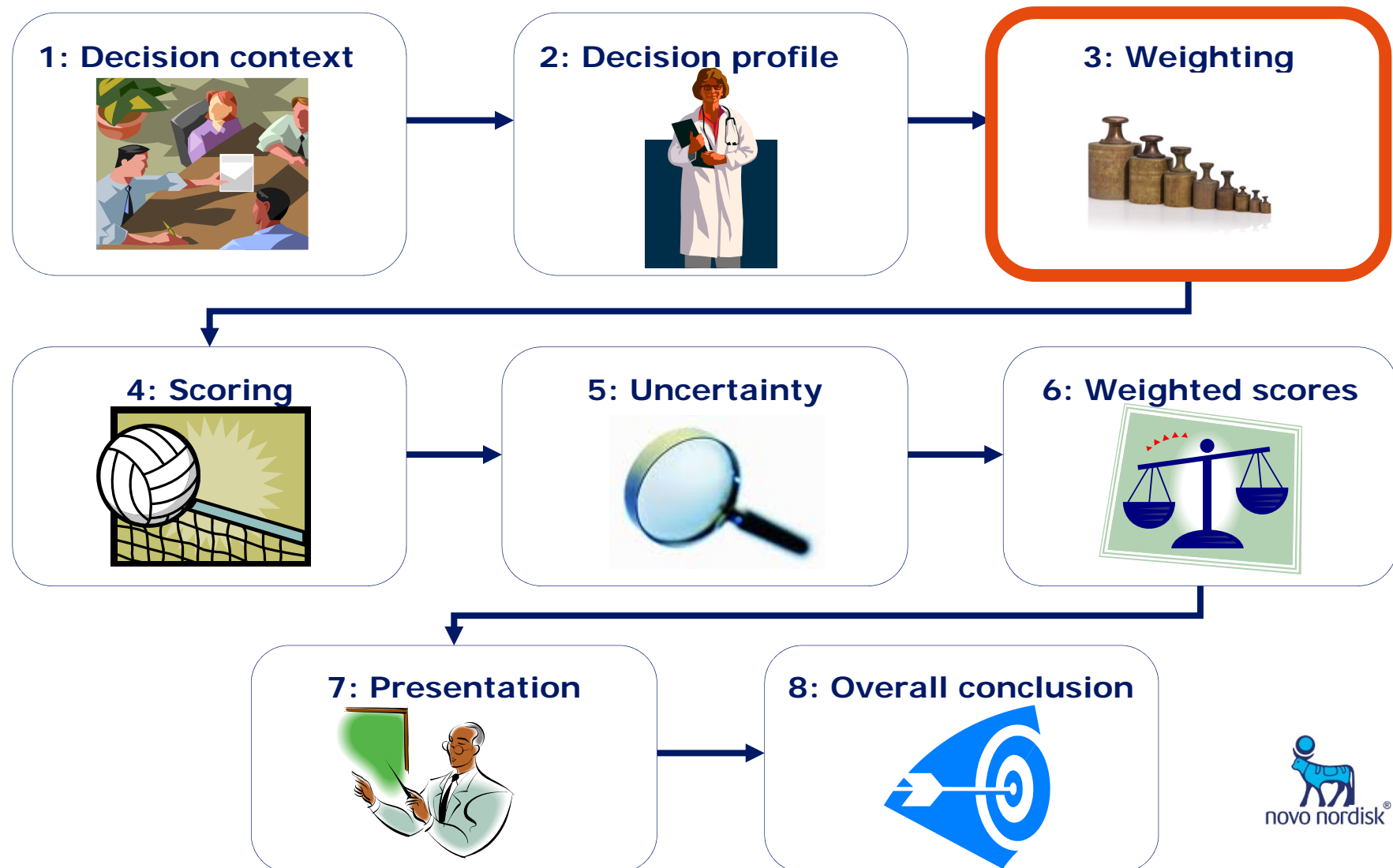
- Identify benefit and risk criteria.
- Select the most important criteria in the given context.
- Justify the choice of criteria.

## 2: Decision profile

### The 5-FU case

Criterion	Weight	Score	Weighted Score
Survival rate			
Cure rate			
TTD			
TTR			
Infection			
Myocardial ischemia			
Bleeding			
Mucositis/Stomatitis			
Hand-foot skin syndrome			
Diarrhea			
Arthralgia/Myalgia			
Fatigue			
Nausea/Vomiting			

# Method overview

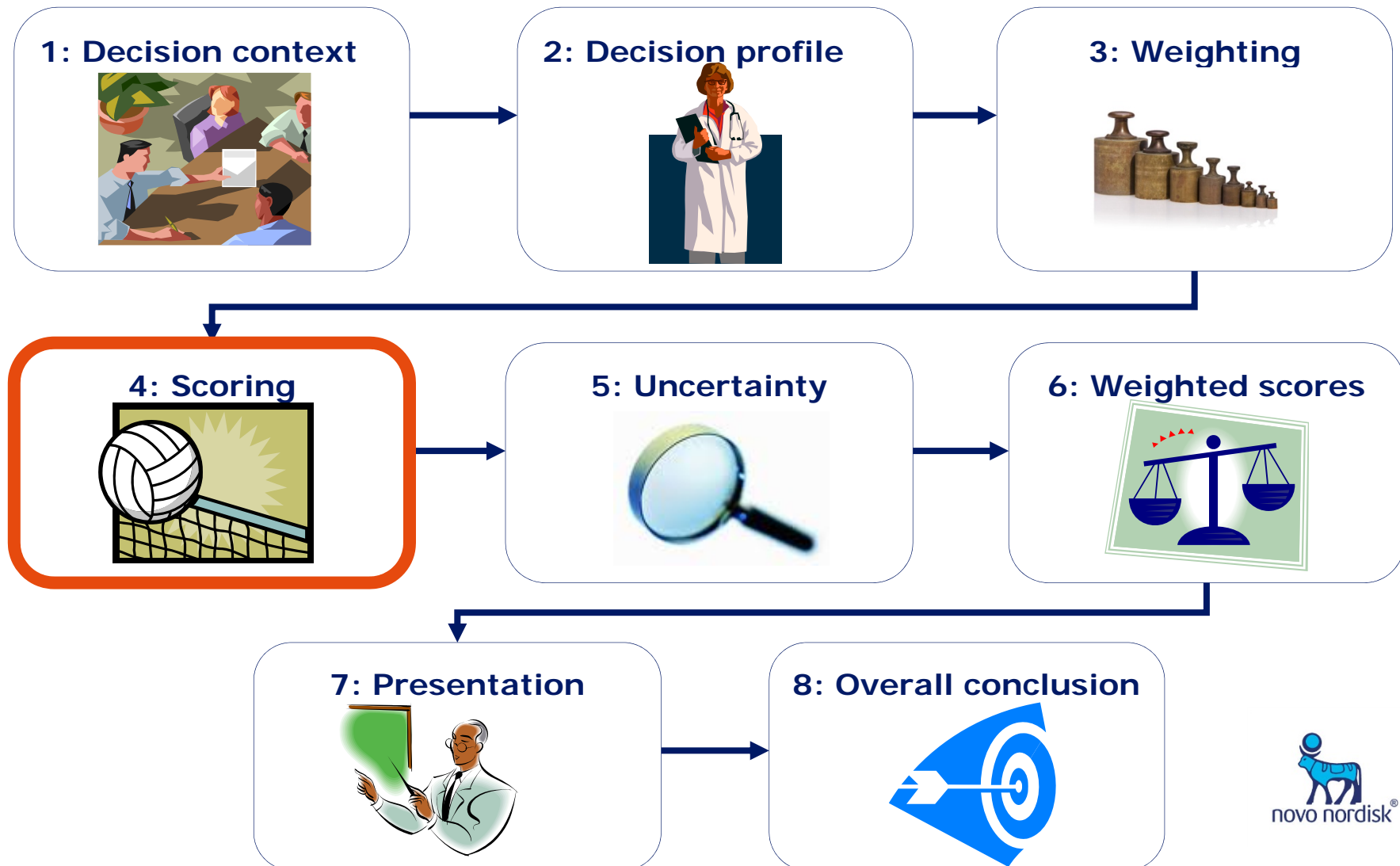


# 3: Weighting

## The 5-FU case

Criterion	Weight	Score	Weighted Score
Survival rate	3		
Cure rate	3		
TTD	3		
TTR	3		
Infection	2		
Myocardial ischemia	2		
Bleeding	2		
Mucositis/Stomatitis	2		
Hand-foot skin syndrome	2		
Diarrhea	2		
Arthralgia/Myalgia	1		
Fatigue	1		
Nausea/Vomiting	1		

