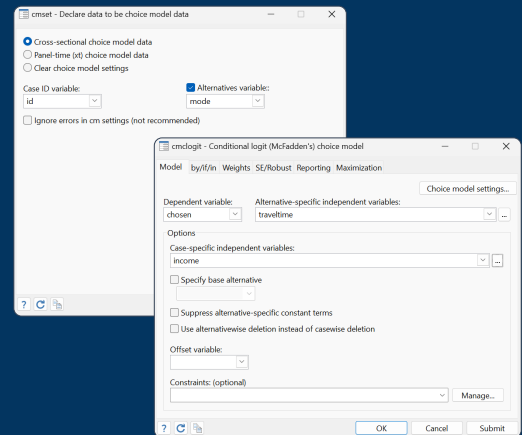


Choice models

Stata's choice modeling suite makes it easy to explore discrete choice data, fit choice models, and interpret the results. Get answers to real research questions.

- Summarize choice data
- Model discrete choices
 - Conditional logit
 - Mixed logit
 - Multinomial probit
 - Rank-ordered logit
 - Rank-ordered probit
 - Panel-data mixed logit
- Truly interpret the results
 - Expected probabilities
 - For any alternative
 - For any subpopulation
 - At specific covariate levels
 - Differences in probabilities (effects)
 - As a covariate changes for an alternative
Increased airfare decreases probability of flying
 - As a covariate changes for another alternative
Increased airfare increases probability of car travel
 - Marginal effects
 - Tests and confidence intervals for everything



Prepare your data

Declare variables that identify individuals and alternatives

```
. cmset id mode
```

Summarize data

Tabulate chosen alternatives

```
. cmtab, choice(chosen)
```

Summarize variables (**traveltime** and **cost**) across chosen alternatives

```
. cmsummarize traveltime cost, choice(chosen)
```

Tabulate choice sets

```
. cmchoiceset
```

Fit a discrete choice model

Conditional logit (McFadden's choice) model; **traveltime** varies across alternatives; **income** is constant within **id**

```
. cmclogit chosen traveltime, casevars(income)
```

Multinomial probit

```
. cmmprobit chosen traveltime, casevars(income)
```

Mixed logit with random coefficients for **cost**

```
. cmmixlogit chosen traveltime, random(cost) casevars(income)
```

Fit a model for a rank-ordered outcome

Rank-ordered probit

```
. cmroprobit rank traveltime, casevars(income)
```

Rank-ordered logit

```
. cmrologit rank traveltime cost
```

Fit a model to panel data

Mixed logit model

```
. cmset id time mode
. cmxtmixlogit chosen traveltime, random(cost) casevars(income)
```

	chosen	Coefficient	Std. err.	z	P> z	[95% conf. interval]	
mode							
	traveltime	-.837606	.0437603	-19.14	0.000	-.9233746	-.7518374
	cost	-1.560057	.2667461	-5.85	0.000	-2.082869	-1.037244
/Normal							
	sd(cost)	2.015974	.2594489			1.566529	2.594369
Car (base alternative)							
Public							
	income	-.3681157	.034001	-10.83	0.000	-.4347564	-.301475
	_cons	-.0095711	.2526377	-0.04	0.970	-.5047318	.4855896
Bicycle							
	income	-.5083127	.0457894	-11.10	0.000	-.5980583	-.4185671
	_cons	-.3506506	.3112727	-1.13	0.260	-.9607339	.2594326
Walk							
	income	-.8844826	.0681116	-12.99	0.000	-1.017979	-.7509864
	_cons	.792664	.3787151	2.09	0.036	.050396	1.534932

After fitting a choice model with any **cm** command, you can easily answer interesting research questions.

What proportion of individuals do we expect will select air travel? Train travel? Bus travel? Car travel?

```

    . margins
    Predictive margins                                Number of obs = 840
    Model VCE: OIM
    Expression: Pr(mode|1 selected), predict()

    _____
    |_outcome|      Delta-method      z   P>|z|   [95% conf. interval]
    |-----|-----+-----+-----+-----|
    |   Air   |      .2761905   | .0275268 | 10.03 | 0.000   | .2222389   | .330142
    |  Train  |      .3000000   | .0284836 | 10.53 | 0.000   | .2441731   | .3558269
    |    Bus  |      .1428571   | .0234186 |  6.10 | 0.000   | .0969576   | .1887567
    |    Car  |      .2809524   | .028043  | 10.02 | 0.000   | .2259891   | .3359156
  
```

We expect 28% to select air, 30% to select train, 14% to select bus, and 28% to select car.

