

Proof-of-concept for automatic export of Excel versions of R health economic models

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Funder acknowledgement

- This work was partly funded by Clifton Insight and the Reliable and Efficient Estimation of the Economic Value of medical Research (REEEVR) project at University of Bristol, itself funded by UK Medical Research Council grant MR/W029855/1.
- All code for today's presentation is available at:
<https://github.com/Bogdasayen/R-to-Excel-POC>

Why R-to-Excel conversion?

- **UK NICE, Irish NCPE, Dutch Zin and other forward-thinking agencies accept R models, but others do not.**
- Companies may want to leverage efficiency, flexibility, and transparency advantages of R but will still need an Excel version.
- Double programming models can lead to errors and make it difficult to push updates across international models.
- **Instead use R models that can export Excel versions of themselves.**

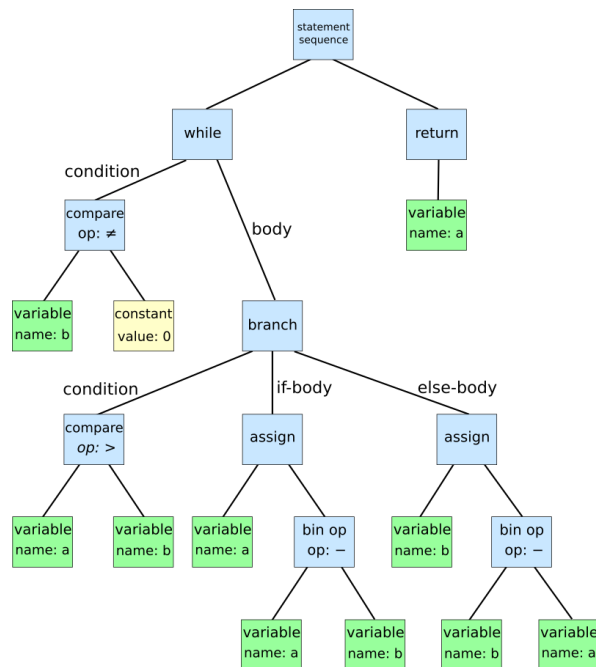
Requirements of R-to-Excel conversion

- Generalisable to any Markov model
- Generate human-readable Excel file suitable for experimentation and for HTA submissions
- Avoid “double programming” the model in both Excel and R

Reverse REEEVR?

- At University of Bristol, we are developing the REEEVR tool to automatically convert Excel models into R.
- This gains benefits of speed (100x improvement) at loss of readability.
- Approach theoretically works on any Excel model (though needs an R equivalent of each Excel function to be implemented)
- **Why not do this in reverse to convert R into Excel?**

Abstract Syntax Tree - General



```
1. while b ≠ 0:
2.     if a > b:
3.         a := a - b
4.     else:
5.         b := b - a
6. return a
```

- Walks the program
- Breaks code into components
- Builds a tree where each leaf is an elementary component of the program
- The tree is language agnostic
- **Could be applied to R code**