# Method overview



## 4: Scoring

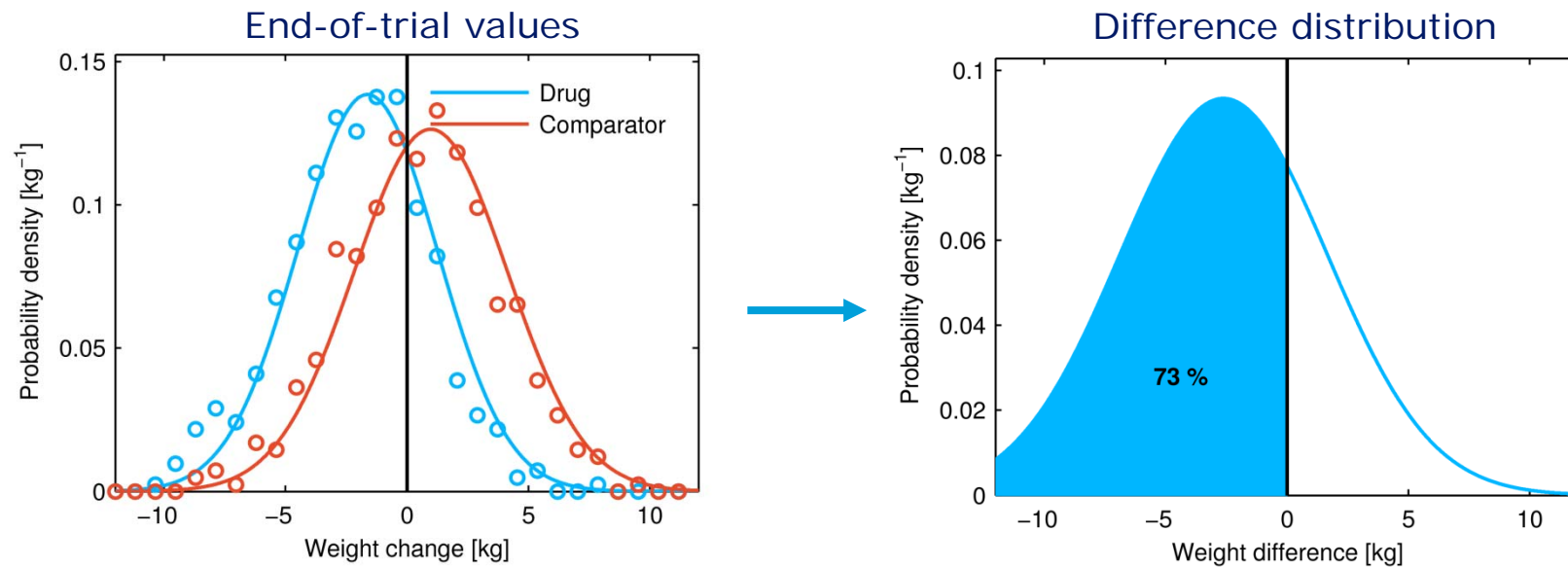
- Relative scoring is used.
- For each criterion MDR-1 is scored relative to MDR-0.

Criterion	Score
MDR-1 is <b>superior</b>	+1
MDR-1 is <b>non-inferior</b>	0
MDR-1 is <b>inferior</b>	-1

- The specific scoring method depends on the data type.

## 4.1: Endpoints with continuous values

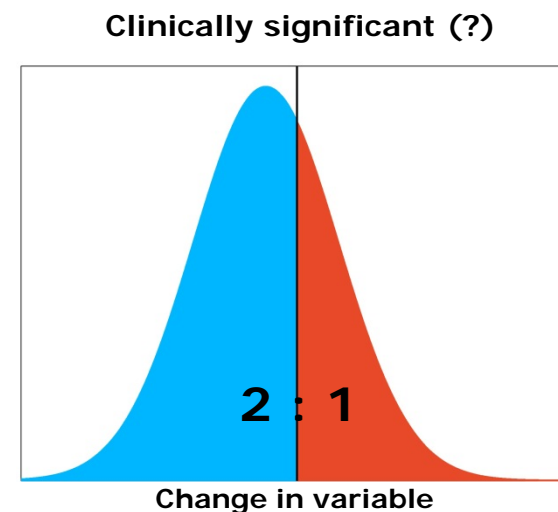
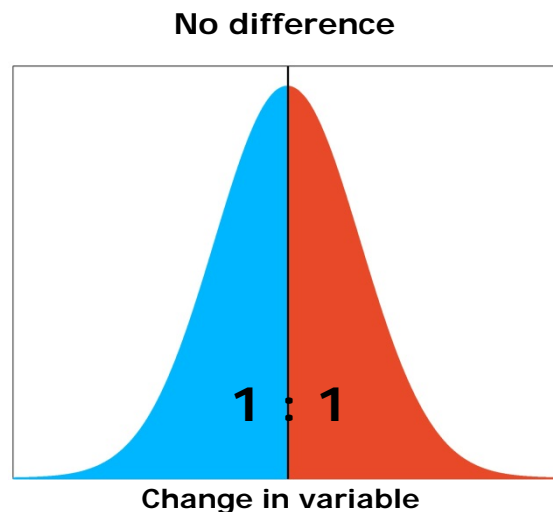
Example with simulated data:  
a drug vs. a comparator





## 4.1: Endpoints with continuous values

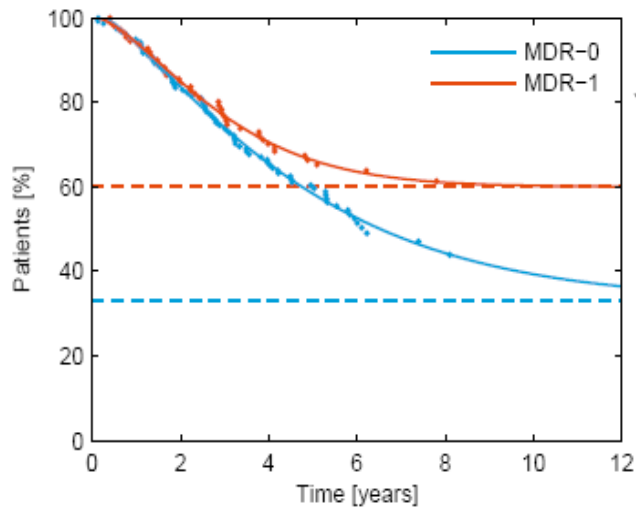
- If the areas are equal (1:1) the treatment is not different from the comparator.
- When one area is adequately larger than the other this difference is deemed **clinically significant**.
- If the number of subjects per trial arm is large enough (~ 15-18) the difference is usually **statistically significant**.



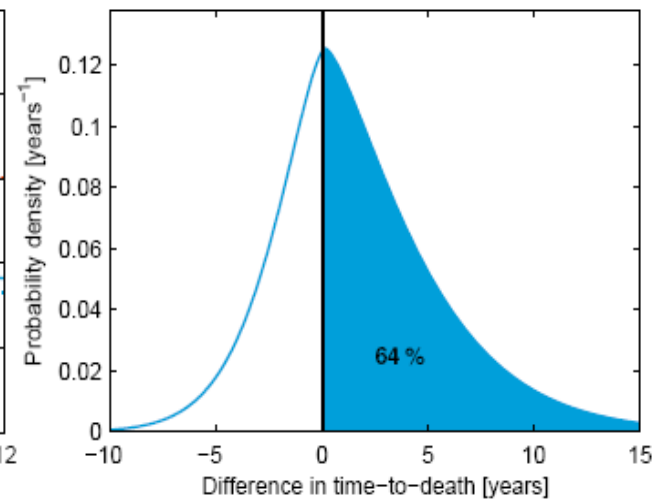
## 4.1: Endpoints with continuous values

**TTD**

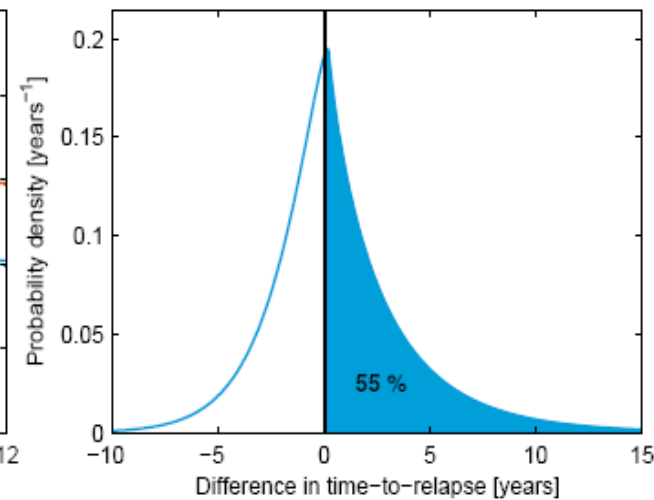
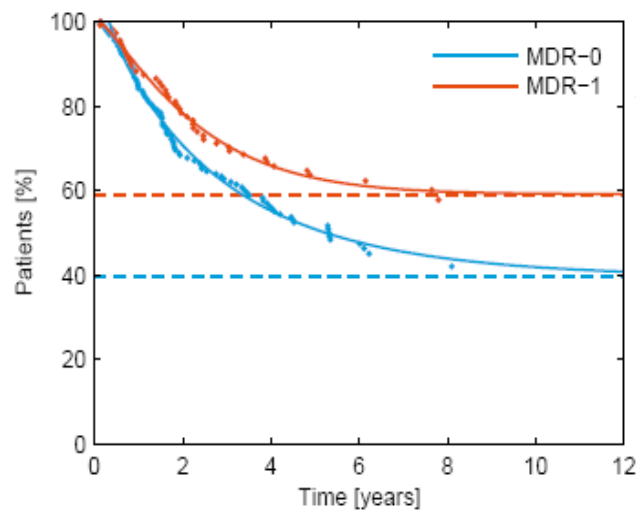
**The 5-FU case**



