



Modelling the early life-course: A decision support tool for policy makers

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**COMPASS
RESEARCH CENTRE**

FACULTY OF ARTS
THE UNIVERSITY OF AUCKLAND

Whare Wānanga o Tāmaki Makaurau

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**MINISTRY OF BUSINESS,
INNOVATION & EMPLOYMENT**
HIKINA WHAKATUTUKI

- ▣ Modelling the Early Life-course (MEL-C)
 - ▣ What? Why? How? Micro-simulation
- ▣ MEL-C – Key features
 - ▣ Representative starting population
 - ▣ Conceptual framework
 - ▣ Transition probabilities (associations between paths)
 - ▣ Simulating results
 - ▣ Validation
 - ▣ Testing policy scenarios
- ▣ Some results
- ▣ Conclusions

New Zealand context

- ❑ Island nation in South Pacific
 - ❑ Colonised Māori 1250-1300AD (European ~1800AD)
- ❑ Population: 2013: 4.5m
 2006: 4.15m
- ❑ Ethnicity
 - ❑ 2006 births: 58% NZ European, 24% Māori, 9% Asian, 9% Pacific
- ❑ (Mostly) good social statistics...
 - ❑ High rates of child poverty, child health conditions
 - ❑ Increasing socio-economic and ethnic equality



MEL-C

- What? Why? How?



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1. Goals ... what are we trying to do?

- ❑ Develop a software application as a decision-support tool for policy-making

2. Rationale ... why are we doing it?

- ❑ To improve policymakers' ability to respond to issues concerning children and young people

3. Means ... how are we doing it?

- ❑ By building a computer simulation model with data from existing longitudinal studies to quantify the underlying determinants of progress in the early life course

MEL-C - Micro-simulation



❑ Micro-simulation

- ❑ Use data from the real world to create an artificial one that mimics the original.
- ❑ Carry out ‘virtual’ experiments with artificial world (Gilbert and Troitzsch 2005).
- ❑ Simulate individual units and aggregate these to get population estimates
- ❑ Requirements
 - Starting population
 - Rules to transition individuals from state to state

MEL-C How?



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- ❑ We start with a sample of individuals
 - ❑ Synthetic (derived from Census)

- ❑ We derive statistical rules to create a 'virtual cohort' through to age 13
 - ❑ Analyse combined data from 3 longitudinal studies
 - ❑ A sample of children with typical biographies over the life-course, allowing for variation

- ❑ We then simulate what might happen if policy were to change, by altering parameters
 - ❑ Using software application

Key features

- Starting population



- ❑ Subset NZ 2006 Census to include just new-borns (0-year olds) and their parents
 - Randomly select 10,000 (Processing speed)
- ❑ Calculate distance (Euclidean) between each of the 10,000, based on 52 Census characteristics.
- ❑ Choose the closest 2 ranks to form 10,000 clusters of 3 individuals
- ❑ Randomly choose which indiv's characteristics are used for each synthetic individual
 - Characteristic by characteristic

Key features

- Starting population



	<u>Cluster of 3 Children</u>				
Characteristic	Child 1	Child 2	Child 3	Random Draw {1,2,3}	Synthetic child
Child sex	Male	Female	Female	2	Female
Mother age	29	41	31	1	29
Father age	32	40	38	1	32
Home ownership	Owned	Owned	Rented	3	Rented
Deprivation score (1-10)	9	7	8	3	8

Key features - Starting population

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- Voilà! A synthetic basefile of 10,000 composite individuals
- Match Census distributions and inter-relations

Key features

- Conceptual framework



Structural level

Intermediate level

Outcome

Child characteristics

- (age)
- gender
- ethnicity

Parental characteristics

- age at birth of child
- ethnicity
- education level

Socio-economic position

- SES at birth of child
- (single-parent status at birth)

