



(R)

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Notes:

1. Unicode is supported; see [help unicode advice](#).

```

1 . doedit "C:\
2 . do "C:\
3 . *Import dataset.*
4 .
5 . import delimited "C:\
   (21 vars, 1,326 obs)

6 .
7 . *Assign labels to each variable in the dataset.*
8 .
9 . label variable alpha3 "Alpha-3 Code"

10 . label variable q5coverage "MCV1 Coverage in the Wealthiest Quintile"

11 . label variable q1coverage "MCV1 Coverage in the Poorest Quintile"

12 . label variable geoequity "Geographic Equity"

13 . label variable dtp3 "DTP3 Coverage"

14 . label variable mcv1 "MCV1 Coverage"

15 . label variable anc1 "Antenatal Care Coverage (1+ Visits)"

16 . label variable pab "Protection at Birth Against Neonatal Tetanus"

17 . label variable femeduc "Female Primary Education Completed"

18 . label variable polstability "Political Stability"

19 . label variable goveffect "Government Effectiveness"

```

```

20 . label variable corrupt "Corruption"
21 . label variable gii "Gender Inequality Index"
22 . label variable oopexp "Out-of-Pocket Health Expenditures"
23 . label variable govexp "Domestic Government Health Expenditures"
24 . label variable exthlth "External Health Spending"
25 . label variable land "Land Area"
26 . label variable lingfrac "Linguistic Fractionalization"
27 . label variable distance "Distance to Nearest Health Facility (Walking, 60+ Minutes)"
28 .
29 . *****
30 . ***Perform multiple imputation to handle missing data***
31 . *****
32 .
33 . *First, identify missing values in the dataset. Install the "mdesc" package if needed.*
34 .
35 . mdesc q5coverage qlcoverage geoequity dtp3 mcv1 anc1 pab femeduc polstability goveffect corrupt
> rac distance

```

Variable	Missing	Total	Percent Missing
q5coverage	1,110	1,326	83.71
qlcoverage	1,113	1,326	83.94
geoequity	173	1,326	13.05
dtp3	10	1,326	0.75
mcv1	8	1,326	0.60
anc1	1,008	1,326	76.02
pab	233	1,326	17.57
femeduc	537	1,326	40.50
polstability	8	1,326	0.60
goveffect	8	1,326	0.60
corrupt	7	1,326	0.53
gii	649	1,326	48.94
oopexp	140	1,326	10.56
govexp	140	1,326	10.56
exthlth	140	1,326	10.56
land	8	1,326	0.60
lingfrac	51	1,326	3.85
distance	24	1,326	1.81

```

36 .
37 . *Create a pairwise correlation matrix to identify potential auxiliary variables.*
38 .
39 . pwcrr q5coverage qlcoverage geoequity dtp3 mcv1 anc1 pab femeduc polstability goveffect corrup
> frac distance

```

	q5cove~e	qlcove~e	geoequ~y	ntp3	mcv1	anc1	pab
q5coverage	1.0000						
qlcoverage	0.6281	1.0000					
geoequity	0.2300	0.3073	1.0000				
ntp3	0.5752	0.8465	0.4849	1.0000			
mcv1	0.5457	0.8753	0.5076	0.9327	1.0000		
anc1	0.4729	0.5951	0.3168	0.6588	0.6774	1.0000	
pab	0.4227	0.5877	0.4671	0.5965	0.5821	0.4524	1.0000
femeduc	0.3703	0.5205	0.3353	0.5543	0.6116	0.4605	0.3549
polstability	0.2494	0.4526	0.2423	0.5301	0.4956	0.5417	0.3489
goveffect	0.3012	0.3078	0.2922	0.4600	0.4626	0.3677	0.3302
corrupt	0.2340	0.2832	0.1959	0.4221	0.4001	0.3809	0.3100
gii	0.0286	0.1052	0.0784	0.1231	0.1048	0.0473	-0.0129
oopexp	-0.2164	-0.3076	-0.0370	-0.1919	-0.1982	-0.3969	-0.0332
govexp	0.0955	0.3204	0.1907	0.2190	0.2678	0.2461	0.1847
exthlth	0.1314	0.2588	0.0542	0.1583	0.1176	0.1924	0.1691
land	-0.0590	-0.3470	0.0120	-0.0627	-0.0418	0.0529	-0.2108
lingfrac	-0.0580	-0.2804	-0.1435	-0.2875	-0.3367	-0.1515	-0.0855
distance	-0.0729	0.0351	0.0133	0.0245	0.0984	-0.1866	-0.0842
	femeduc	polsta~y	goveff~t	corrupt	gii	oopexp	govexp
femeduc	1.0000						
polstability	0.3344	1.0000					
goveffect	0.4249	0.4793	1.0000				
corrupt	0.2481	0.5881	0.7399	1.0000			
gii	-0.0221	-0.0051	0.0268	0.0044	1.0000		
oopexp	-0.0728	-0.4911	-0.2437	-0.4723	-0.0045	1.0000	
govexp	0.2737	0.2610	0.2712	0.3047	-0.1186	-0.2392	1.0000
exthlth	0.0355	0.2336	-0.0415	0.1797	-0.0721	-0.4768	-0.1415
land	-0.1103	-0.1418	0.1638	-0.0273	0.1948	0.0910	0.0105
lingfrac	-0.4576	-0.1729	-0.0583	-0.0730	0.0277	0.0683	-0.3200
distance	0.2705	0.0602	-0.0898	-0.0958	-0.0326	0.0677	0.2000
	exthlth	land	lingfrac	distance			
exthlth	1.0000						
land	-0.2399	1.0000					
lingfrac	0.0890	0.0268	1.0000				
distance	-0.2347	0.0031	-0.3394	1.0000			

40 .