**MDR1 – MDR0**

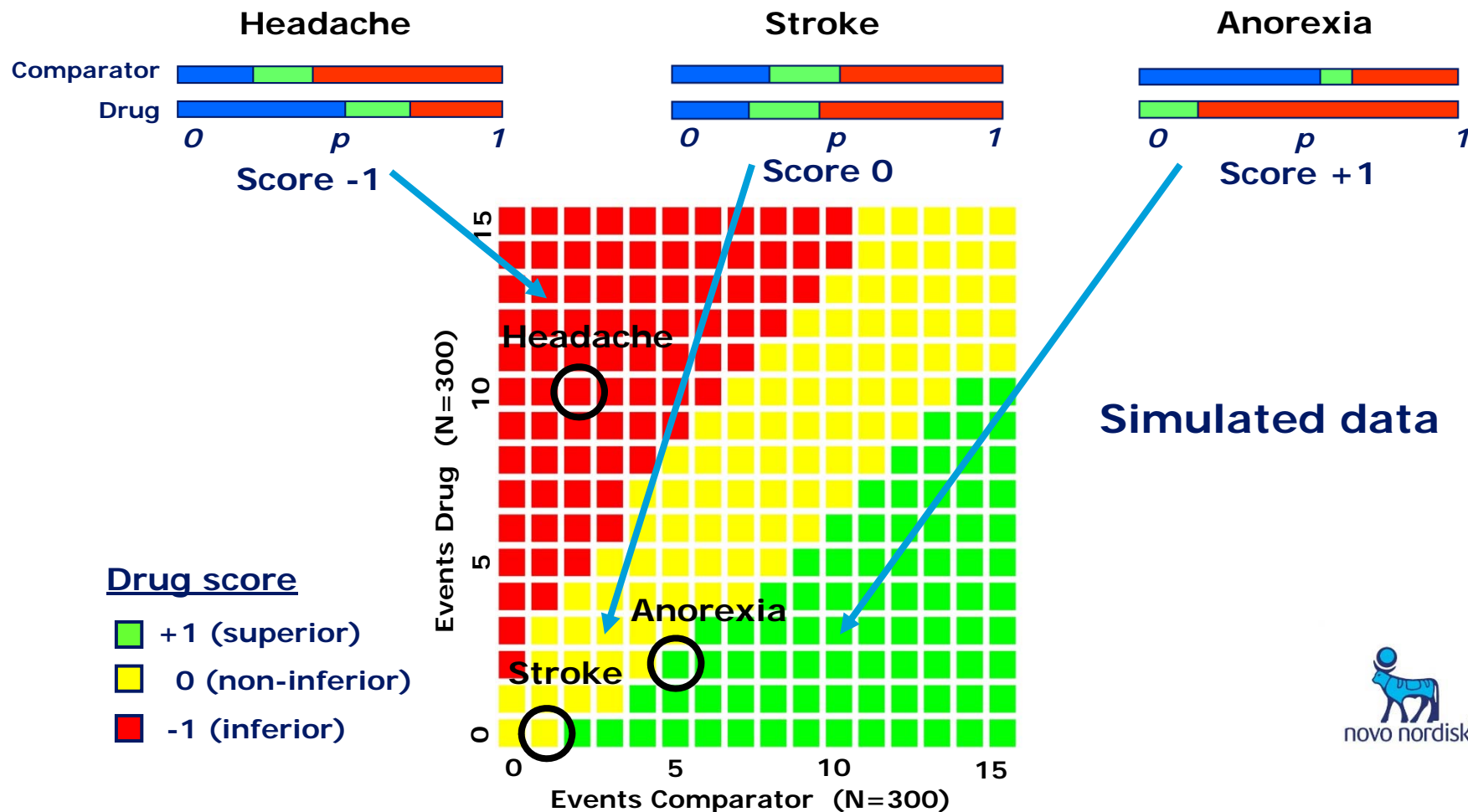


**TTR**

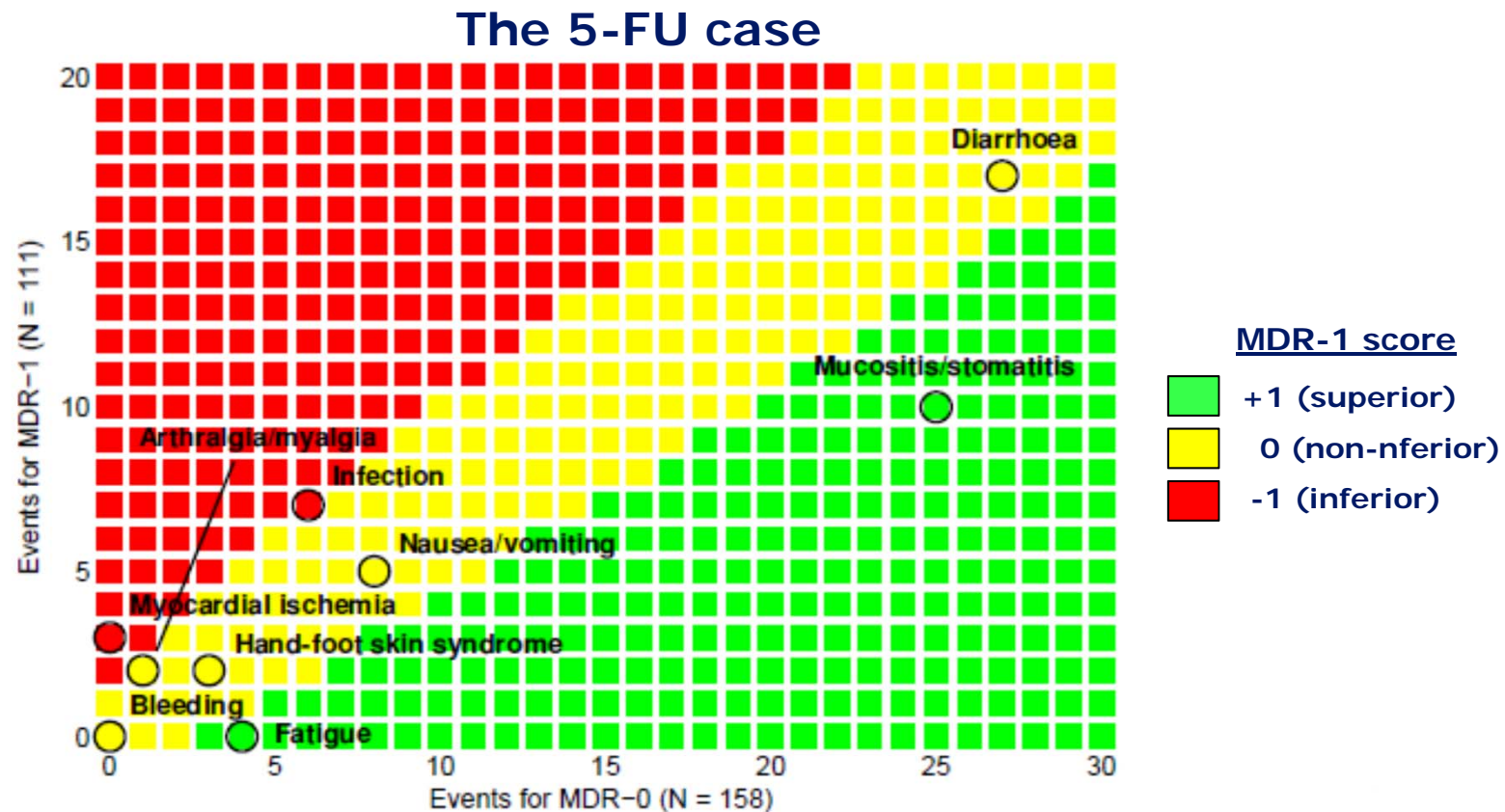


## 4.2: Binary endpoints (events)

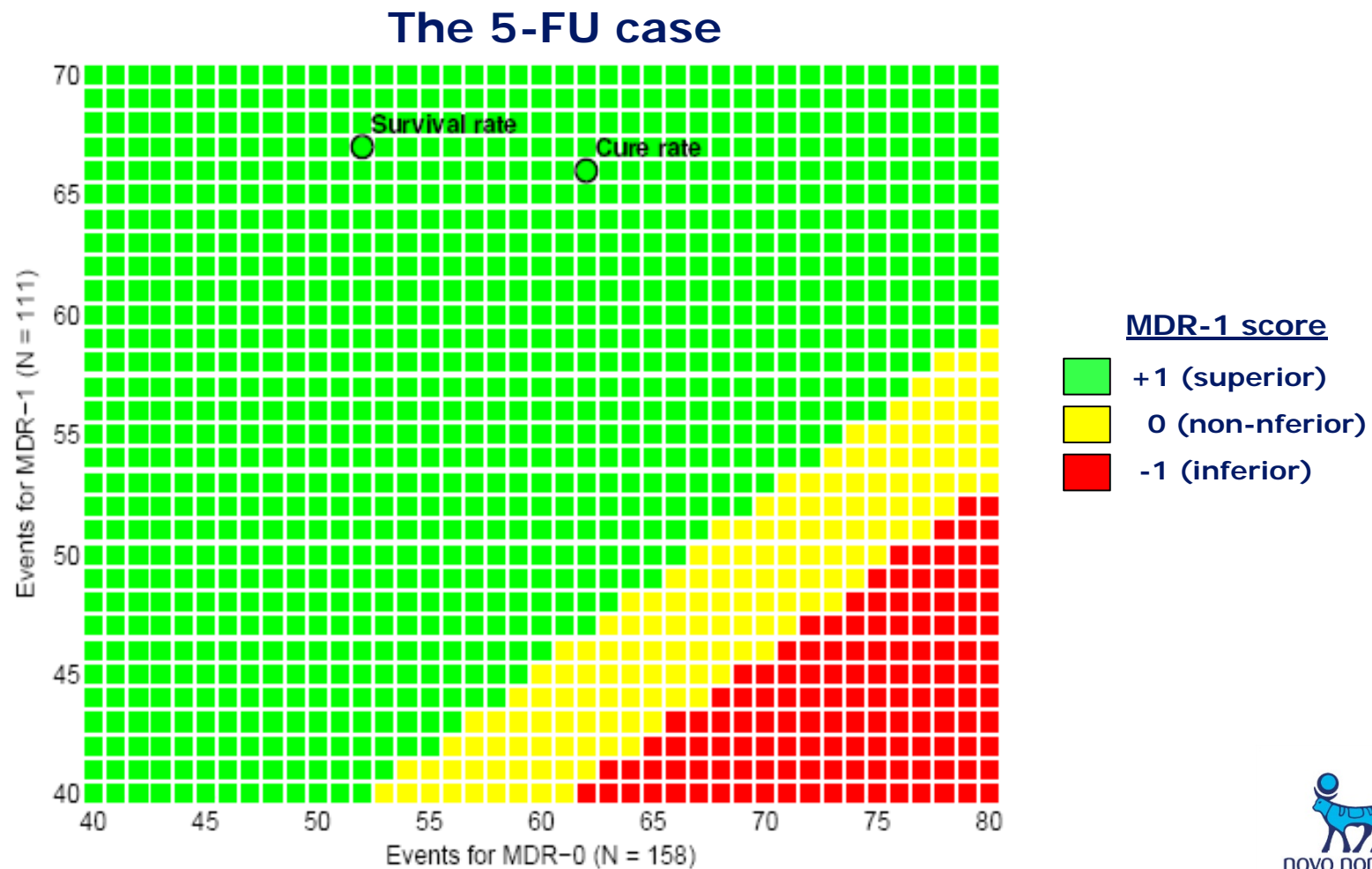
- For discrete variables two one-sided confidence intervals (e.g. 67 %) for the probability of an event are combined to form a scoring interval.
- Non-overlapping scoring intervals indicate a trend towards a difference.



## 4.2: Binary endpoints (events)



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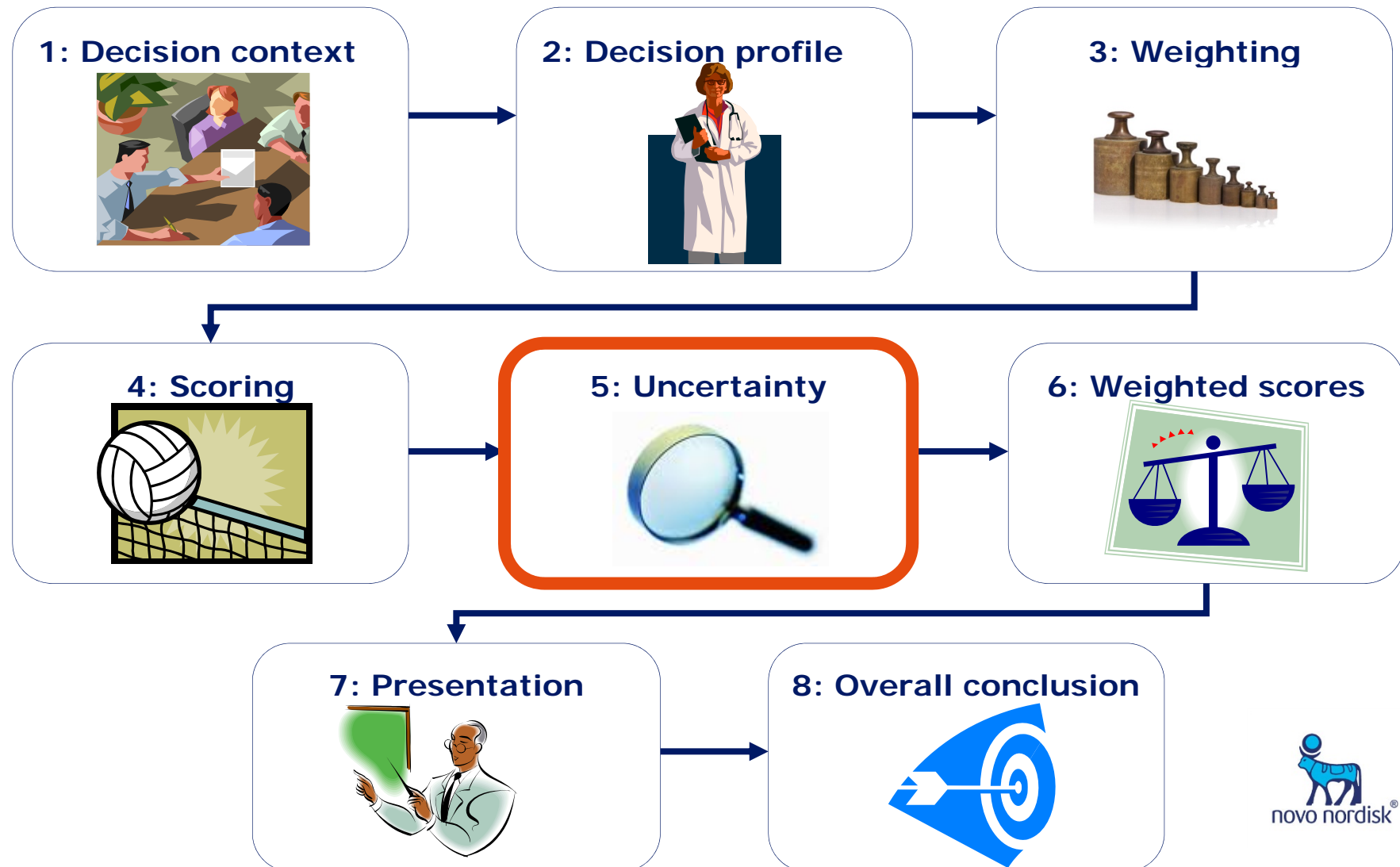


## 4: Scoring

### The 5-FU case

Criterion	Weight	Score	Weighted Score
Survival rate	3	1	
Cure rate	3	1	
TTD	3	1	
TTR	3	0	
Infection	2	-1	
Myocardial ischemia	2	-1	
Bleeding	2	0	
Mucositis/Stomatitis	2	1	
Hand-foot skin syndrome	2	0	
Diarrhea	2	0	
Arthralgia/Myalgia	1	0	
Fatigue	1	1	
Nausea/Vomiting	1	0	

# Method overview



## 5: Uncertainties

- In case of any uncertainty the score may be given as an interval ( $-1 \rightarrow 0$ ,  $0 \rightarrow 1$  or  $-1 \rightarrow 1$ ).
- Justification can be qualitative:
  - Discussion of **choice of dose**, comparator and endpoints.
  - Evaluate **methodological flaws/deficiencies** and their impact.
  - Describe any **negative studies**, studies showing no difference.
- Justification can be quantitative:
  - Evaluations can be performed by the use of **resampling**, which this method is currently being developed to incorporate.

