



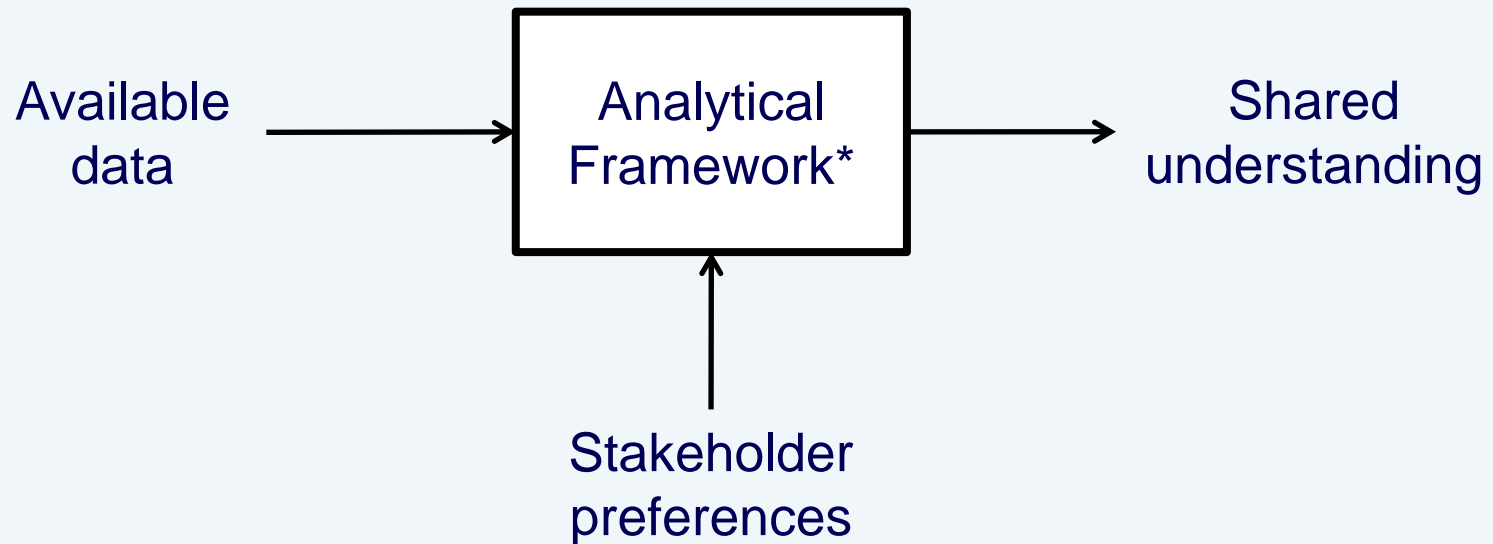
# **Quantitative benefit-risk assessment: An analytical framework for a shared understanding of the effects of medicines**

