# Decision analytic models for tests – decision trees

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## **Learning Objectives**

Diagnostic accuracy measures, together with prevalence, can be used within **decision tree models** to model intermediate outcomes

An example decision tree model is provided to illustrate the key concepts

## **Decision Tree models**

• A decision tree utilizes a flow diagram to show the logical structure of the problem



• Think of time flowing from left to right, with each of the branches depicting the possible patient pathways, contingent on particular events.



**Decision nodes** – the square nodes represent a **choice** for the decision maker.





<u>**Terminal nodes</u>** – triangular nodes represent the **endpoint** of the model and are assigned value(s) or *payoff(s)*. These payoffs can be utility, costs, or anything else thought to be an important outcome.</u>

- 1. Formulate the decision tree structure
- 2. Assign event probabilities
- 3. Assign effects (e.g. QALYs)
- 4. Assign costs
- 5. Weight costs and effects by pathway probabilities
- 6. Calculate ICER

## Simple test example – Low dose CT vs. Chest X-Ray for lung cancer screening\*

**1. Formulate the decision tree structure** 

\*Note that this is an example model intended for teaching purposes only – it is not intended to inform clinical practice



## Simple test example – Low dose CT vs. Chest X-Ray for lung cancer screening

- 1. Formulate the decision tree structure
- 2. Assign event probabilities



Test data		
Prevalence	3.0%	
LDCT Sensitivity	93.8%	
LDCT Specificity	73.4%	

- Prevalence used to set proportion with/ without cancer
- LDCT sensitivity used to set proportion Test +/ Test- in the cancer group
- LDCT specificity used to set proportion Test +/- in the no cancer group

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5-year QALY data				
Treated cancer	3.50			
Missed cancer	1.70			
No cancer, correctly not referred	4.50			
No cancer, incorrectly referred	4.48			

For QALYs, assign relevant QALY value to each model branch (e.g. for the top branch, [Cancer, Test+], the relevant QALY value is 'Treated cancer' (3.50)

Cost data				
LDCT	\$139			
CXR	\$31			
Referral	\$700			
Cancer treatment (average 5 year cost)	\$25,200			
Missed cancer (average 5 year cost)*	\$56,560			

 For costs, add up all the costs that occur along the given branch (e.g. for the top branch, the cost consists of LDCT + Referral + Cancer treatment = \$139 + \$700 + \$25,200 = \$26,039 Note that we've taken a shortcut here...

- 5-year cost and QALYs have been "bolted on" to the TP/TN/FP/FN branches
- Often this kind of data may not be available
- In that case, long term outcomes would need to be modelled, e.g. using a Markov Model
  (see Dr Beth Shinkin's session on this)

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- The full **pathway probabilities** for a given branch of the tree are calculated by multiplying through by the individual event probabilities
- E.g. For the top pathway, the pathway probability is: 0.030\*0.938 = 0.028
- I.e. there is a 2.8% probability that patients have cancer and get a positive test result

RESULTS TABLE							
Pathway	Pathway probability	Pathway Cost	Pathway QALYs	Weighted cost [pathway cost*probabiliy]	<b>Weighted QALYs</b> [pathway QALYs*probability]		
TP appropriate referral	0.028	\$26,039	3.5	\$733	0.10		
FN missed cancer	0.002	\$56,699	1.7	\$105	0.00		
FP inappropriate referral	0.258	\$839	4.48	\$216	1.16		
TN appropriately not referred	0.712	\$139	4.5	\$99	3.20		
LDCT strategy TOTALs	1.000	-	-	\$1,154	4.46		

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Strategy	Total cost	Total QALYs	Incremental cost	Incremental QALY	ICER
Chest XR	\$1,031	4.46	-	-	-
LDCT	\$1,154	4.46	\$123	0.00395	\$31,090

•  $ICER = \frac{Incremental cost}{Incremental QALY}$ 



Always check the direction of cost and QALY increments! Your ICER may not be saying what you think it is saying

## **Decision Tree models**

## Strengths

- Easy to interpret (intuitive visual flow of events)
- Relatively simple to develop

## Limitations

- Time not explicitly accounted for
- Become unwieldy when dealing with reoccurring events (e.g. chronic diseases) or complex pathways
- Model structure cannot easily be updated/altered

## Example

In your own time...

Open the Excel file called 'Decision Tree Model'.

The first worksheet provides the model parameters, model, and results tables. Make sure you understand how the model parameters feed into the model, and how the model results are calculated.

Have a go at the questions provided in the second worksheet. What happens if the prevalence, sensitivity or specificity values change?

## Summary

- Diagnostic accuracy and prevalence data can be used to construct simple decision tree models
- Together with cost and QALY data, cost-effectiveness results can be produced
- Long term outcomes can also be modelled by linking the intermediate diagnostic outcomes to long term treatment outcomes using a Markov model [more on this later...]