Family/household characteristics

e.g. single-parent status, number of children, household size

Employment e.g. parental employment, welfare dependence

Material circumstances

e.g. housing: accommodation type, owned-rented, bedrooms number

Psychosocial factors

e.g. family functioning: change of parents, change of residence

Behavioural factors

e.g. parental smoking

Other factors

e.g. perinatal factors

Health service use

e.g. GP visits, hospital admissions, hospital outpatient attendances

Education

e.g. reading ability

Social/Justice

e.g. Conduct disorder

Key features

- Transition probabilities



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- Combined data from 3 NZ longitudinal studies
 - Christchurch Health & Development Study (CHDS)
 - 1265 children born in Christchurch, 1977. Followed since.
 - Dunedin Multidisciplinary Health & Development Study (DMHDS)
 - 1037 children born in Dunedin, 1972/73. Followed since.
 - Pacific Islands Families Study (PIFS)
 - 1398 children born at Middlemore, 2000, with at least one parent of Pacific Islands ethnicity. Followed since.
- Regression analysis of each path in conceptual framework
 - Data weighted to represent NZ current ethnic distribution
 - Māori data weighted to represent NZ Māori national cultural affiliation distribution (Te Hoe Nuku Roa Study)

Key features

- Simulating results



Simulating Reading score: Simplified rule from statistical model:

$$E[\text{reading score}] = 13.00 + .91 * \text{reading.score.previous} + .07 * \text{months.breast.fed} + 1.04 * \text{father.tertiary.qualification} + .87 * \text{father.secondary.qualification}$$

Child A	
Characteristics	
Reading score at age 8	40
Number of months breast fed	12
Father's Education	Secondary
Predicted reading score at age 9	$13.00 + .91 * 40 + .07 * 12 + .87$ = 50.58
Random draw from a normal distribution	50.23
Reading score assigned at age 9	50

Apply Rule

Expected value

Stochastic component

Key features - Validation



- ❑ Models need to simulate real world accurately
- ❑ Given we start with a representative NZ population (synthetic base file), we should simulate NZ national rates
- ❑ Compare simulated rates with published rates / available datasets
 - NZ Health Survey (GP visits, outpatient attendances)
 - NMDS (hospital admissions)
 - Burt Reading norms (reading)
 - Nothing for conduct – only national rates available are based on the longitudinal studies we use in our models!