**Patrick Ryan**  
**21 April 2010**

# Challenges in understanding the effects of medicines



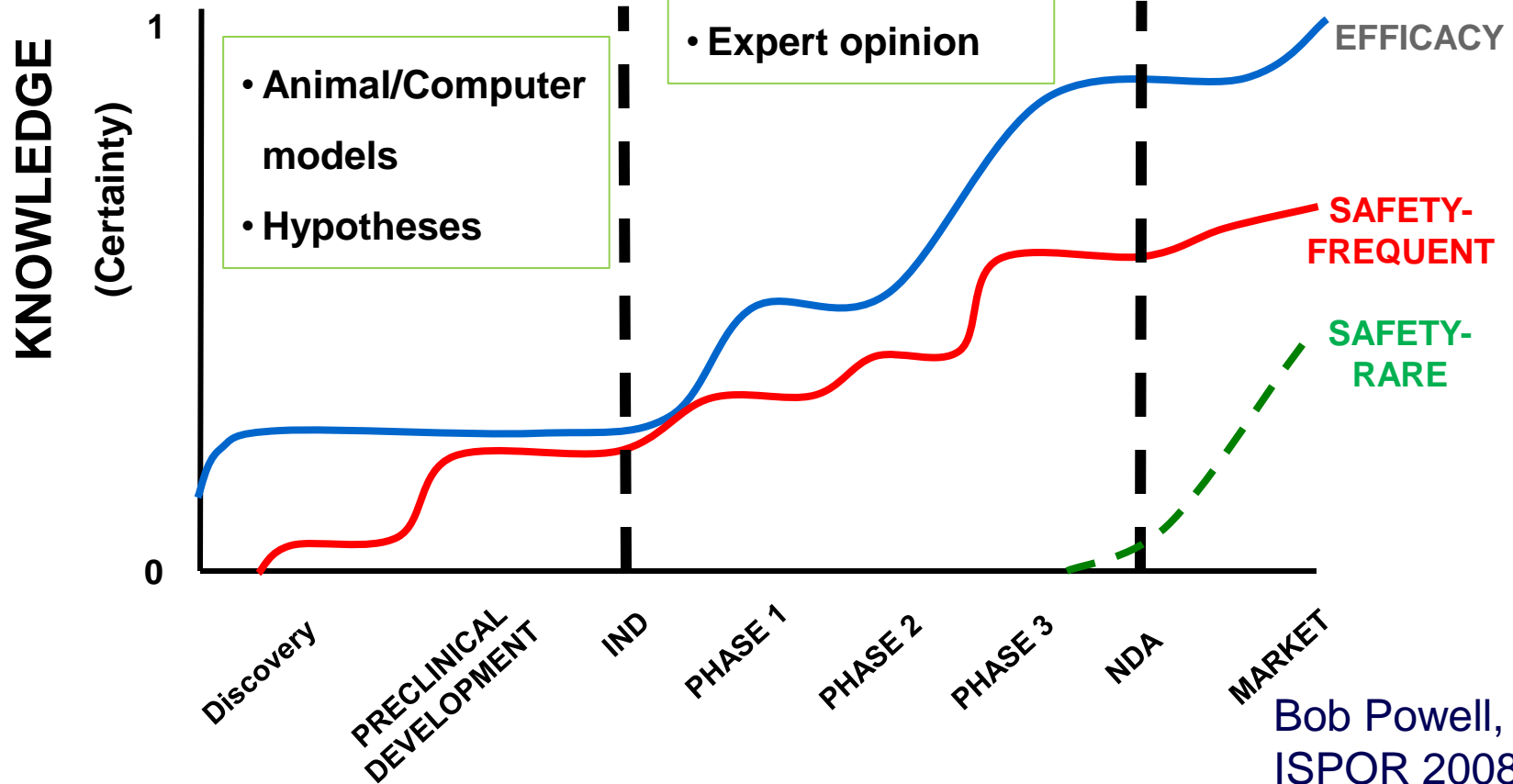
# Benefit-risk analysis process



\*tailored to the complexity of the decision

# Diversity of data availability

Potential imbalance in data availability between alternative treatments

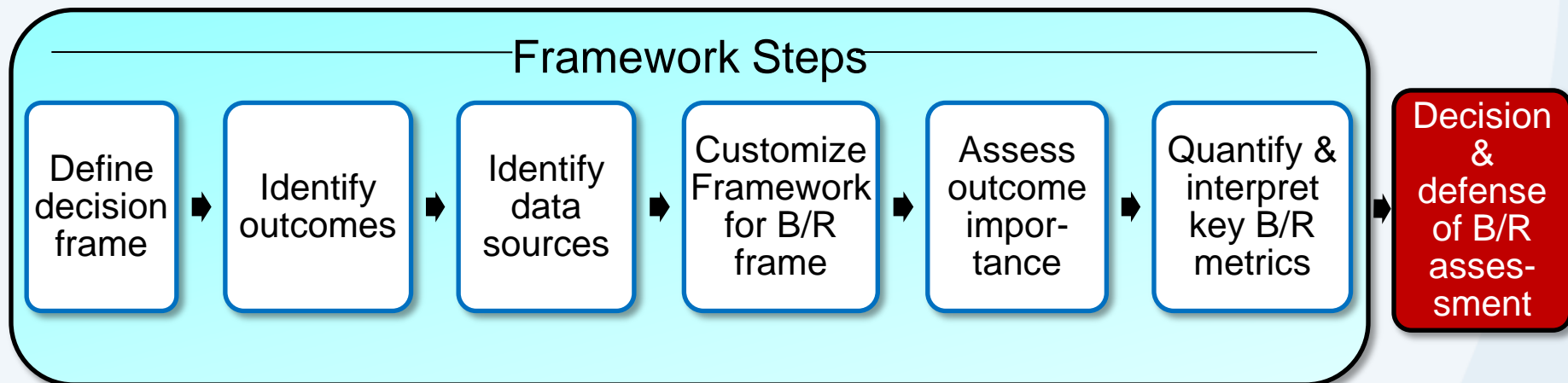


# Components of an analysis framework

- Define decision
- Identify health outcomes
- Synthesize data
- Model decision and conduct analysis
- Interpret and evaluate results

# PhRMA Benefit Risk Action Team (BRAT) Framework

- A set of principles, processes and tools to guide decision-makers in
  - Selecting
  - Organizing
  - Understanding
  - SummarizingEvidence relevant to benefit-risk decisions



# Define decision

- Multiple stakeholders face decisions throughout the medical product lifecycle:

Industry : **Do we continue investing?**

Regulatory: **Do we approve?**

Payer: **Do we reimburse?**

Provider: **Is this best for my patients?**

Patient: **Is this the best drug for me?**

- Analysis needs to be flexible to accommodate diverse perspectives to inform stakeholder decision-making processes