What proportion of individuals with income levels ranging from \$30,000 to \$70,000 per year are expected to select car travel?

```

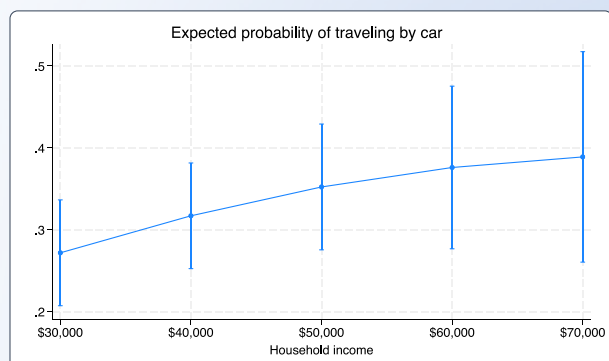
    . margins, at(income=(30(10)70)) outcome(Car)
    Predictive margins                                Number of obs = 840
    Model VCE: OIM
    Expression: Pr(mode|1 selected), predict()
    Outcome:   Car

    1._at: income = 30
    2._at: income = 40
    3._at: income = 50
    4._at: income = 60
    5._at: income = 70

    _____
    |_at|      Delta-method      z   P>|z|   [95% conf. interval]
    |---|-----+-----+-----+-----|
    |  1  |      .2717914   | .0329811 |  8.24 | 0.000   | .2071497   | .3364331
    |  2  |      .3169817   | .0329227 |  9.63 | 0.000   | .2524544   | .3815091
    |  3  |      .3522391   | .0391994 |  8.99 | 0.000   | .2754097   | .4290684
    |  4  |      .3760093   | .050679  |  7.42 | 0.000   | .2766802   | .4753383
    |  5  |      .3889296   | .0655865 |  5.93 | 0.000   | .2603825   | .5174768
  
```

Easily visualize the result:

. marginsplot

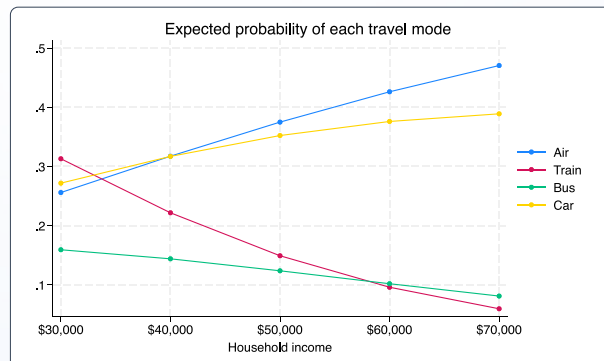


As income levels increase, what happens to the expected proportions of each travel method? Type

. margins, at(income=(30(10)70))

(output omitted)

. marginsplot



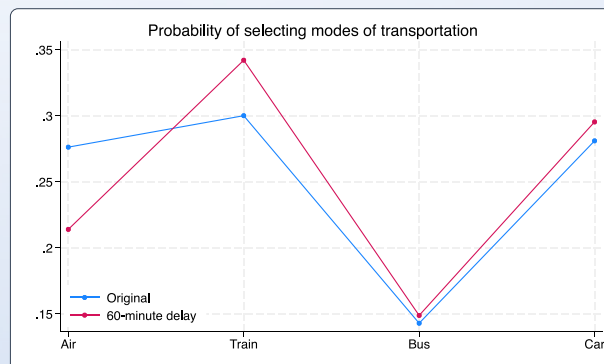
What if wait times at airports increase by an hour? How do we expect this to affect the probability of selecting air travel? How does it affect the probability of selecting car travel? Train travel? Bus travel?

. margins, alternative(Air)

at(traveltime=generate(traveltime))

at(traveltime=generate(traveltime+60))

. marginsplot



What would we expect if air travel time increases by an hour while car travel time decreases by 30 minutes?

What would we expect if the price of train travel increases by 20%?

What would we expect if ...?

You can now answer questions like these and many others.