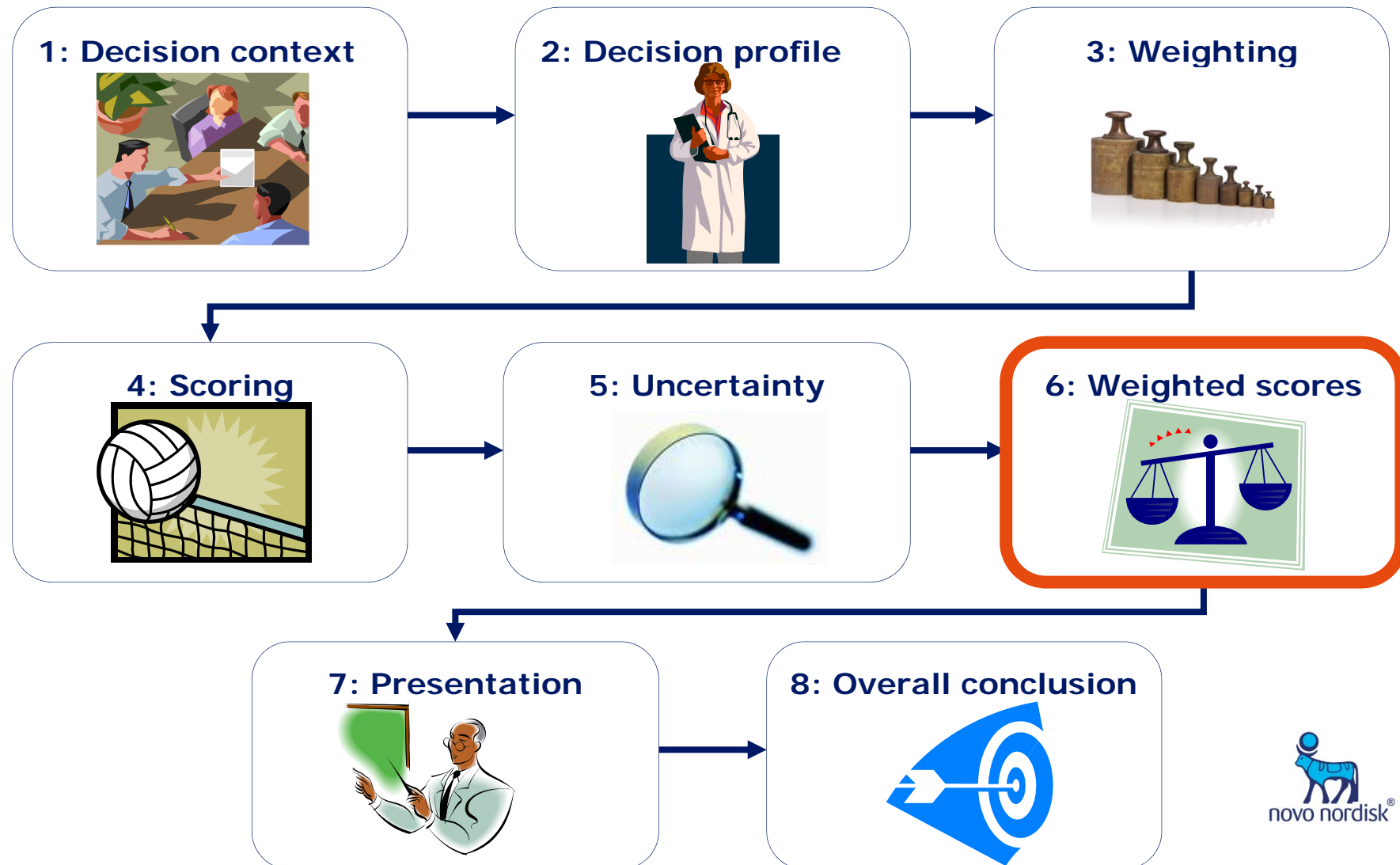


## 5: Uncertainties

### The 5-FU case

Criterion	Weight	Score	Weighted Score
Survival rate	3	1	
Cure rate	3	1	
TTD	3	1	
TTR	3	0	
Infection	2	-1 → 0	
Myocardial ischemia	2	-1	
Bleeding	2	0	
Mucositis/Stomatitis	2	1	
Hand-foot skin syndrome	2	0	
Diarrhea	2	0	
Arthralgia/Myalgia	1	0 → -1	
Fatigue	1	1 → 0	
Nausea/Vomiting	1	0	