# Illustrative example: Identify health outcomes

No  
Disease

No  
Disease  
& AE

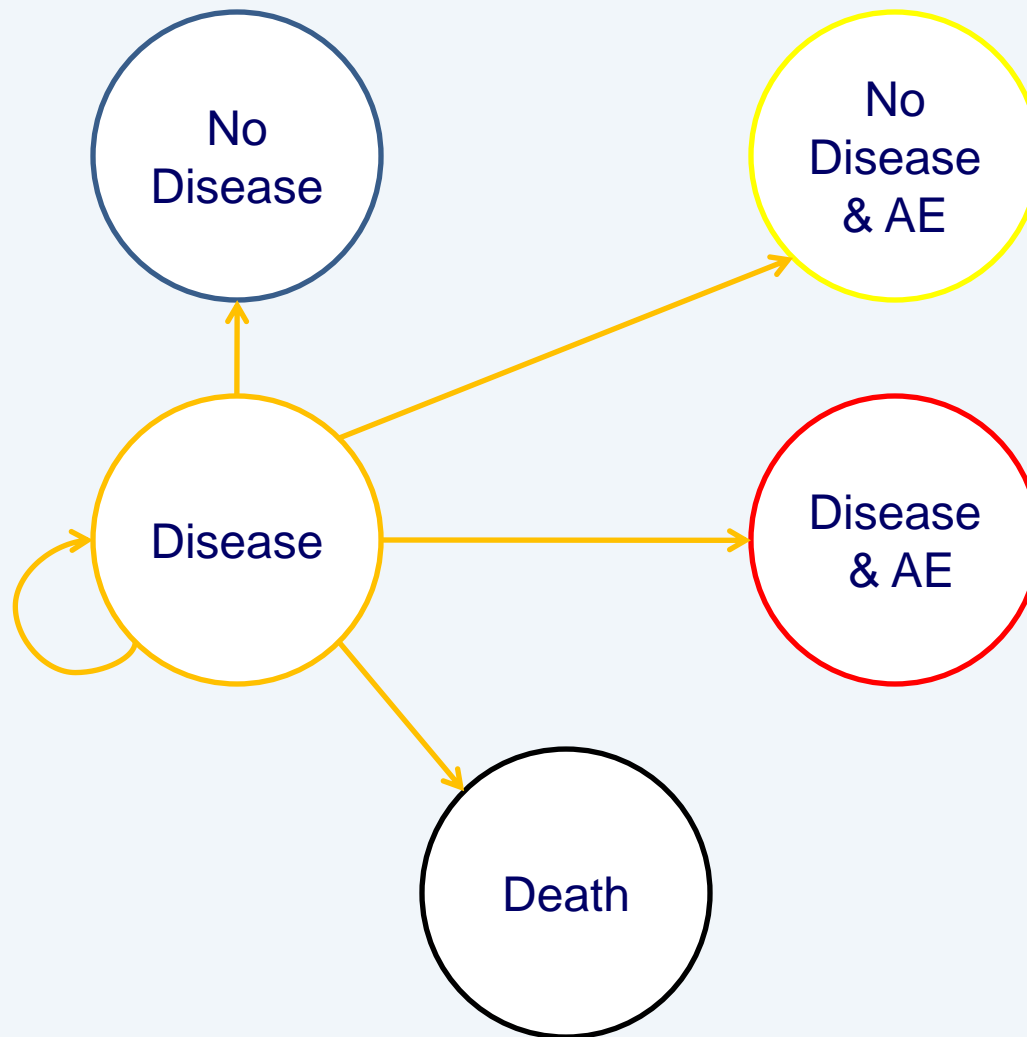
Disease

Disease  
& AE

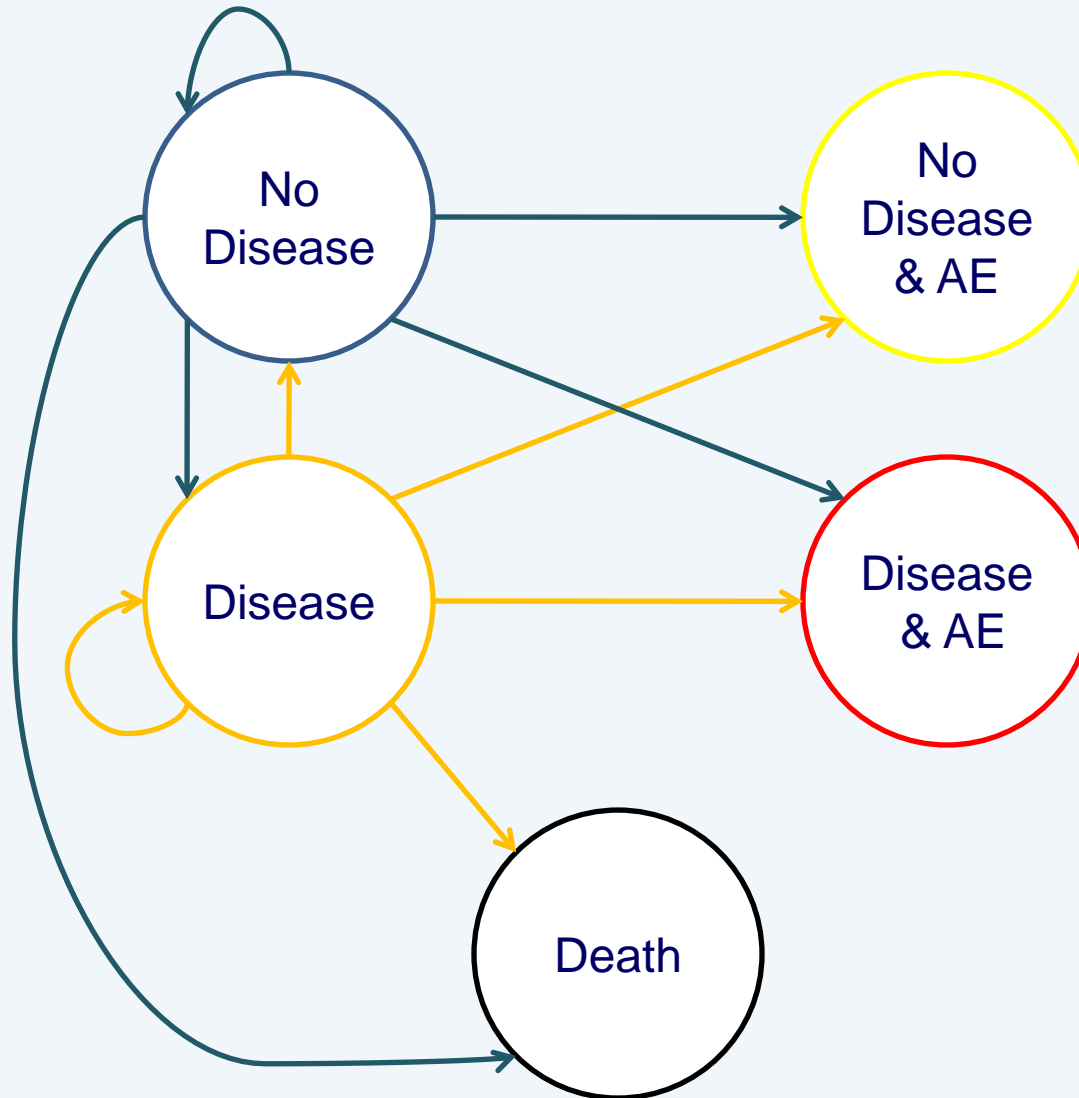
Death



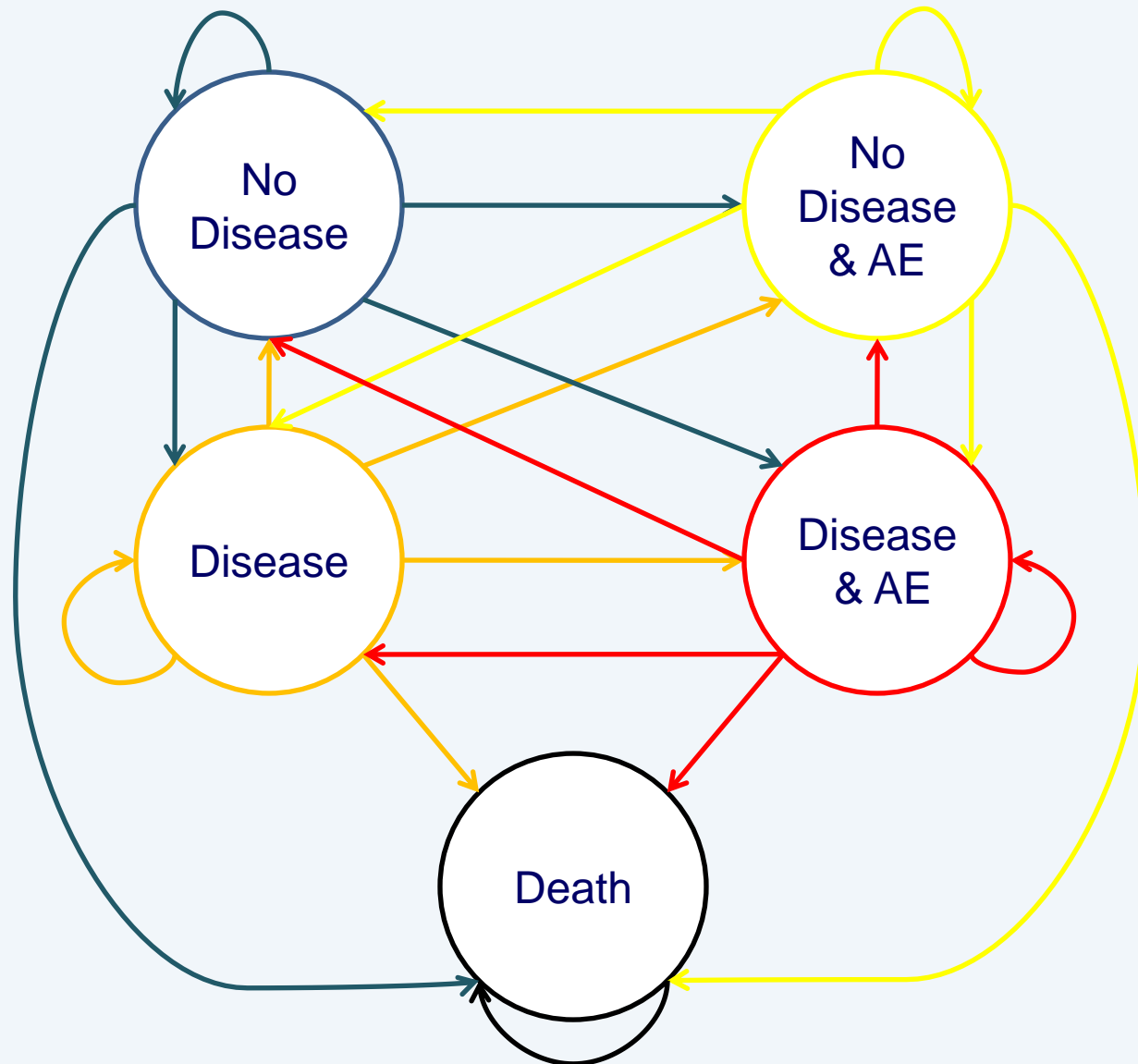
# Illustrative example: Transitions between health states