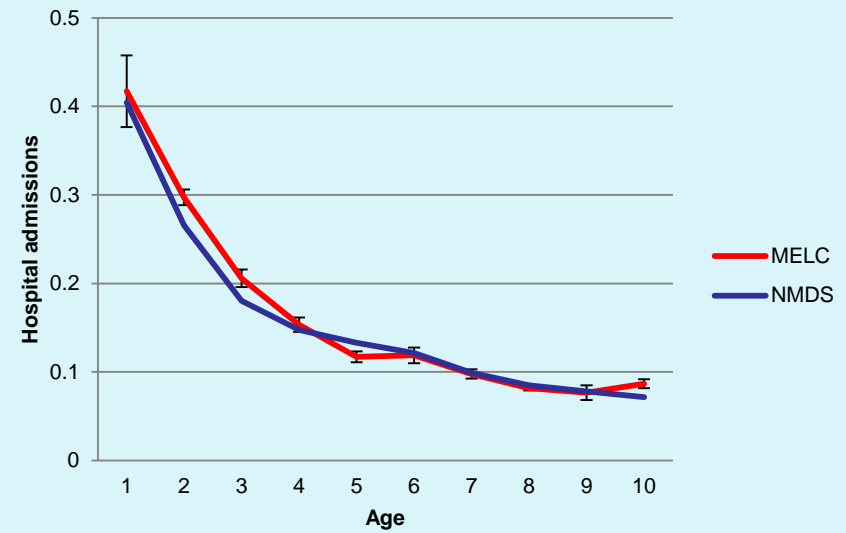
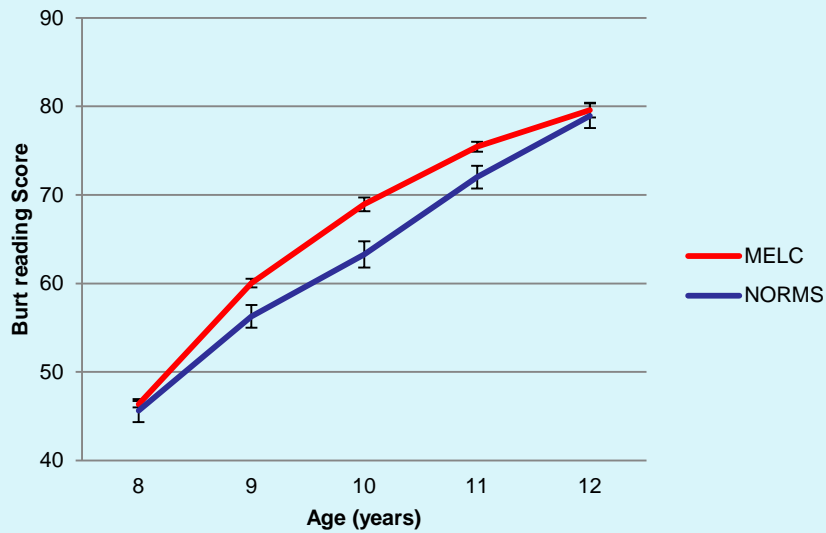
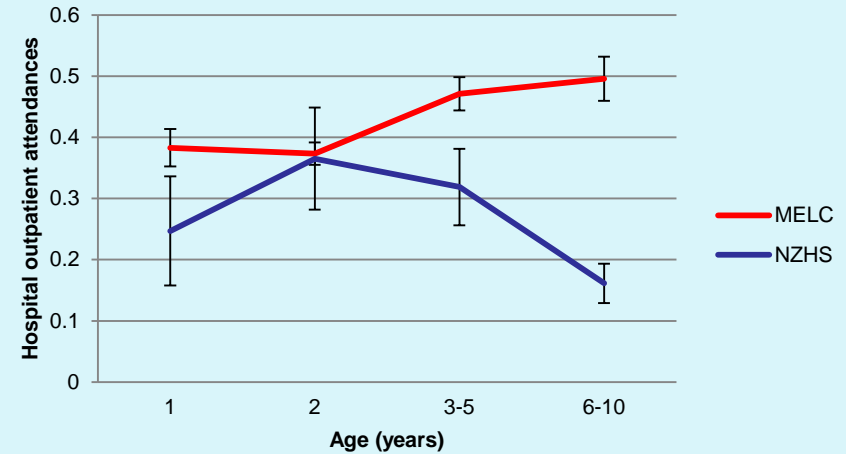
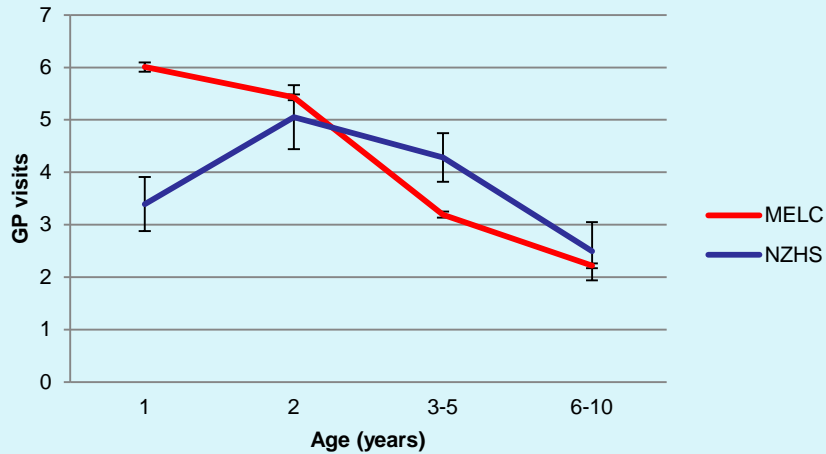
Key features - Validation