Unreadable and slow!

```
1115 StatetraceCemented_N8 = StatetraceCemented_D8 * rngActiveutilPostTHR
1116 StatetraceCemented_Q8 = excel_sum(list(StatetraceCemented_N8, StatetraceCemented_O8, StatetraceCemented_P8))
1117 StatetraceCemented_R8 = StatetraceCemented_Q8 / ( 1 + rngDiscountRate ) ^ ( StatetraceCemented_B8 - 1 )
1118 StatetraceCemented_E9 = StatetraceCemented_E8 * ( 1 - InputClinicalParameters_O10 - excel_index(rngLifeTables, StatetraceCemented_C8, 2) ) + StatetraceCemented_D8 * ( rngAveProbCem )
1119 StatetraceCemented_J9 = StatetraceCemented_E9 * rngAveProbSecem * rngTotCostRevision
1120 StatetraceCemented_O9 = StatetraceCemented_E9 * rngActiveutilPostListRev
1121 StatetraceCemented_F10 = StatetraceCemented_E9 * ( InputClinicalParameters_O10 ) + StatetraceCemented_F9 * ( 1 - ( excel_index(rngLifeTables, StatetraceCemented_C9, 2) ) )
1122 StatetraceCemented_K10 = StatetraceCemented_F10 * rngAveProbThirRem * rngTotCostRevision
1123 StatetraceCemented_P10 = StatetraceCemented_F10 * rngActiveutilPostSecRev
1124 StatetraceUncemented_D8 = 1 - excel_sum(list(StatetraceUncemented_E8, StatetraceUncemented_F8, StatetraceUncemented_G8))
1125 StatetraceUncemented_I8 = StatetraceUncemented_D8 * rngAveProbUncem * rngTotCostRevision
1126 StatetraceUncemented_M8 = excel_sum(list(StatetraceUncemented_H8, StatetraceUncemented_I8, StatetraceUncemented_J8, StatetraceUncemented_K8))
1127 StatetraceUncemented_N8 = StatetraceUncemented_M8 / ( 1 + rngDiscountRate ) ^ ( StatetraceUncemented_B8 - 1 )
1128 StatetraceUncemented_Q8 = StatetraceUncemented_D8 * rngActiveutilPostTHR
1129 StatetraceUncemented_R8 = excel_sum(list(StatetraceUncemented_N8, StatetraceUncemented_O8, StatetraceUncemented_P8))
1130 StatetraceUncemented_S8 = StatetraceUncemented_R8 / ( 1 + rngDiscountRate ) ^ ( StatetraceUncemented_B8 - 1 )
1131 StatetraceUncemented_T8 = StatetraceUncemented_S8 * ( 1 - InputClinicalParameters_O10 - excel_index(rngLifeTables, StatetraceUncemented_C8, 2) ) + StatetraceUncemented_D8 * ( rngAveProbUncem )
1132 StatetraceUncemented_U9 = StatetraceUncemented_T8 * rngAveProbSecem * rngTotCostRevision
1133 StatetraceUncemented_V9 = StatetraceUncemented_T8 * rngActiveutilPostListRev
1134 StatetraceUncemented_F10 = StatetraceUncemented_U9 * ( InputClinicalParameters_O10 ) + StatetraceUncemented_F9 * ( 1 - ( excel_index(rngLifeTables, StatetraceUncemented_C9, 2) ) )
1135 StatetraceUncemented_K10 = StatetraceUncemented_F10 * rngAveProbThirRem * rngTotCostRevision
1136 StatetraceUncemented_P10 = StatetraceUncemented_F10 * rngActiveutilPostSecRev
1137 StatetraceHybrid_D8 = 1 - excel_sum(list(StatetraceHybrid_E8, StatetraceHybrid_F8, StatetraceHybrid_G8))
1138 StatetraceHybrid_I8 = StatetraceHybrid_D8 * rngAveProbHybr * rngTotCostRevision
1139 StatetraceHybrid_L8 = excel_sum(list(StatetraceHybrid_H8, StatetraceHybrid_I8, StatetraceHybrid_J8, StatetraceHybrid_K8))
1140 StatetraceHybrid_M8 = StatetraceHybrid_L8 / ( 1 + rngDiscountRate ) ^ ( StatetraceHybrid_B8 - 1 )