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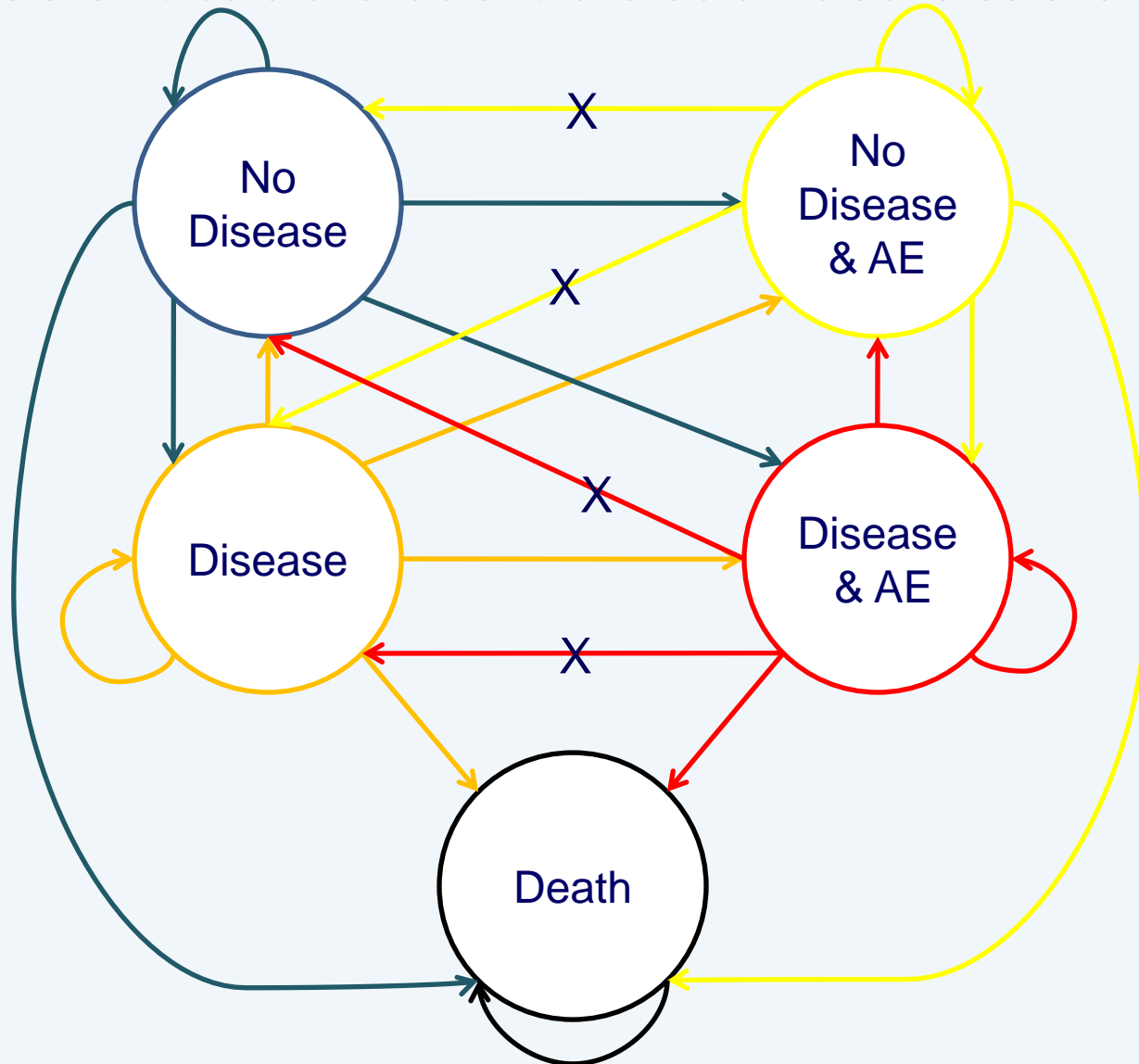