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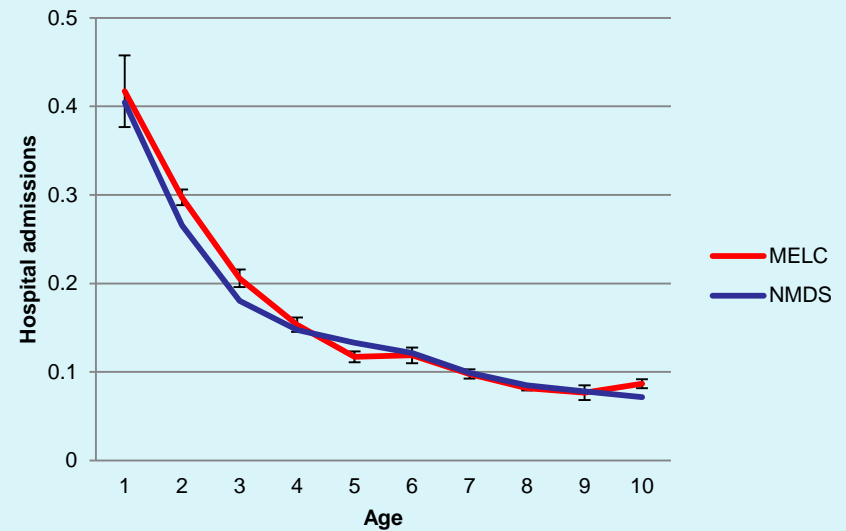
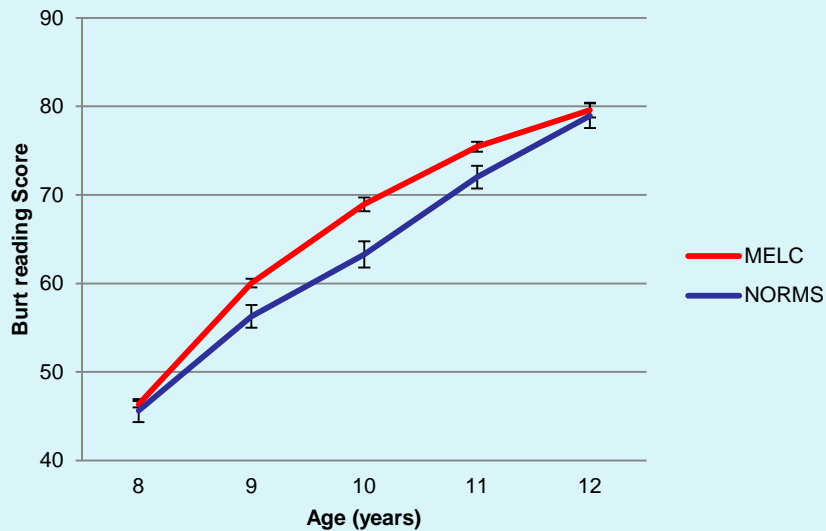
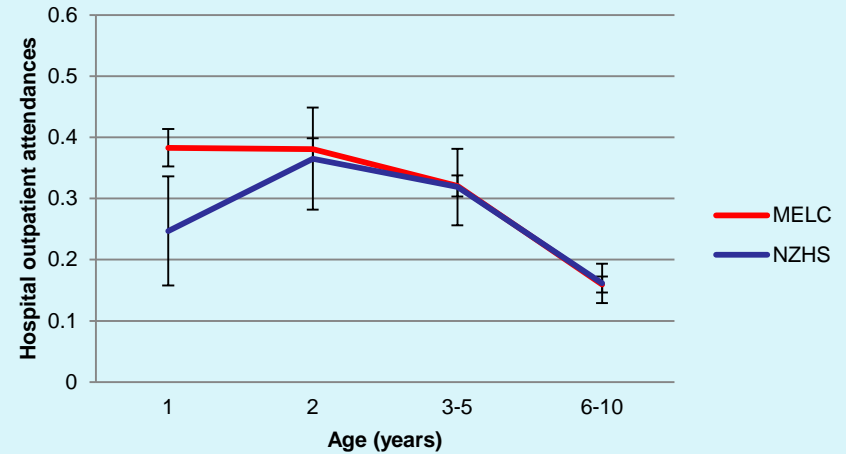
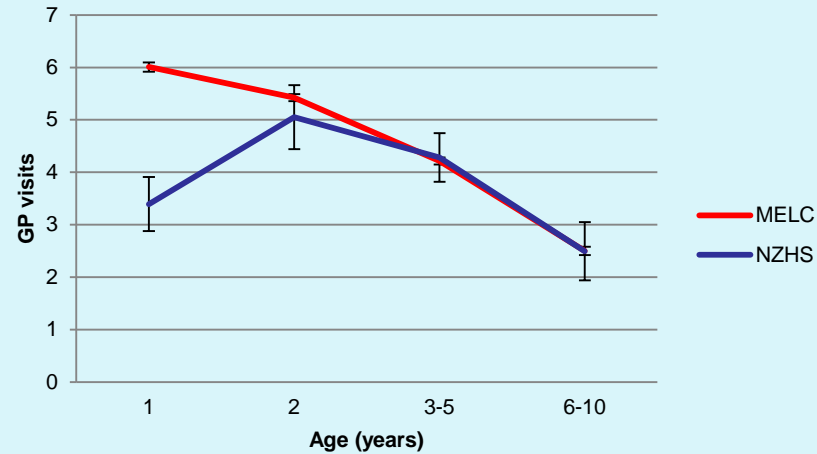
Key features - Validation (realigned)