1141 StatetraceHybrid_N8 = StatetraceHybrid_M8 * rngActiveutilPostTHR
1142 StatetraceHybrid_Q8 = excel_sum(list(StatetraceHybrid_N8, StatetraceHybrid_O8, StatetraceHybrid_P8))
1143 StatetraceHybrid_R8 = StatetraceHybrid_Q8 / ( 1 + rngDiscountRate ) ^ ( StatetraceHybrid_B8 - 1 )
1144 StatetraceHybrid_S8 = StatetraceHybrid_R8 * ( 1 - InputClinicalParameters_O10 - excel_index(rngLifeTables, StatetraceHybrid_C8, 2) ) + StatetraceHybrid_D8 * ( rngAveProbHybr )
1145 StatetraceHybrid_T9 = StatetraceHybrid_S8 * rngAveProbSecem * rngTotCostRevision
1146 StatetraceHybrid_U9 = StatetraceHybrid_S8 * rngActiveutilPostListRev
1147 StatetraceHybrid_F10 = StatetraceHybrid_S8 * ( InputClinicalParameters_O10 ) + StatetraceHybrid_F9 * ( 1 - ( excel_index(rngLifeTables, StatetraceHybrid_C9, 2) ) )
1148 StatetraceHybrid_K10 = StatetraceHybrid_F10 * rngAveProbThirRem * rngTotCostRevision
1149 StatetraceHybrid_P10 = StatetraceHybrid_F10 * rngActiveutilPostSecRev
1150 StatetraceReverseHybrid_D8 = 1 - excel_sum(list(StatetraceReverseHybrid_E8, StatetraceReverseHybrid_F8, StatetraceReverseHybrid_G8))
1151 StatetraceReverseHybrid_I8 = StatetraceReverseHybrid_D8 * rngAveProbRevHybr * rngTotCostRevision
1152 StatetraceReverseHybrid_M8 = excel_sum(list(StatetraceReverseHybrid_H8, StatetraceReverseHybrid_I8, StatetraceReverseHybrid_J8, StatetraceReverseHybrid_K8))
1153 StatetraceReverseHybrid_N8 = StatetraceReverseHybrid_M8 / ( 1 + rngDiscountRate ) ^ ( StatetraceReverseHybrid_B8 - 1 )
1154 StatetraceReverseHybrid_Q8 = StatetraceReverseHybrid_N8 * rngActiveutilPostTHR
1155 StatetraceReverseHybrid_R8 = excel_sum(list(StatetraceReverseHybrid_N8, StatetraceReverseHybrid_O8, StatetraceReverseHybrid_P8))
1156 StatetraceReverseHybrid_S8 = StatetraceReverseHybrid_R8 / ( 1 + rngDiscountRate ) ^ ( StatetraceReverseHybrid_B8 - 1 )
1157 StatetraceReverseHybrid_T8 = StatetraceReverseHybrid_S8 * ( 1 - InputClinicalParameters_O10 - excel_index(rngLifeTables, StatetraceReverseHybrid_C8, 2) ) + StatetraceReverseHybrid_D8 * ( rngAveProbRevHybr )
1158 StatetraceReverseHybrid_U9 = StatetraceReverseHybrid_T8 * rngAveProbSecem * rngTotCostRevision
1159 StatetraceReverseHybrid_V9 = StatetraceReverseHybrid_T8 * rngActiveutilPostListRev
1160 StatetraceReverseHybrid_F10 = StatetraceReverseHybrid_U9 * ( InputClinicalParameters_O10 ) + StatetraceReverseHybrid_F9 * ( 1 - ( excel_index(rngLifeTables, StatetraceReverseHybrid_C9, 2) ) )
1161 StatetraceReverseHybrid_K10 = StatetraceReverseHybrid_F10 * rngAveProbThirRem * rngTotCostRevision
1162 StatetraceReverseHybrid_P10 = StatetraceReverseHybrid_F10 * rngActiveutilPostSecRev
1163 StatetraceCemented_D9 = 1 - excel_sum(list(StatetraceCemented_E9, StatetraceCemented_F9, StatetraceCemented_G9))
1164 StatetraceCemented_I9 = StatetraceCemented_D9 * rngAveProbCem * rngTotCostRevision
1165 StatetraceCemented_L9 = excel_sum(list(StatetraceCemented_H9, StatetraceCemented_I9, StatetraceCemented_J9, StatetraceCemented_K9))
```