# Illustrative example: Building a full model



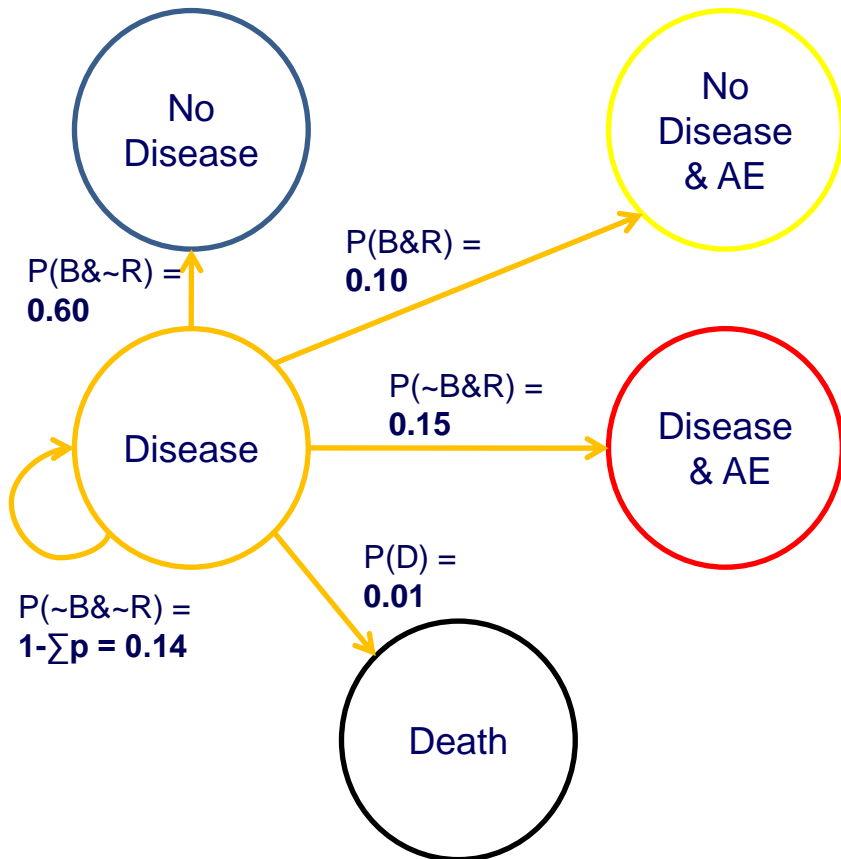
# Illustrative example: Modeling meets data challenges

What if there are no data available to characterize adverse event resolution?

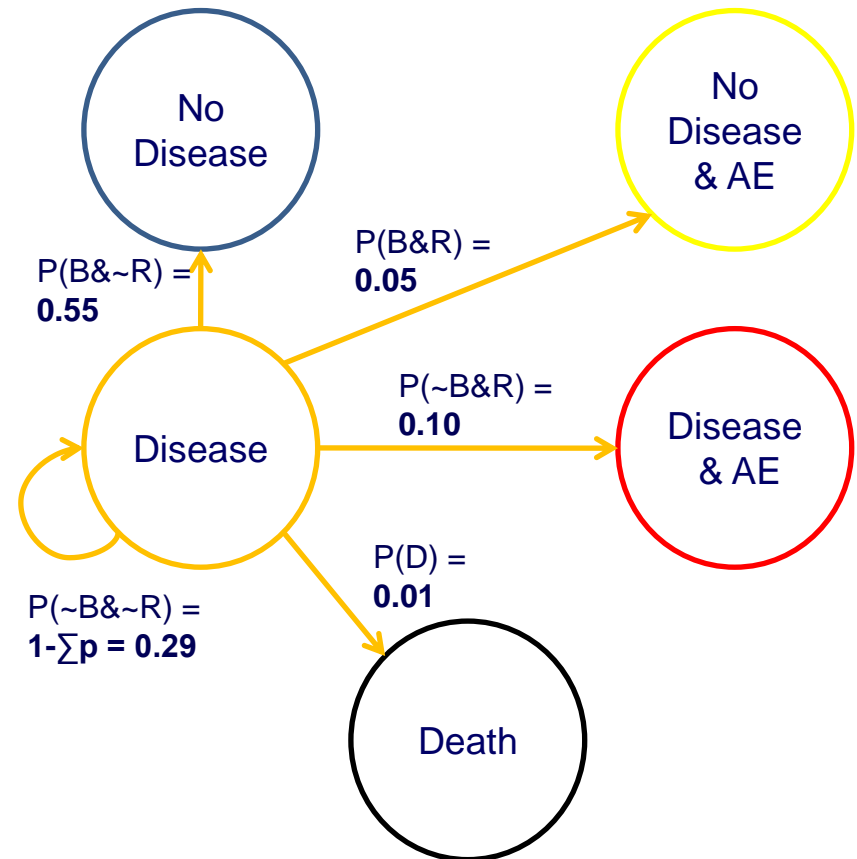


# Comparing alternative treatments

Treatment A:  
70% benefit, 25% risk



Treatment B:  
60% benefit, 15% risk



# Potential tradeoffs in a benefit-risk analysis

- **Competing risks**

Ex: rofecoxib vs. NSAID: GI bleed vs. acute myocardial infarction

- **Competing benefits**

Ex: RA: inflammation pain relief vs. QoL measures

- **Higher benefit and higher risk**

Ex: natalizumab : MS treatment vs. PML

- **Outcomes occurring at different times**

Ex: chemotherapy: immediate nausea, alopecia vs. long-term survival

- **Varying uncertainty**

Ex: Typical vs. atypical antipsychotics

Any or all of these tradeoffs can play out in a given decision:

Multiple competing benefits with multiple competing risks over time

# Translating concept into practice

## Ideal scenario

Each drug has one dose.....

Patient data for both drugs.....

Clear choice of B&Hs.....

All B&H reported as rates.....

Event times are equally spaced....

Undisputed trade-offs.....

Events occur independently.....

Patients have same baseline risks.

## Real scenario

Multiple dose regimens

Aggregate summaries from literature

Single AEs or 'Any Grade 4'?