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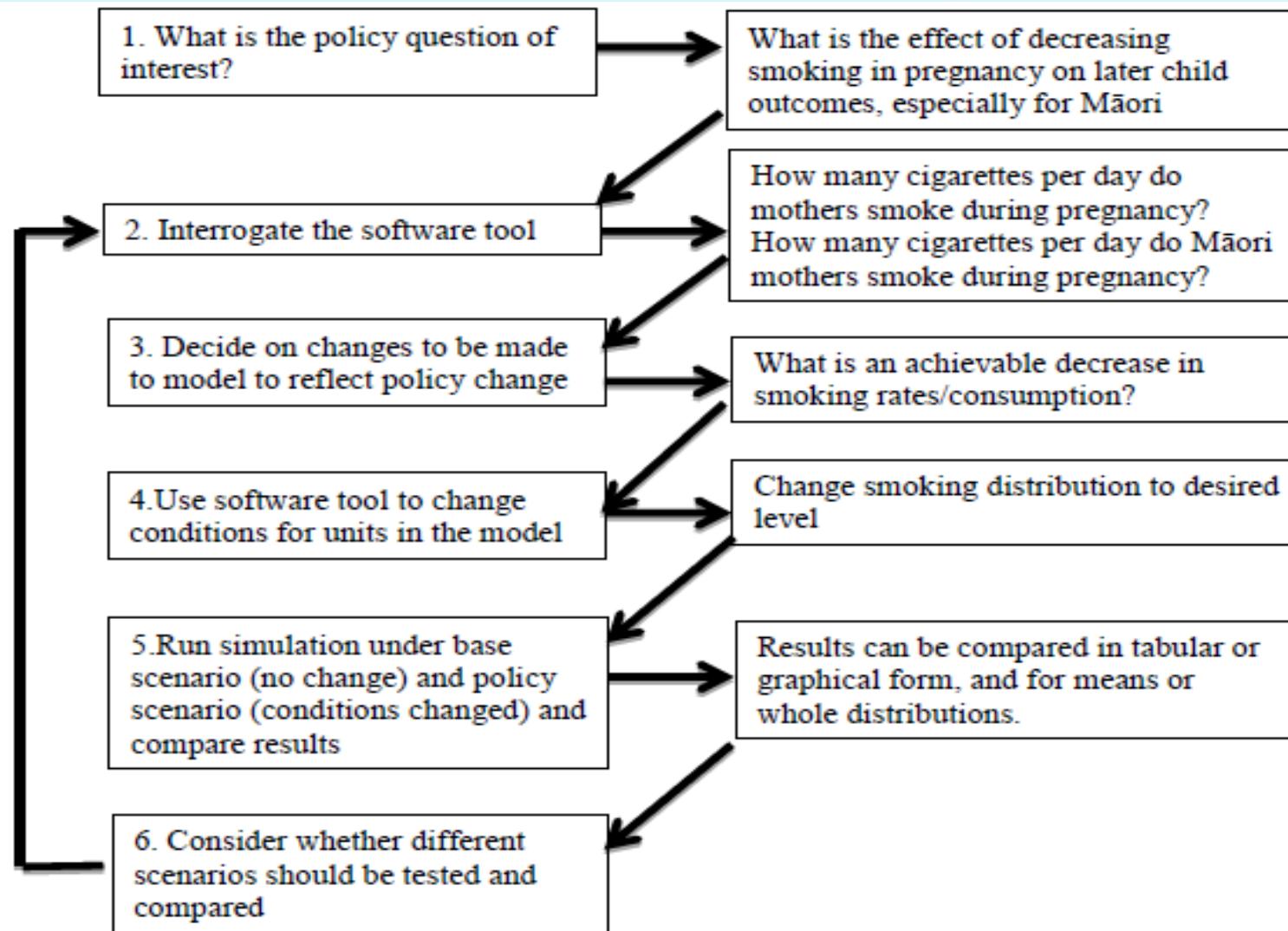