- A simple 4-state Markov model with 4 interventions results in 2614 lines of **unreadable** R code.
- Applying in reverse would create either very many **unreadable** cell calculations, or a small number of very long **unreadable** cell calculations.
- Result would also likely be **very slow** as loops and vector operations (e.g., for PSA) would be duplicated Excel cells, rather than VBA macros.

Using R to write Excel formulae

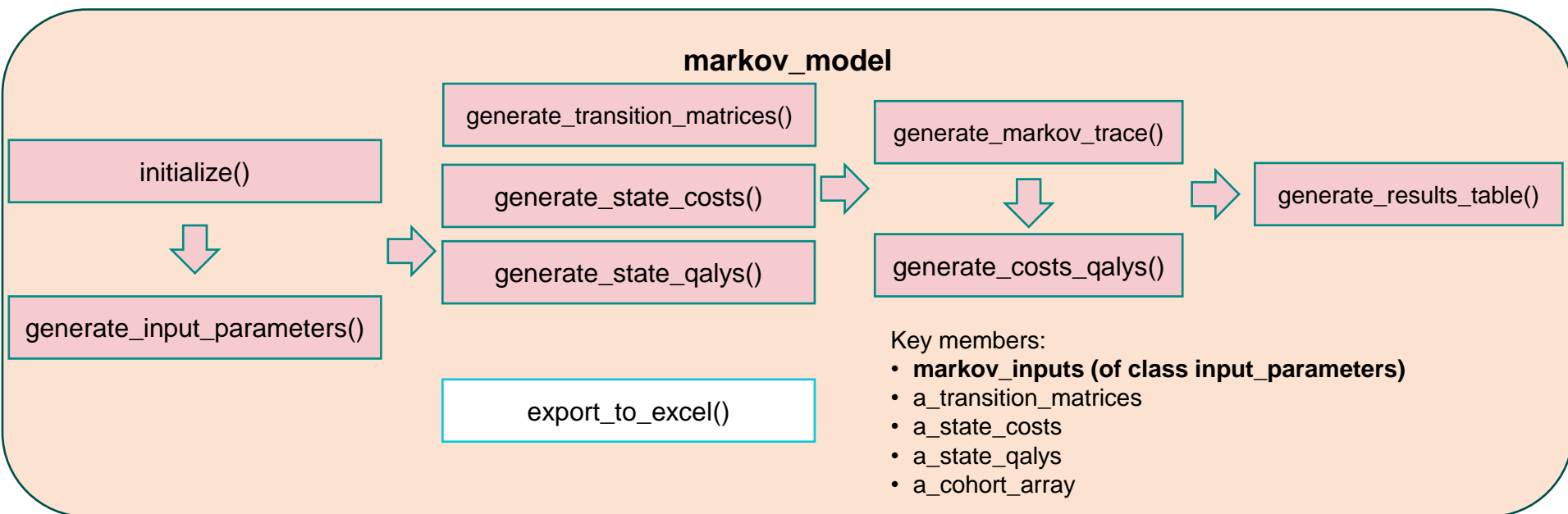
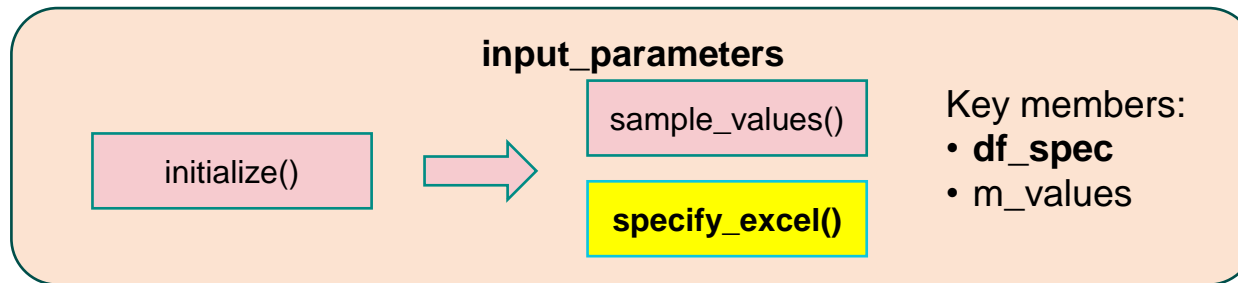
- We instead use the powerful **openxlsx** R package
- This allows us to write data, formulae and formatting from R to Excel
 - Example usage below

```
output_wb <- loadWorkbook(file = wb_filename, isUnzipped = FALSE)
addWorksheet(output_wb, "Results", tabColour = "orange")
df_results <- Some formulae see next slide
class(df_results[, 1] <- c(class(df_results[, 1]), "formula")
names(df_results) <- c("Result", self$v_treatment_names)
writeData(output_wb, sheet = "Results", x = df_results,
          startCol = 8, startRow = 5)
saveWorkbook(output_wb, file = wb_filename,
             overwrite = TRUE, returnValue = TRUE)
```


Object Oriented Programming

- Process kept manageable through R6 classes for OOP
- Each model is a `markov_model` object with member functions and data stored in a `markov_inputs` object
- Users would call `markov_model$new(...)` to create a new Markov model, and the `new()` constructor takes a `markov_inputs` object as argument.
- The Markov model object maps relationships between input parameters, transition matrices, costs and QALYs
- **This mapping of data relationships is helpful for R-to-Excel conversion**

Two key R6 objects and two key functions



- We'll start with `input_parameters$df_spec()`

Data structure and description

- Data structure and complete description of relationships is key.
- The input parameters object includes a dataframe **df_spec** that fully specifies the distributions used in either R or Excel.
- The contents of this dataframe are written by **specify_excel()**
- Column excel_formulae is generated automatically based on inputs