Mix of rates, ratios, means

Event are sporadic or nonlinear

No preference data

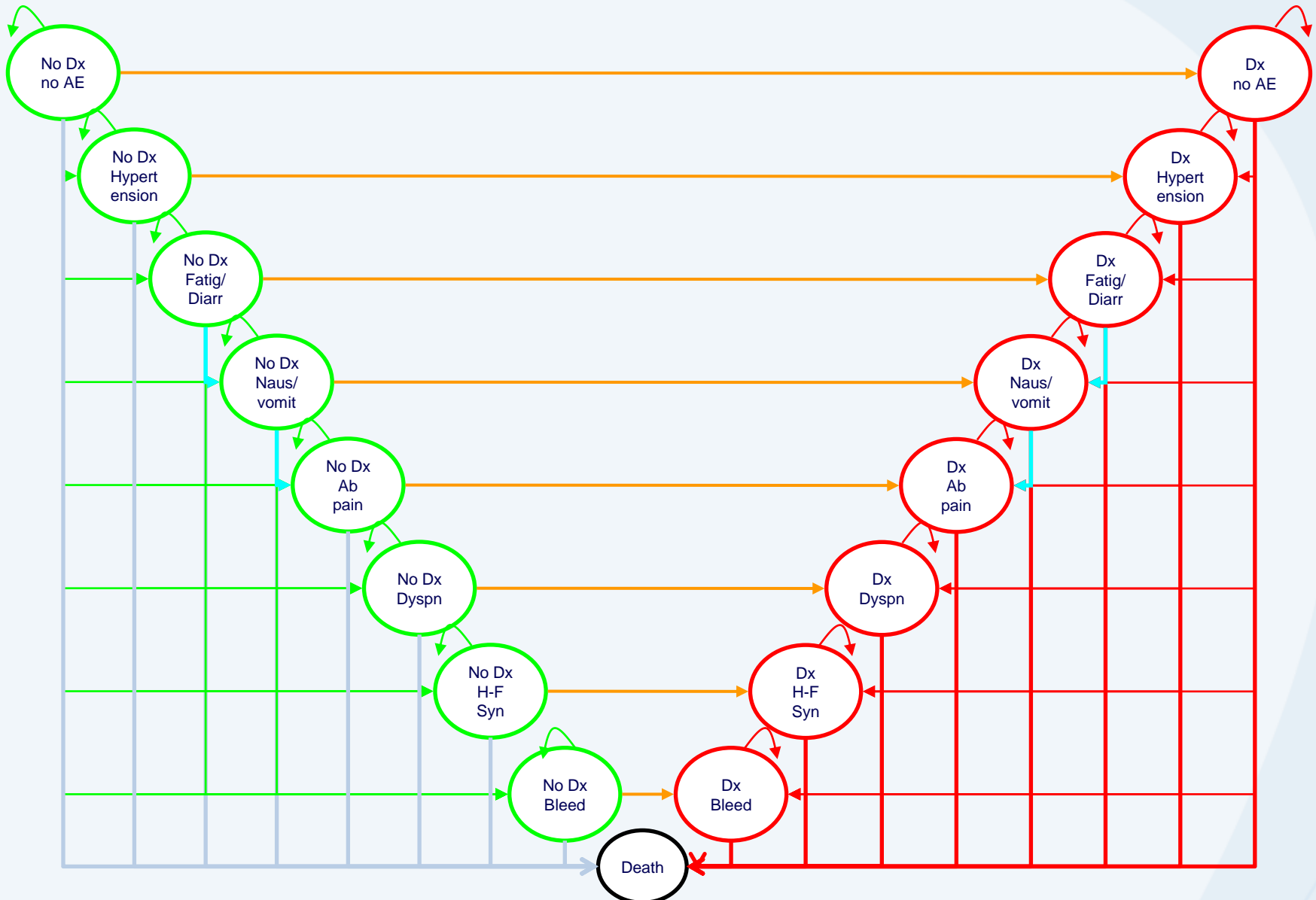
Don't know if events are correlated

Different patient subgroups





# Real example: Preventative Therapy



# Identify Health States

## **Set Objective Selection Criteria:**

- Clinical benefits
- Functional / QoL harms or benefits
- AEs occurring in  $>\underline{x}\%$  of patients
- AEs graded  $\underline{x}$  or higher
- AEs related to treatment discontinuation
- AEs with known drug class effects
- AEs that are nonreversible
- Rare AEs that received regulatory warnings

**Determine which health states should be combined into a single state or split into two states.**

**Decide best length of time for 1 event per interval.**

# Synthesizing Data

## ex. preventative therapy

Treatment	Placebo		Drug		Comparator		Utility	
Benefits	Value	Source	Value	Source	Value	Source	Value	Source
<b>% Disease-free - Disease</b>							0.8	Expert opinion
Months 0-3	1.00	RCT-301	1.00	RCT-301	1.00	JAMA 2007		
Months 3-6	0.90	RCT-301	1.00	RCT-301	1.00	JAMA 2007		
Months 6-9	0.80	RCT-301	0.95	RCT-301	0.90	JAMA 2007		
Month 9-12	0.70	RCT-301	0.90	RCT-301	0.80	JAMA 2007		
<b>% Alive-Death</b>							1.0	HlthAffairs 2000
Months 0-3	1.00	ISE	1.00	ISE	1.00	BMJ 2008		
Months 3-6	0.86	ISE	0.95	ISE	0.95	BMJ 2008		
Months 6-9	0.76	ISE	0.90	ISE	0.86	BMJ 2008		
Month 9-12	0.67	ISE	0.86	ISE	0.76	BMJ 2008		
Risks	Value	Source	Value	Source	Value	Source	Value	Source
Nausea	0.10	ISS	0.15	ISS	0.12	USPI	0.1	Lancet 2002
Hepatic	0.00	ISS	0.02	ISS	0.00	USPI	0.5	Hepatology 2003
Cardiac	0.00	ISS	0.00	ISS	0.03	GPRD	0.6	Heart 2007

# Synthesizing Data continued

## Data Limitation



## Assumption?

Data come from  $\geq 1$  study

Safety data for combined doses

Safety data reported as cumulative incidence

An AE is not reported for comparator

Study populations are comparable

Safety events are not dose-related

Events occur at a constant rate

Probability is either 0 or below x%

# Integrate Data into Analysis

**There are many methods for integrating the data.**

**A few examples include:**

**Decision Trees**

**Markov Models**

**Discrete-event simulation**

**etc.**

**Your choice may depend on decisions around :**

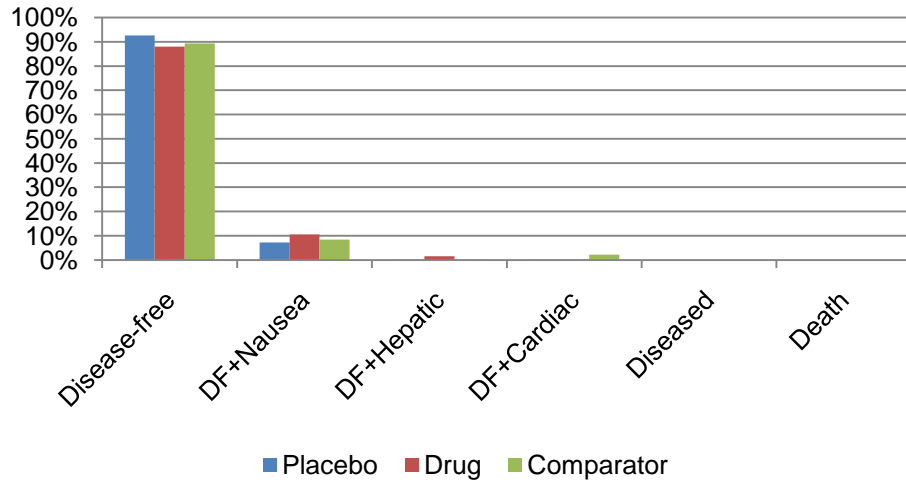
**Data** (individual patient data vs. summary statistics)