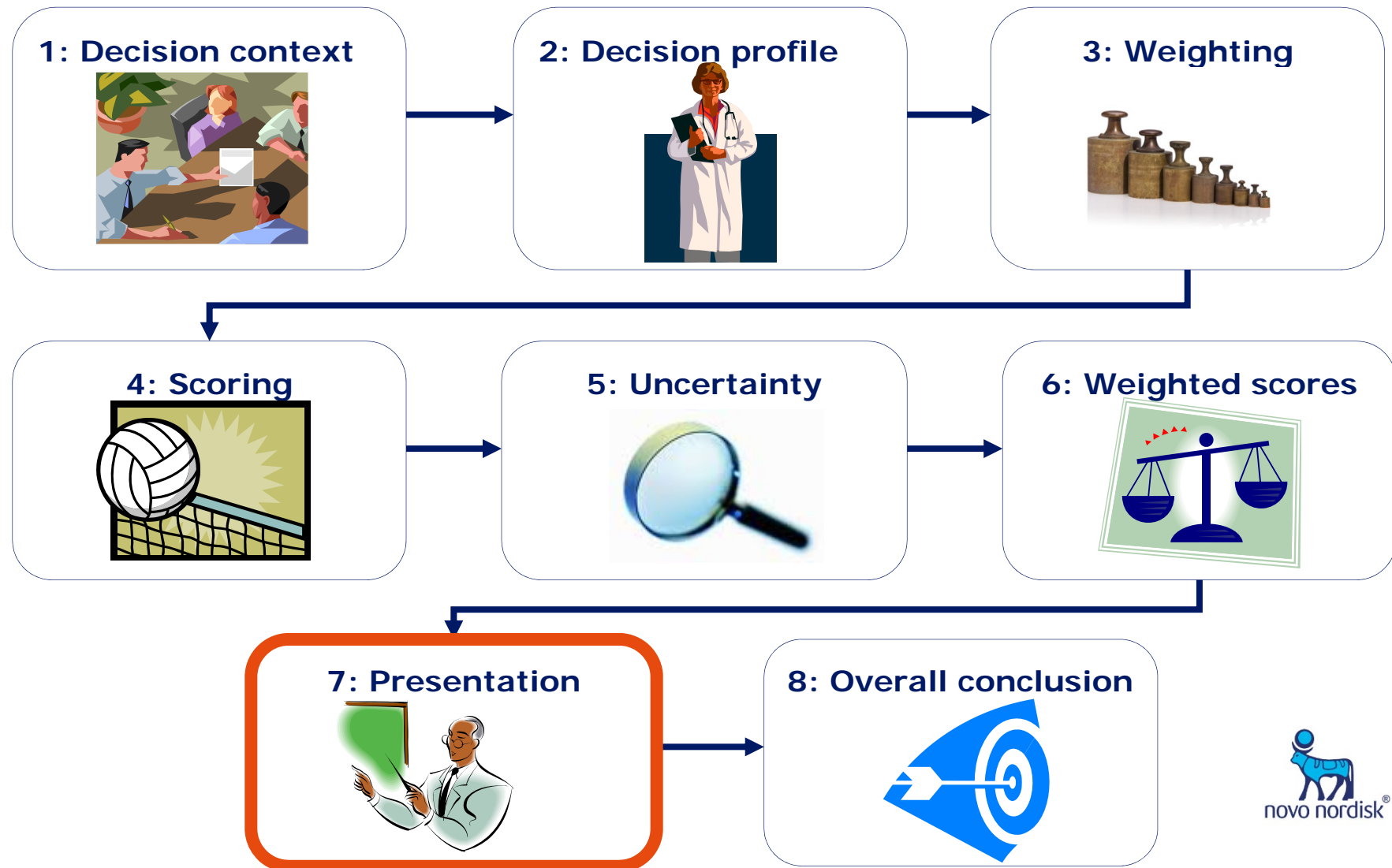
# Method overview



## 6: Weighted scores

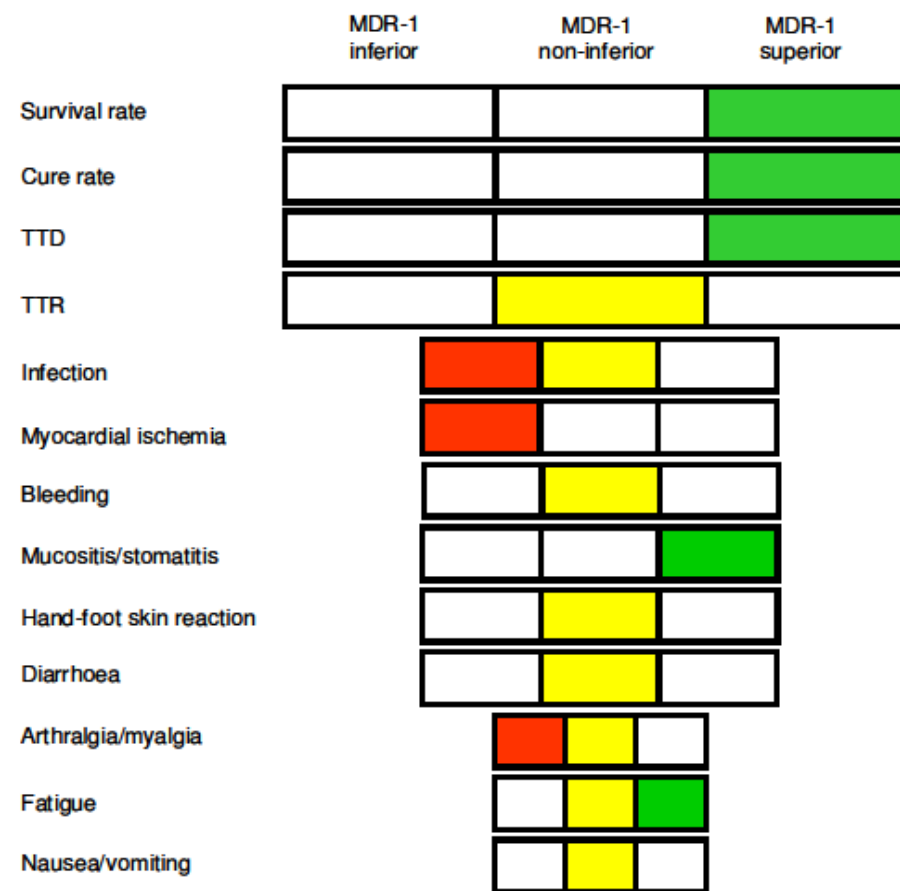
Criterion	Weight	Score	Weighted Score
Survival rate	3	1	3
Cure rate	3	1	3
TTD	3	1	3
TTR	3	0	0
Infection	2	-1 → 0	-2 → 0
Myocardial ischemia	2	-1	-2
Bleeding	2	0	0
Mucositis/Stomatitis	2	1	2
Hand-foot skin syndrome	2	0	0
Diarrhea	2	0	0
Arthralgia/Myalgia	1	0 → -1	0 → -1
Fatigue	1	1 → 0	1 → 0
Nausea/Vomiting	1	0	0

# Method overview



# 7.1: Presentation of results, single trial

## The 5-FU case



## 7.2: Real life example - many endpoints

- Another example\* we have worked with is ordinal data from a questionnaire with 78 questions rated on a discrete scale 1 – 5.
- Same questions were given to schizophrenia patients before and after to types of treatment schemes (active and control).
- The differences in scores from baseline to end-of-trial were dichotomized into three groups: Responder, adverse responder, and no change.
- Number of responders and adverse responders for active group were scored against control group (comparator).
- Green indicates active group superiority.

\* Jürgens et al., Bispebjerg Hospital, Denmark

## Responders

Global (SAPS)	48 %	14 %	38 %
Global (SAPS)	8 %	5 %	87 %
Global (UKU)	29 %	15 %	56 %
Global (UKU)	28 %	14 %	58 %
Autonomic (UKU)	33 %	37 %	30 %
Autonomic (UKU)	38 %	27 %	35 %
Autonomic (UKU)	28 %	24 %	48 %
Delusions (SAPS)	44 %	13 %	43 %
Delusions (SAPS)	10 %	7 %	83 %
Delusions (SAPS)	5 %	3 %	92 %
Delusions (SAPS)	32 %	15 %	52 %
Delusions (SAPS)	46 %	12 %	42 %
Delusions (SAPS)	31 %	16 %	53 %
Delusions (SAPS)	47 %	17 %	36 %
Delusions (SAPS)	54 %	18 %	28 %
Delusions (SAPS)	4 %	3 %	93 %
Delusions (SAPS)	54 %	20 %	26 %
Delusions (SAPS)	22 %	30 %	47 %
Delusions (SAPS)	19 %	16 %	65 %
Hallucinations (SAPS)	21 %	10 %	68 %
Hallucinations (SAPS)	18 %	11 %	71 %
Hallucinations (SAPS)	18 %	7 %	75 %
Hallucinations (SAPS)	13 %	6 %	80 %
Hallucinations (SAPS)	25 %	15 %	61 %
Hallucinations (SAPS)	23 %	9 %	68 %
Neurological (UKU)	36 %	19 %	16 %
Neurological (UKU)	38 %	27 %	35 %
Neurological (UKU)	51 %	24 %	25 %
Neurological (UKU)	32 %	37 %	31 %
Neurological (UKU)	21 %	21 %	58 %
Neurological (UKU)	35 %	17 %	47 %
Neurological (UKU)	51 %	49 %	0 %
Neurological (UKU)	52 %	29 %	19 %
Other (UKU)	40 %	27 %	33 %
Other (UKU)	13 %	17 %	70 %
Other (UKU)	39 %	15 %	46 %
Other (UKU)	36 %	12 %	0 %
Autonomic (UKU)	28 %	12 %	0 %
Autonomic (UKU)	18 %	12 %	9 %
Autonomic (UKU)	22 %	30 %	48 %
Autonomic (UKU)	19 %	16 %	65 %
Autonomic (UKU)	3 %	0 %	96 %
Autonomic (UKU)	54 %	23 %	23 %
Autonomic (UKU)	15 %	14 %	71 %
Other (UKU)	0 %	52 %	48 %
Other (UKU)	11 %	29 %	0 %
Other (UKU)	32 %	30 %	0 %
Other (UKU)	34 %	11 %	14 %
Other (UKU)	0 %	51 %	49 %
Other (UKU)	0 %	20 %	80 %
Other (UKU)	62 %	20 %	18 %
Other (UKU)	0 %	50 %	50 %
Other (UKU)	38 %	27 %	35 %
Psychological (UKU)	12 %	10 %	78 %
Psychological (UKU)	14 %	23 %	62 %
Psychological (UKU)	17 %	13 %	70 %
Psychological (UKU)	22 %	14 %	65 %
Psychological (UKU)	17 %	9 %	74 %
Psychological (UKU)	44 %	20 %	36 %
Psychological (UKU)	47 %	15 %	38 %
Autonomic (UKU)	39 %	27 %	34 %
Dryness of mouth (UKU)	32 %	13 %	56 %
Dryness of mouth (UKU)	54 %	18 %	27 %
Dryness of mouth (UKU)	37 %	18 %	45 %
Dryness of mouth (UKU)	20 %	11 %	69 %
Other (UKU)	20 %	20 %	60 %
Other (UKU)	14 %	23 %	63 %
Other (UKU)	0 %	100 %	0 %
Other (UKU)	53 %	23 %	23 %
Other (UKU)	52 %	29 %	19 %
Other (UKU)	52 %	30 %	0 %
Psychological (UKU)	55 %	7 %	9 %
Psychological (UKU)	33 %	15 %	52 %
Psychological (UKU)	7 %	14 %	80 %