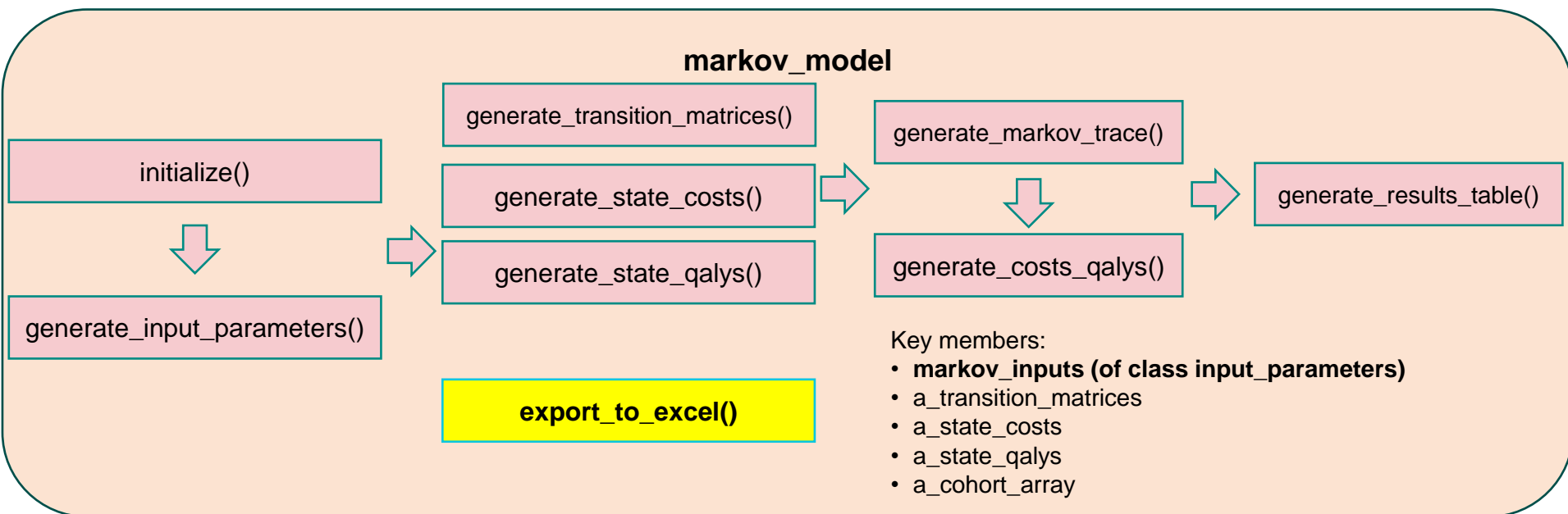
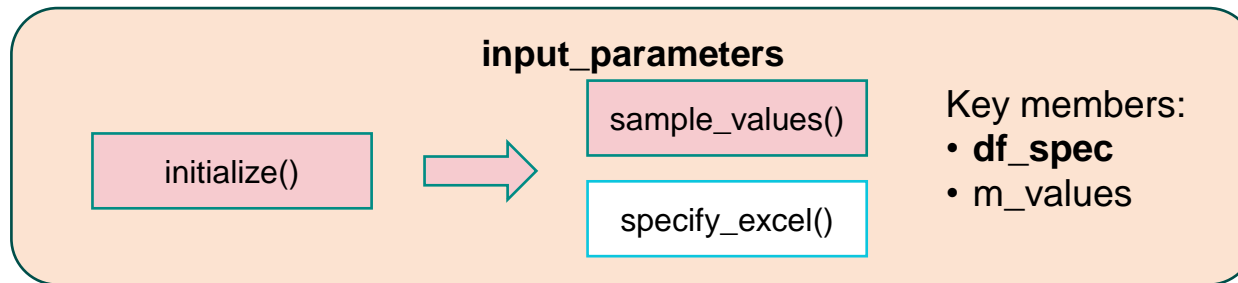
8	v_names	v_descriptions	v_distributions	hp_1	hp_2	from	to	v_treatment	excel_formulae	excel_value_location
9	Probability quit smoking website	Probability of quitting if on smoking website, follows a beta distribution	beta	15	85	1	2	1	=BETA INV(RAND(), H9, I9)	input_parameters!M9

Example Excel random formula generation

- Cell formulae themselves generated using paste0 statements and cell locations
- Extracted from input_parameters\$specify_excel()