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Key features

- Testing policy scenarios



Modelling software

Scenario Builder

Select Subgroup Variable for your Scenario

None () And Or Del

Select Options

None ≤ ≥ 7 8 9

None < > 4 5 6

Subgroup Formula

= 0 1 2 3

Preview Base Clear Formula

Select Variable to Examine

Cigarettes smoked per day during pregnancy

Adjust Proportions for your Scenario

	0 (%)	1-5 (%)	6-10 (%)	11-15 (%)	16-20 (%)	21+ (%)
Cigarettes						

Apply Changes Reset Variable

Preview Base Simulation Results for the Current Subgroup

Name	Value
0	78.34
1-5	7.76
6-10	4.84
11-15	5.24
16-20	1.50
21+	2.32

Name your Scenario 2 runs Run Scenario

Modelling software

Scenario Builder

Select Subgroup Variable for your Scenario

Child ethnicity () And Or Del

Select Options ≤ ≥ 7 8 9

Maori < > 4 5 6

Subgroup Formula = 0 1 2 3

r1stchildethnLv2==1 Preview Base Clear Formula

Select Variable to Examine

Cigarettes smoked per day during pregnancy

Adjust Proportions for your Scenario

	0 (%)	1-5 (%)	6-10 (%)	11-15 (%)	16-20 (%)	21+ (%)
Cigarettes						

Apply Changes Reset Variable

Preview Base Simulation Results for the Current Subgroup

Name	Value
0	56.54
1-5	16.04
6-10	10.75
11-15	9.94
16-20	2.73
21+	4.01

Name your Scenario smoking_in_pregnancy 2 runs Run Scenario

Modelling software

Scenario Builder

Select Subgroup Variable for your Scenario

Child ethnicity () And Or Del

Select Options ≤ ≥ 7 8 9

Maori < > 4 5 6

Subgroup Formula = 0 1 2 3

r1stchildethnLvl2==1 Preview Base Clear Formula

Select Variable to Examine

Cigarettes smoked per day during pregnancy

Adjust Proportions for your Scenario

	0 (%)	1-5 (%)	6-10 (%)	11-15 (%)	16-20 (%)	21+ (%)
Cigarettes	78.30	7.80	4.80	5.20	1.50	2.40