**Uncertainty** (patient, outcome & parameter variability)

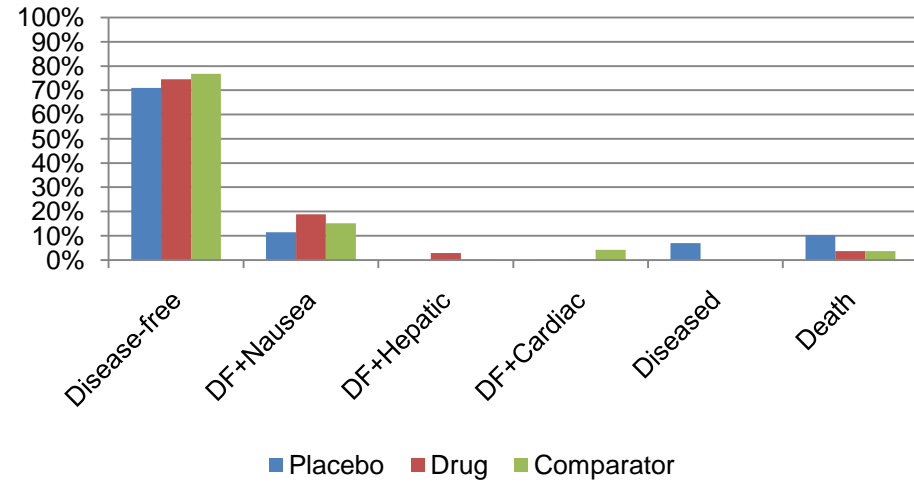
**Output Metrics** (Person-time, INB, QALYs, etc.)