Code	<pre># First parameter i_parameter <- 1 # Starting position in Excel sheet startRow = 5 startCol = 8 # In which column letters would the hyper parameters be stored? hp_1_col <- LETTERS[startCol + 1] hp_2_col <- LETTERS[startCol + 2] paste0("NORMINV(RAND(), ", paste0(hp_1_col, startRow + i_parameter), ", ", paste0(hp_2_col, startRow + i_parameter), ")")</pre>
Output	"NORMINV(RAND(), I6, J6)"

Two key R6 objects and two key functions



▪ Next is **markov_model\$export_to_excel()**

Markov trace generation

- Generates state occupancy probabilities (e.g., “ $=F9 * (1 - \text{input_parameters!M9}) + G9 * \text{input_parameters!M11}$ ”) in Markov trace using the df_spec data frame
- Associates each parameter with its source (‘from’) and destination (‘to’) states
- Code ignores parameters without ‘from’ or ‘to’ as these are costs or utilities
- First two rows of generated Markov trace are provided below.

E	F	G	H	I	J
8	cycle	SoC_Smoking	SoC_Not smoking	SoC with website_Smoking	SoC with website_Not smoking
9	1	1	0	1	0
10	2	$=F9 * (1 - \text{input_parameters!M9}) + G9 * \text{input_parameters!M11}$	$=G9 * (1 - \text{input_parameters!M11}) + F9 * \text{input_parameters!M9}$	$=H9 * (1 - \text{input_parameters!M10}) + I9 * \text{input_parameters!M11}$	$=I9 * (1 - \text{input_parameters!M11}) + H9 * \text{input_parameters!M10}$

Markov trace generation – part 1

Generate the Markov trace using transition probabilities from markov_inputs

```
df_markov_trace <- data.frame(cycle = c(1:self$n_cycles))
cell_formula_temp <- rep("", n_cycles)
for(i_treatment in 1:self$n_treatments) {
  for(i_state in 1:self$n_states) {
    cell_formula_temp[1] <- self$v_init_cohort[i_state]
```

Which parameters give probabilities from this state and are relevant # to this treatment (or to all treatments)

```
from_indices <- which(self$markov_inputs$df_spec$from == i_state &
  (self$markov_inputs$df_spec$v_treatment == i_treatment |
    is.na(self$markov_inputs$df_spec$v_treatment)))
```

Create the sum of probabilities of exiting current state

```
sum_probabilities_from <- ifelse(length(from_indices) == 1,
  self$markov_inputs$df_spec$excel_value_location[from_indices],
  paste0(self$markov_inputs$df_spec$excel_value_location[from_indices], sep = "+"))
```

Markov trace generation – part 2

```
for(i_cycle in 2:self$n_cycles) {  
  # Numeric for row with previous cohort probabilities  
  previous_row <- startRow + i_cycle - 1  
  
  # Cell with probability of being in state at previous cycle  
  cell_formula_temp[i_cycle] <- paste0(LETTERS[startCol +  
    (i_treatment - 1) * n_states +  
    i_state], previous_row,  
    " * (1 - ", sum_probabilities_from,")")  
  
  # Now append the probabilities of entering the state  
  from_prob_formulae <- c()  
  for(j_state in c(1:self$n_states)[-i_state]) {  
    # Find the parameter storing transition probabilities from j to i  
    from_j_to_i_index <- self$markov_inputs$df_spec$from == j_state &  
      self$markov_inputs$df_spec$to == i_state &  
      (self$markov_inputs$df_spec$v_treatment == i_treatment |  
        is.na(self$markov_inputs$df_spec$v_treatment))
```


Markov trace generation – part 3

Check that there is a transition from j to i

```
if(sum(from_j_to_i_index, na.rm = TRUE) == 1) {
```

Add probability of being in j multiplied by probability of going to i

```
from_prob_formulae <- c(from_prob_formulae,  
  paste0(LETTERS[startCol +  
    (i_treatment - 1) * n_states +  
    j_state], previous_row,  
    " * ",
```

```
self$markov_inputs$df_spec$excel_value_location[which(from_j_to_i_index)]))
```

```
} # End if there are transitions from j to i
```

```
} # End loop over j_state
```

Markov trace generation – part 4

Create the sum of probabilities of entering current state

Account for possibility that none of cohort makes this transition

```
sum_probabilities_to <- ifelse(length(from_prob_formulae) == 0, "",
                               ifelse(length(from_prob_formulae) == 1,
                                       from_prob_formulae,
                                       paste0(from_prob_formulae, sep = "+")))
cell_formula_temp[i_cycle] <- paste0(cell_formula_temp[i_cycle], " + ",
sum_probabilities_to)

} # End loop over i_cycle
```