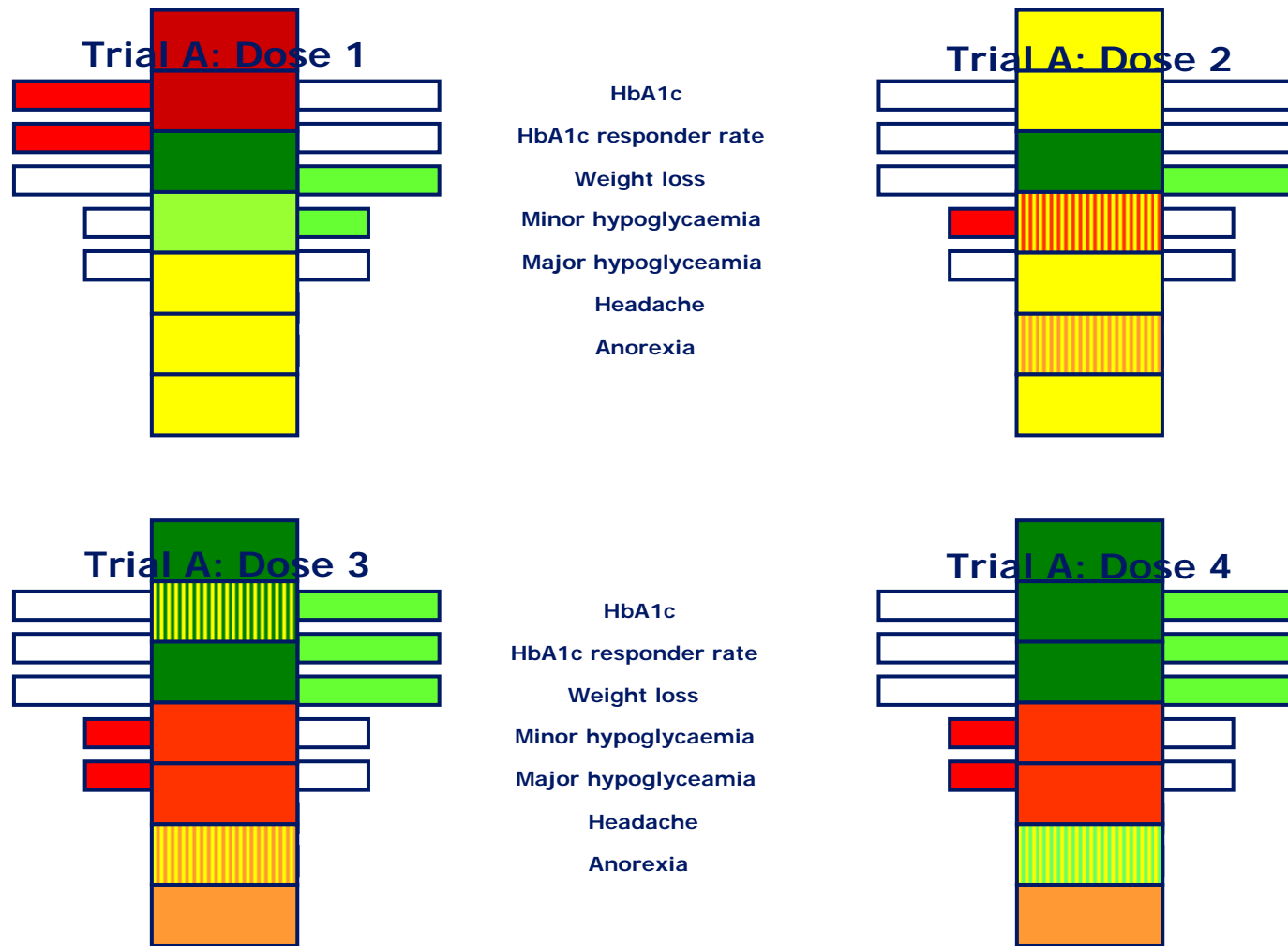
Global rating of hallucinations
Global rating of delusions
Global UKU score (patient)
Global UKU score (doctor)
Nausea/Vomiting (last 3 days)
Diarrhoea
Obstipation
Persecutory delusions
Delusions of jealousy
Delusions of guilt or sin
Grandiose delusions
Religious delusions
Somatic delusions
Delusions of reference
Delusions of being controlled
Delusions of mind reading
Thought broadcasting
Thought insertion
Thought withdrawal
Auditory hallucinations
Voices commenting
Voices conversing
Somatic or tactile hallucinations
Olfactory hallucinations
Visual hallucinations
Dystonia (last 3 days)
Rigidity
Hypochinesia/akinesia
Hyperkinesia
Tremor
Akatisia
Epileptic seizures
Paraesthesia
Rash
Amenorrhea (last 3 months)
Decreased libido
Erective dysfunction
Accommodation disorders
Decreased saliva production
Dysuria (last 3 days)
Polyuria/polydipsia
Orthostatic dizziness
Palpitations, tachycardia
Increased perspiration
Pruritus
Light sensitivity
Increased pigmentation
Weight gain
Galactorrhea
Gynecomastia
Orgasme Dysfunction
Dryness in vagina
Headache
Asthenia
Sedation
Depression
Tension
Increased sleep length (last 3 days)
Decreased sleep length (last 3 days)
Increased dream activity (last 3 days)
Increased saliva production
Dry mouth
Problems swallowing
Need of fluid when swallowing
To much or little saliva
Weight loss
Menorrhagia (last 3 months)
Increased libido (det. by partner)
Ejaculation dysfunction
Physical addiction (last 3 months)
Mental addiction (last 3 months)
Concentration disorder
Memory failure
Emotional indifference

## Adverse responders

Global (SAPS)	50 %	12 %	38 %
Global (SAPS)	21 %	15 %	64 %
Global (UKU)	35 %	27 %	37 %
Global (UKU)	0 %	32 %	68 %
Autonomic (UKU)	30 %	15 %	54 %
Autonomic (UKU)	28 %	17 %	15 %
Autonomic (UKU)	56 %	17 %	27 %
Delusions (SAPS)	37 %	18 %	45 %
Delusions (SAPS)	26 %	12 %	62 %
Delusions (SAPS)	27 %	9 %	64 %
Delusions (SAPS)	52 %	15 %	32 %
Delusions (SAPS)	53 %	16 %	31 %
Delusions (SAPS)	56 %	19 %	25 %
Delusions (SAPS)	28 %	16 %	56 %
Delusions (SAPS)	34 %	27 %	39 %
Delusions (SAPS)	28 %	9 %	63 %
Delusions (SAPS)	23 %	14 %	63 %
Delusions (SAPS)	45 %	17 %	38 %
Delusions (SAPS)	5 %	4 %	91 %
Hallucinations (SAPS)	26 %	11 %	11 %
Hallucinations (SAPS)	62 %	11 %	27 %
Hallucinations (SAPS)	13 %	7 %	81 %
Hallucinations (SAPS)	40 %	11 %	49 %
Hallucinations (SAPS)	25 %	12 %	63 %
Hallucinations (SAPS)	43 %	13 %	44 %
Neurological (UKU)	28 %	20 %	54 %
Neurological (UKU)	36 %	22 %	0 %
Neurological (UKU)	37 %	23 %	40 %
Neurological (UKU)	28 %	20 %	51 %
Neurological (UKU)	37 %	33 %	0 %
Neurological (UKU)	48 %	21 %	31 %
Neurological (UKU)	49 %	51 %	0 %
Neurological (UKU)	47 %	24 %	28 %
Other (UKU)	36 %	34 %	0 %
Other (UKU)	49 %	19 %	32 %
Other (UKU)	32 %	15 %	54 %
Other (UKU)	59 %	21 %	21 %
Autonomic (UKU)	24 %	23 %	53 %
Autonomic (UKU)	33 %	14 %	53 %
Autonomic (UKU)	30 %	37 %	33 %
Autonomic (UKU)	28 %	18 %	54 %
Autonomic (UKU)	45 %	17 %	38 %
Autonomic (UKU)	16 %	19 %	65 %
Autonomic (UKU)	44 %	15 %	41 %
Other (UKU)	36 %	18 %	46 %
Other (UKU)	18 %	28 %	54 %
Other (UKU)	48 %	52 %	0 %
Other (UKU)	47 %	14 %	39 %
Other (UKU)	0 %	30 %	70 %
Other (UKU)	38 %	31 %	0 %
Other (UKU)	55 %	13 %	31 %
Other (UKU)	13 %	23 %	64 %
Other (UKU)	53 %	14 %	34 %
Psychological (UKU)	36 %	12 %	24 %
Psychological (UKU)	19 %	9 %	12 %
Psychological (UKU)	53 %	14 %	33 %
Psychological (UKU)	30 %	12 %	58 %
Psychological (UKU)	47 %	21 %	32 %
Psychological (UKU)	29 %	16 %	55 %
Psychological (UKU)	63 %	15 %	21 %
Autonomic (UKU)	8 %	12 %	80 %
Dryness of mouth (UKU)	12 %	8 %	81 %
Dryness of mouth (UKU)	24 %	12 %	64 %
Dryness of mouth (UKU)	3 %	4 %	94 %
Dryness of mouth (UKU)	53 %	16 %	32 %
Other (UKU)	16 %	16 %	68 %
Other (UKU)	38 %	32 %	0 %
Other (UKU)	50 %	36 %	21 %
Other (UKU)	30 %	14 %	7 %
Other (UKU)	38 %	8 %	8 %
Other (UKU)	39 %	8 %	10 %
Psychological (UKU)	25 %	14 %	61 %
Psychological (UKU)	37 %	14 %	15 %
Psychological (UKU)	0 %	8 %	92 %