# Visualization of Output: No. of patients in each health state by month

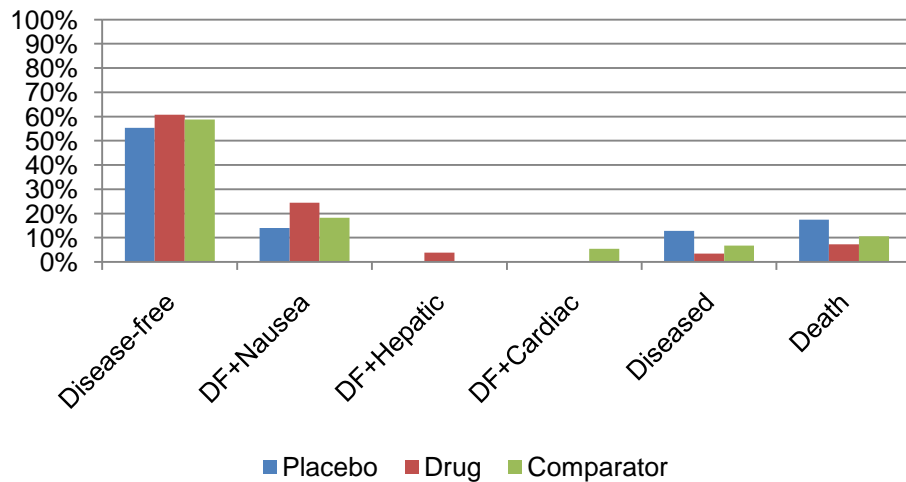
Person status at 3 months



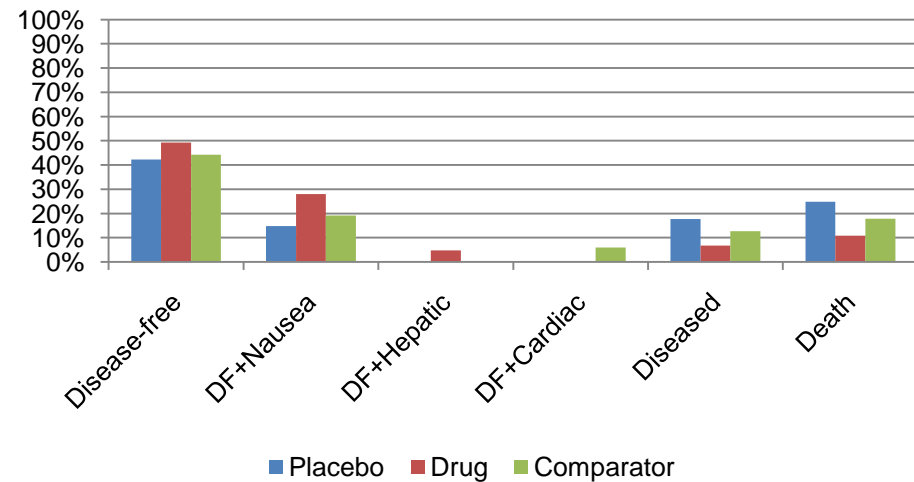
Person status at 6 months



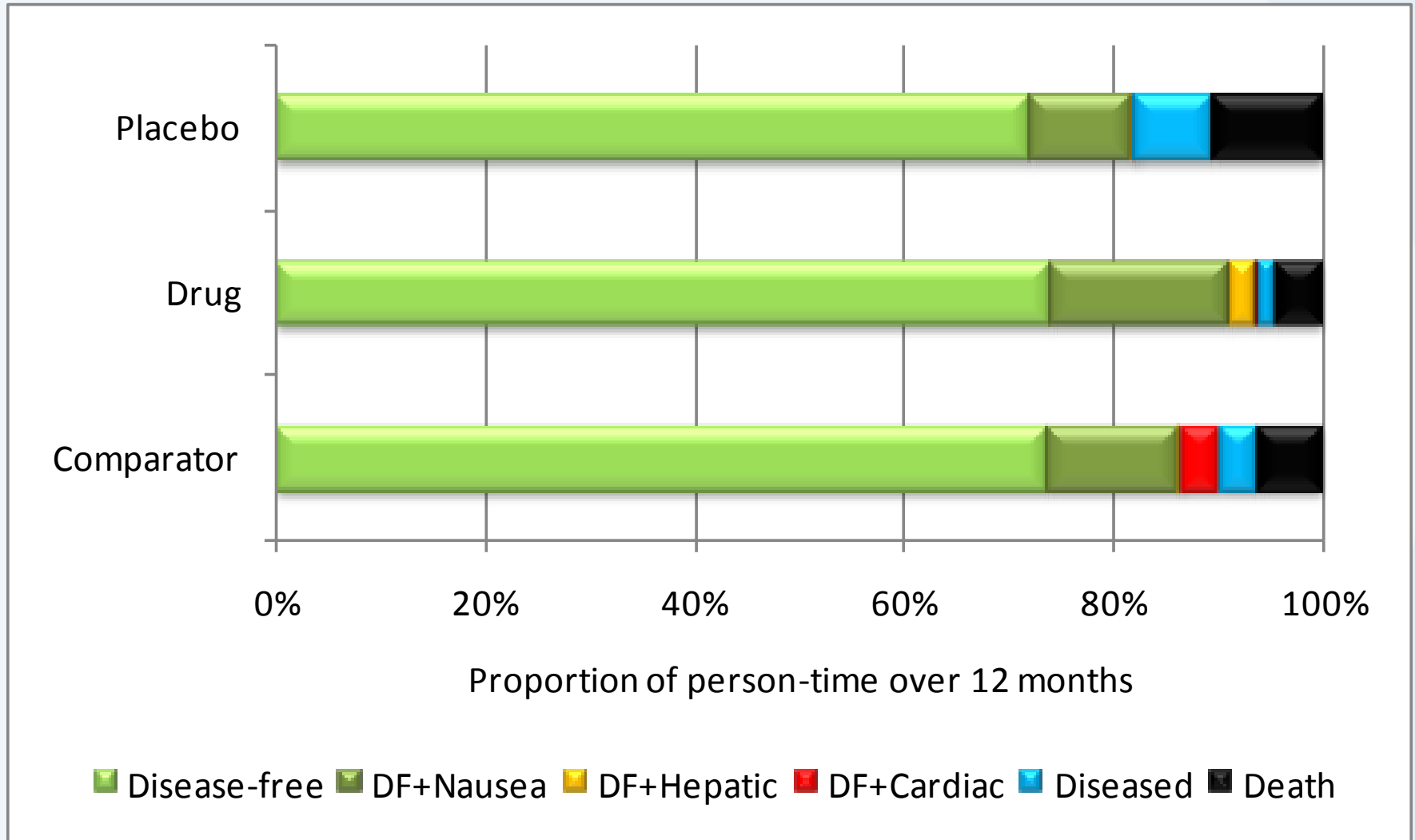
Person status at 9 months



Person status at 12 months



# Visualization of Output: Person-time in each health state by month 12

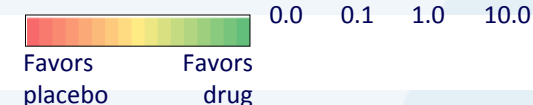


# BRAT Framework Key Benefit-Risk Summary Table

- Top level representation of information in the framework
- The most critical view that decision makers will have on the data

Outcome		Incidence: study drug (%)	Incidence: placebo (%)	Adjusted RR (95% CI)	Forest Plot of Adjusted RR (Log Scale)	
Benefits	Cardio-vascular Issues	Angina requiring CABG	0.11	0.19	0.59 (0.32, 1.10)	
		Coronary heart disease death	1.52	1.65	1.00 (0.64, 1.56)	
		Lipid levels meet target*	67.00	29.00	2.12 (1.77, 2.55)	
		Nonfatal myocardial infarction	0.66	1.30	0.51 (0.05, 5.56)	
	Ischemic Stroke	Fatal ischemic stroke	0.91	1.73	0.57 (0.35, 0.95)	
		Nonfatal ischemic stroke	2.34	2.88	0.84 (0.71, 0.98)	
Risks	Liver Damage	Hepatitis with hospitalization	—	—	—	
		Hepatitis without hospitalization	—	—	—	
		Liver failure*	0.013	0.0095	1.35 (0.16, 11.69)	
		Persistently elevated transaminases	0.26	0.19	1.35 (0.80, 2.29)	
	Muscle Damage	Myopathy	0.11	0.10	1.11 (0.52, 2.37)	
		Rhabdomyolysis*	0.011	0.01	1.11 (0.13, 9.59)	
		Severe rhabdomyolysis leading to kidney failure*	0.0006	0.0005	1.11 (0.07, 25.61)	

\* Mock data for visualization purpose only





# Evaluate results

## **Check the robustness of the results**

- Are the assumptions still reasonable?
- Do sensitivity analyses show which factors drive the results?
- Do utilities or preference weights shift the emphasis?

**Does the analysis need more data or fewer assumptions?**

**Is the information provided sufficient for clear & transparent decision-making?**

# Concluding thoughts

- The goal is to gain a “*shared understanding*” of benefit:risk trade-offs between alternative treatments
- Explicitly stated data & modeling assumptions add transparency to direct and indirect comparisons
- The primary limitation is often available data rather than methodology
- Stakeholders can explore a range of benefit:risk trade-offs, from a patient to societal perspectives
- Statisticians have a significant opportunity to lead this quantitative process to meaningfully inform the appropriate use of medical products

# Benefit-risk analysis: enabling the view of the bigger picture



# Questions?

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**The End**

# Backup Slides

# Definitions

Term	Definition
Discrete-event simulation	Models events that occur at an instant in time, marking a change of state; assess individual patients sampled from distributions of baseline characteristics.
Markov model	Models uncertain events as transitions between health states; assesses a cohort's risk over time. Transition probability does not depend on previous transition.
Uncertainty	Variability in patients, subgroups, outcomes, parameters and model specifications.
Utility	Weighted conversion used to normalize benefits and harms to the same scale; e.g. health-related quality of life or conjoint preference weights.
Value Tree	

# Recommended Reading

Lynd L and O'Brien B, Advances in risk-benefit evaluation using probabilistic simulation methods: an application to the prophylaxis of deep vein thrombosis, *Journal of Clinical Epidemiology* 57 (2004) 795–803. Keywords: **Monte Carlo simulation**.

Lynd L, et.al. Using the Incremental Net Benefit Framework for Quantitative Benefit–Risk Analysis in Regulatory Decision-Making—A Case Study of Alosetron in Irritable Bowel Syndrome, *Value in Health*, 2009. Keywords: **Discrete-event simulation**.

Mussen F, et. al. A quantitative approach to benefit-risk assessment of medicines – part 1: The development of a new model using multi-criteria decision analysis, *Pharmacoepidemiology and Drug Safety*, 2007. **Keyword: Value tree**.

Minelli C, et. al., Benefits and harms associated with hormone replacement therapy: clinical decision analysis, *BMJ* 2004. Keywords: **Markov Chain Monte Carlo Simulation**.