Append these formulae to the Markov trace

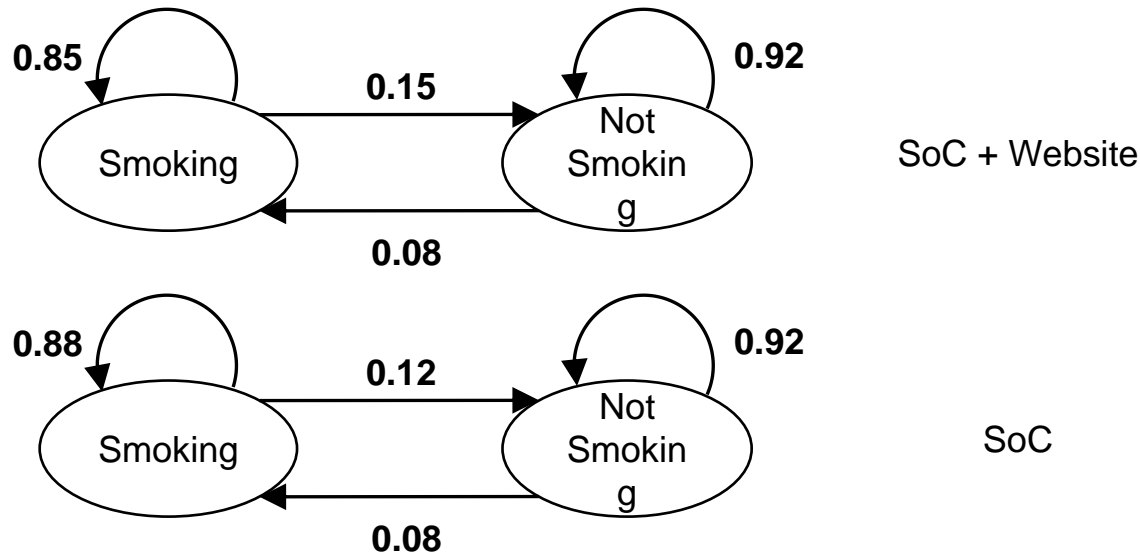
```
class(cell_formula_temp) <- c(class(cell_formula_temp), "formula")
df_markov_trace <- cbind(df_markov_trace, cell_formula_temp)
```

Costs, QALYs, PSA

- Similar approach is taken to costs and QALYs
- Output model is probabilistic but only for 1 sample
- A pre-built VBA macro is used to run the model multiple times for probabilistic sensitivity analysis
- So long as total cost and QALY cells are written in a specific format (e.g., starting from row 8 and column 5) the VBA macro will work
- This could also be used to automatically generate plots

Now let's test it!

Markov smoking



- Teaching model used for Bristol University short courses and MSc teaching
- Two states and two treatments
- SoC + Website increases chance of quitting smoking compared to SoC

df_spec for utilities

v_name s	v_descri ptions	v_type	v_distri butions	hp_1	hp_2	v_treat ment	v_state	excel_v alue_loc ation
Utility smoking	Utility smoking, follows a Normal distributi on	utility	normal	0.95	0.02		1	input_pa rameters !O12
Utility not smoking	Utility not smoking, follows a Normal distributi on	utility	fixed	1			2	input_pa rameters !O13

- Treatment column left blank so these utilities apply to both treatments

df_spec for costs

v_names	v_descriptions	v_type	v_distributions	hp_1	hp_2	v_treatment	v_state	excel_value_location
Cost website	Cost website, fixed value and model assumes no cost of SoC and no state costs	one_off_cost	fixed	50		2		input_parameters! O14
Cost GP smoking	Cost of 6-monthly, on average, GP visit (£49 from PRSSU) for smoking related illness, follows Normal distribution	cost	normal	49	2		1	input_parameters! O15
Cost statin smoking	Cost of roughly 20% of smokers taking statins (pravastatin at £3.45 per month), follows Normal distribution	cost	normal	0.69	0.069		1	input_parameters! O16

- Costs can be one-off or ongoing.