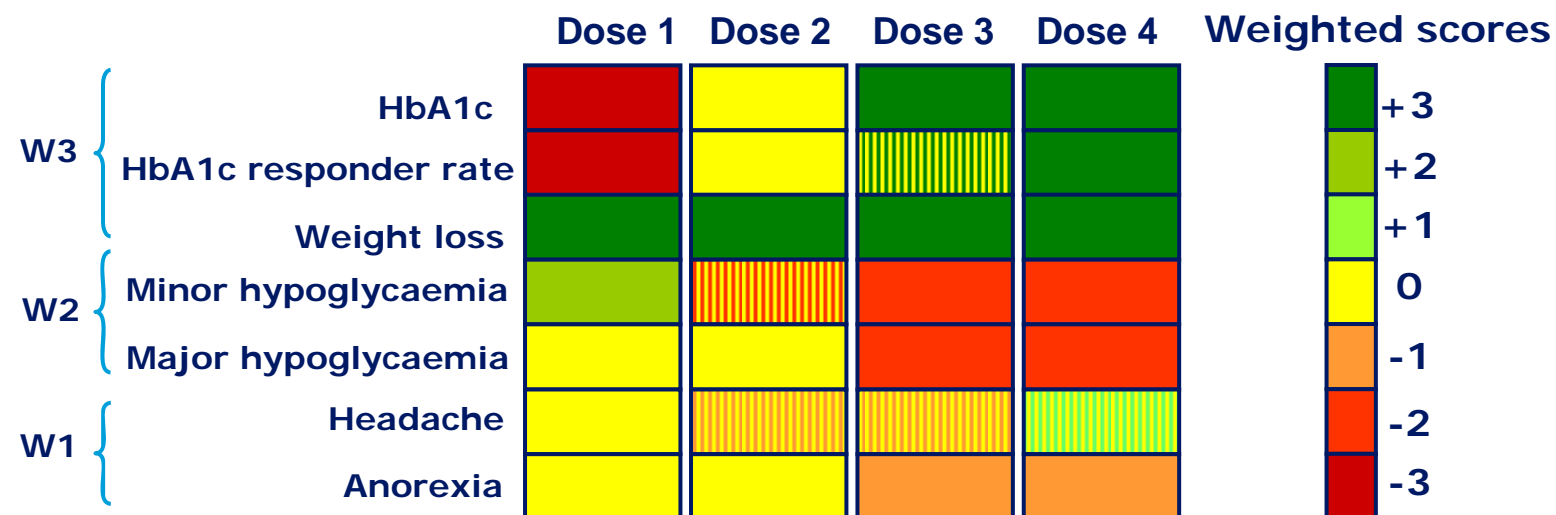
Global rating of hallucinations
Global rating of delusions
Global UKU score (patient)
Global UKU score (doctor)
Nausea/Vomiting (last 3 days)
Diarrhoea
Obstipation
Persecutory delusions
Delusions of jealousy
Delusions of guilt or sin
Grandiose delusions
Religious delusions
Somatic delusions
Delusions of reference
Delusions of being controlled
Delusions of mind reading
Thought broadcasting
Thought insertion
Thought withdrawal
Auditory hallucinations
Voices commenting
Voices conversing
Somatic or tactile hallucinations
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Dystonia (last 3 days)
Rigidity
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Hyperkinesia
Tremor
Akatisia
Epileptic seizures
Paraesthesia
Rash
Amenorrhea (last 3 months)
Decreased libido
Erective dysfunction
Accommodation disorders
Decreased saliva production
Dysuria (last 3 days)
Polyuria/polydipsia
Orthostatic dizziness
Palpitations, tachycardia
Increased perspiration
Pruritus
Light sensitivity
Increased pigmentation
Weight gain
Galactorrhea
Gynecomastia
Orgasme Dysfunction
Dryness in vagina
Headache
Asthenia
Sedation
Depression
Tension
Increased sleep length (last 3 days)
Decreased sleep length (last 3 days)
Increased dream activity (last 3 days)
Increased saliva production
Dry mouth
Problems swallowing
Need of fluid when swallowing
To much or little saliva
Weight loss
Menorrhagia (last 3 months)
Increased libido (det. by partner)
Ejaculation dysfunction
Physical addiction (last 3 months)
Mental addiction (last 3 months)
Concentration disorder
Memory failure
Emotional indifference

## 7.3: Dose-finding trials



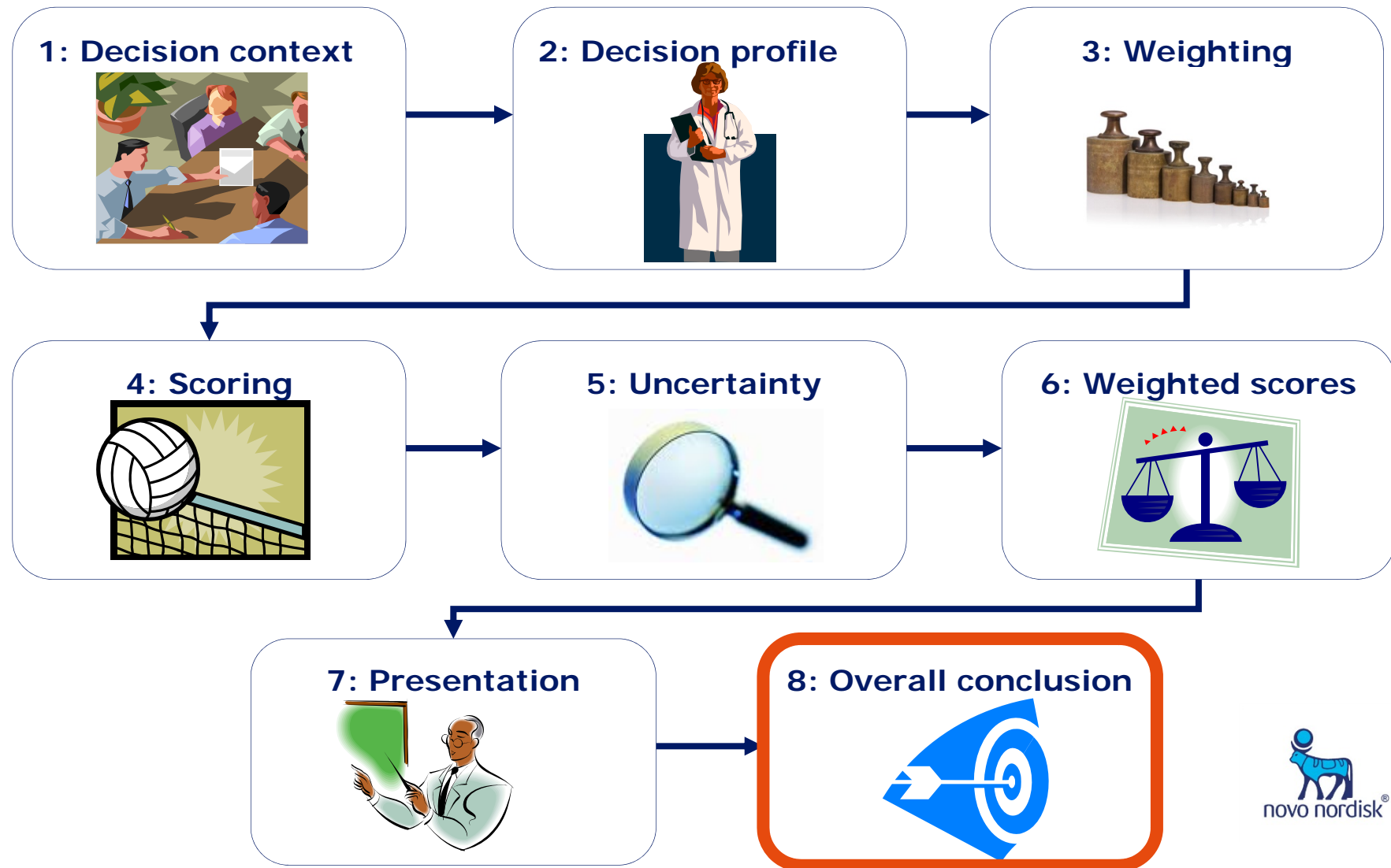


## 7.3: Dose-finding trials



What is the optimal dose....?

# Method overview



## 8: Overall conclusion

- A **clinically significant and relevant difference** for the high importance criteria cure rate, survival rate, and TTD was found in favour of the MDR-1 group.
- A higher risk of severe cases of the medium importance criterion myocardial ischemia and a slightly higher risk for the medium importance criterion infection were seen in the MDR-1 group.
- The **clinical implications** of this study are that genetic profiling is advisable in patients with colorectal cancer, to enable individualised treatment and follow-up.

# Conclusions of talk

- **Transparency** in decision making increase credibility of the assessment and can be secured by:
  - Following a structured framework
  - Justification of choices at critical steps in the assessment
  - Being consistent with previous decisions

# Conclusions of talk

- Discussion of **clinical significance** of data support decision making in greater perspective and can be incorporated by:
  - Considering proportion of patients experiencing an effect
  - Being proactive and looking for tendencies in sparse data, instead of rejecting any signal due to high confidence level
- **Visualisation** tools help comprehend more data at the same time.

# Further reading

- *A comprehensive approach to benefit-risk assessment in drug development.*  
Sarac et al. (2012).  
<http://dx.doi.org/10.1111/j.1742-7843.2012.00871.x>
- *Data-Driven assessment of the association of polymorphisms in 5-fluorouracil metabolism genes with outcome in adjuvant treatment of colorectal cancer.*  
Sarac et al. (2012).  
<http://dx.doi.org/10.1111/j.1742-7843.2012.00885.x>

**Thank you for your attention.**

**Questions?**