Apply Changes Reset Variable

Preview Base Simulation Results for the Current Subgroup

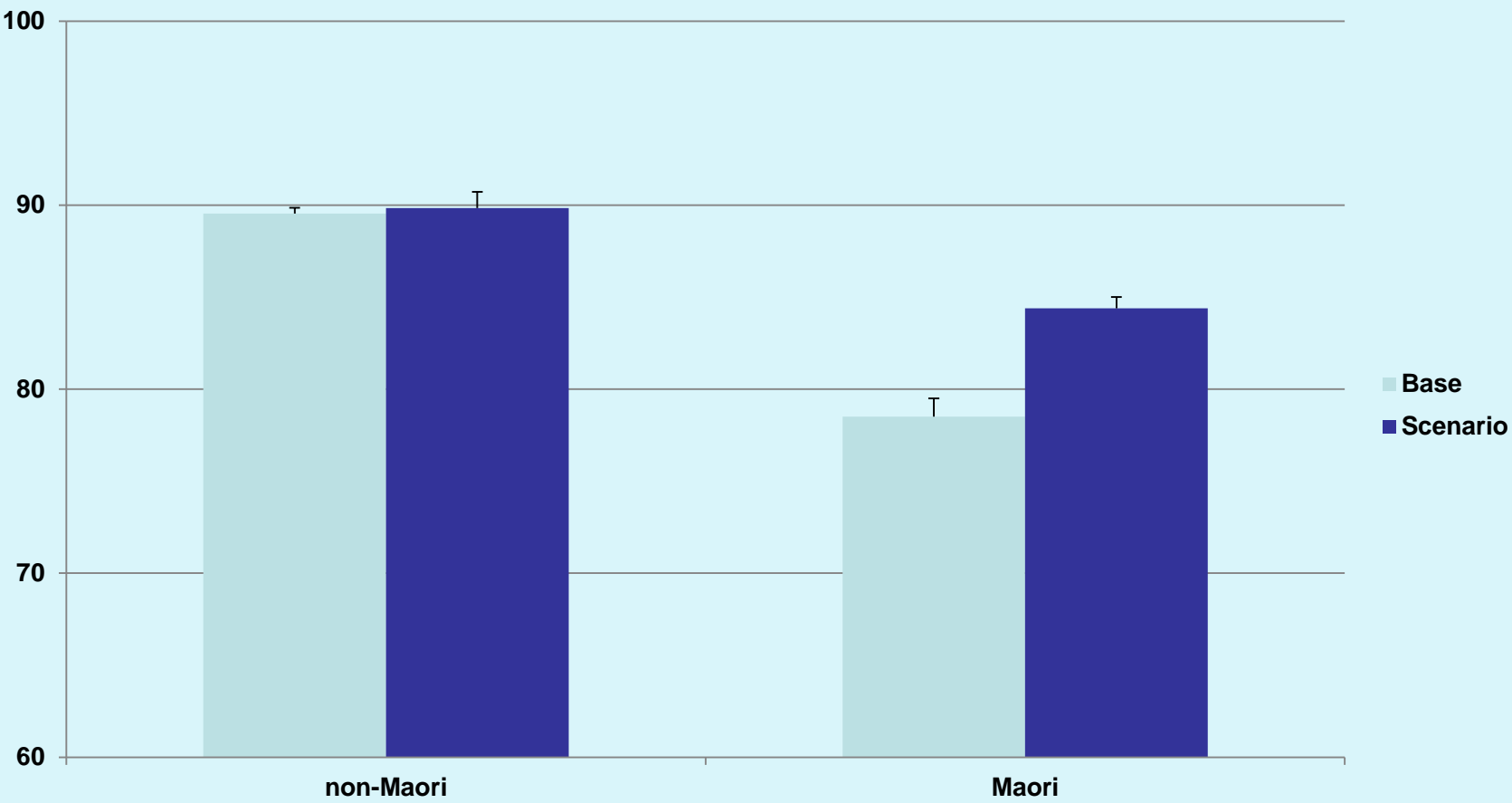
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11-15	9.94
16-20	2.73
21+	4.01

Name your Scenario smoking_in_pregnancy 2 runs Run Scenario

Results



Reading Scores – age 13



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- ▣ Able to assess scenarios relevant to policy-makers via tool/user-interface
 - ▣ Tested by policy makers, final version deployed

- ▣ Assess policy scenarios for whole population or for important sub-populations

- ▣ Use of existing data for simulation rules and for simulation starting population
 - ▣ Extend to use published 'best' estimates for rules

- ▣ Several scenarios can be assessed

QUESTIONS?



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QUESTIONS?