df_spec for transition probabilities

v_names	v_descriptions	v_type	v_distributions	hp_1	hp_2	from	to	v_treatment	v_state	excel_value_location
Probability quit smoking website	Probability of quitting if on smoking website, follows a beta distribution	transition_probability	beta	15	85	1	2	2	1	input_parameters!O9
Probability quit smoking SoC	Probability of quitting smoking if on SoC, follows a beta distribution	transition_probability	beta	12	88	1	2	1	1	input_parameters!O10
Probability relapse	Probability relapse, which is same across treatments and follows a beta distribution	transition_probability	beta	8	92	2	1		2	input_parameters!O11

- Probability of relapse is the same for both treatments

If v_treatment is missing it's the same for all treatments. The states used in from and to columns are 1=Smoking and 2=Not smoking; the treatments are 1=SoC and 2=SoC+Website. Column O is omitted and stores the live value used in the model.

Output – note formula bar

09 =BETAINV(RAND(), I9, J9)

	D	E	F	G	H	I	J	K	L	M	N	O	P	Q
1														
2														
3														
4														
5														
6														
7														
8		v_names	v_description	v_type	v_distribution	hp_1	hp_2	from	to	v_treatment	v_state	excel_formula	excel_value_location	
9		Probability q	Probability of transition	pr	beta	15	85	1	2	2	1	0.15439083	input_parameters!O9	
10		Probability q	Probability of transition	pr	beta	12	88	1	2	1	1	0.10596282	input_parameters!O10	
11		Probability re	Probability re transition	pr	beta	8	92	2	1		2	0.09437307	input_parameters!O11	
12		Utility smokir	Utility smokir	utility	normal	0.95	0.02				1	0.95593452	input_parameters!O12	
13		Utility not snr	Utility not snr	utility	fixed	1					2	1	input_parameters!O13	
14		Cost website	Cost website, one_off	cost	fixed	50				2		50	input_parameters!O14	
15		Cost GP smokir	Cost of 6-month	cost	normal	49	2				1	47.826906	input_parameters!O15	
16		Cost statin snr	Cost of rough	cost	normal	0.69	0.069				1	0.68001455	input_parameters!O16	
17														
18														
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26														
27														
28														
29														

< > input_parameters markov_trace PSA model_settings state_costs state_qalys Results +

Output – note formula bar

F10 \times \checkmark f_x $=F9 * (1 - \text{input_parameters!O10}) + G9 * \text{input_parameters!O11}$

	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
1																
2																
3																
4																
5																
6																
7																
8																
9																
10																
11																
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100																

input_parameters markov_trace PSA model_settings state_costs state_qalys Results + ◀

Output – note formula bar

Excel screenshot showing the formula bar and a table of results.

Formula bar: `=SUM(markov_trace!P9:markov_trace!P19)`

	A	B	C	D	E	F	G	H	I	J
1										
2										
3										
4										
5										
6										
7										
8					Result	SoC	SoC with web			
9					Total Costs	315.381146	325.288542			
10					Total QALYs	4.41096739	4.42917819			
11					Total Costs (u	342.87777	348.109782			
12					Total QALYs (4.8442586	4.86459304			
13					Incremental C	0	9.90739559			
14					Incremental C	0	0.0182108			
15					ICER		73.4421891			
16										
17										
18										
19										
20										
21										
22										
23										
24										
25										
26										
27										
28										
29										

Worksheet tabs: input_parameters, markov_trace, PSA, model_settings, state_costs, state_qalys, Results

Comparison of results

	R		Automatically generated Excel	
Treatment	SoC	SoC with website	SoC	SoC with website
Total costs	312.453 (248.579, 374.685)	337.756 (276.242, 400.320)	307.72	331.60
Total QALYs	4.476 (4.346, 4.606)	4.488 (4.373, 4.609)	4.40	4.41
Total costs undiscounted	333.344 (263.673, 401.680)	356.240 (289.118, 424.459)	333.99	354.83
Total QALYs undiscounted	4.832 (4.692, 4.971)	4.846 (4.722, 4.975)	4.83	4.85
ICER	NaN	2029.36		1823.06

- Results based on 1000 random samples
- Numerical variation due to differences in random number generation but otherwise a match.

Next steps

- The supplied proof-of-concept code works for any time-homogeneous Markov model
- Allow transition matrices to be time-inhomogeneous
- Implement formatting of the Excel format using the options of the openxlsx package
- Export IF and INDEX statements to allow switching between scenarios
- Validation of the conversion on multiple toy and real-world applications

Thank you!