41 . *Set the data for multiple imputation. The "mi set mlong" command generates three additional va
 > the imputed datasets and values*

42 .

43 . mi set mlong

44 .

45 . *Summarize missing values in the dataset.*

46 .

47 . mi misstable summarize q5coverage qlcoverage geoequity ntp3 mcv1 anc1 pab femeduc polstability
 > xthlth land lingfrac distance

Obs<.

Variable	Obs=.	Obs>.	Obs<.	Unique values	Min	Max
q5coverage	1,110		216	153	20	100
qlcoverage	1,113		213	182	8.2	100
geoequity	173		1,153	102	0	104
ntp3	10		1,316	75	19	99
mcv1	8		1,318	72	16	99
anc1	1,008		318	204	16.1	100
pab	233		1,093	63	31	99

	0	0																	
2	1 0	1 0	1	1		1	1	1	1		1	1	1	0		1	0	0	0
1	1 0	1 0	1	1		1	1	1	1		0	0	0	1		1	0	0	0
1	1 1	1 1	1	1		1	1	1	1		1	1	1	1		1	0	0	1
1	1 0	1 0	1	1		1	1	1	1		0	0	0	1		1	1	1	0
1	1 0	1 0	1	1		1	1	1	1		1	1	1	1		0	0	1	0
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<1	1 0	1 0	1	1		1	1	1	1		1	1	1	1		1	0	0	1
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	1		1	1	0	1
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	1		1	0	1	1
<1	1 0	1 0	1	1		1	1	1	0		1	1	1	1		1	0	1	0
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	0		0	0	0	0
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	1		0	0	1	1
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	1		0	1	1	1
<1	1 1	1 1	1	1		1	1	1	1		1	1	1	1		0	1	1	1
<1	1 0	1 0	1	1		1	1	1	1		0	0	0	0		1	0	0	0
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	0		1	1	1	0
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<1	1 0	1 0	1	1		1	1	1	1		1	1	1	0		1	1	0	1
<1	1 0	1 0	1	1		1	1	1	0		1	1	1	1		1	0	0	0
<1	1 1	1 1	1	1		1	1	1	1		0	0	0	1		1	0	1	1

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<1	1 0	1 0	1	1	1	1	0	1	1	1	1	1	1	0	0	0
<1	1 0	1 0	1	1	1	1	0	0	0	0	1	1	1	1	1	0
<1	1 0	1 0	1	1	1	1	0	1	1	1	1	0	1	1	0	0

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	0 0			
<1	1 1 1 1	1 1 1 1	1 1 1 0	0 0 0 1
	0 0			
<1	1 1 1 1	1 1 1 1	1 1 1 0	1 0 1 0
	1 0			
<1	1 1 1 1	1 1 1 1	1 1 1 0	1 1 1 1
	1 1			
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	1 1			
<1	1 1 1 1	1 1 1 1	1 1 1 1	0 0 1 1
	1 1			
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	1 1			
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	0 0			
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	1 1			
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	0 0			
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	0 0			
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	0 0			
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	0 0			
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	0 0			
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	0 0			
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	0 0			
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	1 1			
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	0 0			
<1	1 1 1 1	1 1 1 0	1 1 1 1	1 1 0 0
	0 0			
<1	1 1 1 1	1 1 1 0	1 1 1 1	1 1 0 1

	1	1																	
<1	1 0	1 0	1	1		1	1	1	0		1	1	1	1		1	1	1	1
<1	1 1	1 1	1	1		1	1	1	0		1	1	1	1		1	1	1	1
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<1	1 0	1 0	1	1		1	1	1	1		0	0	0	0		0	0	1	0
<1	1 0	1 0	1	1		1	1	1	1		0	0	0	0		1	0	1	0
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<1	1 0	1 0	1	1		1	1	1	1		0	0	0	1		0	0	0	0
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<1	1 0	1 0	1	1		1	1	1	1		0	0	0	1		1	1	0	1
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<1	1 0	1 0	1	1		1	1	1	1		1	1	1	0		0	0	1	0
<1	1 1	1 1	1	1		1	1	1	1		1	1	1	0		0	0	1	1
<1	1 1	1 1	1	1		1	1	1	1		1	1	1	0		0	1	0	1
<1	1 1	1 1	1	1		1	1	1	1		1	1	1	0		1	0	0	0
<1	1 0	1 0	1	1		1	1	1	1		1	1	1	0		1	0	1	1
<1	1 1	1 0	1	1		1	1	1	1		1	1	1	0		1	1	1	0
<1	1 1	1 1	1	1		1	1	1	1		1	1	1	1		1	0	1	0

100%

Variables are

Row 1: (1) **corrupt** (2) **goveffect** (3) **land** (4) **mcv1** (5) **polstability** (6) **ntp3** (7) **di**
 (10) **govexp** (11) **oopexp** (12) **geoequity** (13) **pab** (14) **femeduc** (15) **gii** (16) **a**
 Row 2: (1) **q5coverage** (2) **qlcoverage**

```
52 .
53 . *Register the variables to be imputed.*
54 .
55 . mi register imputed q5coverage qlcoverage geoequity ancl pab
    (1157 m=0 obs. now marked as incomplete)

56 .
57 . *Specify the imputed model.*
58 .
59 . mi impute mvn geoequity ancl pab = mcv1, add(10) rseed(54321) force
```

Performing EM optimization:

note: 37 observations omitted from EM estimation because of all imputation variables missing
 observed log likelihood = **-8367.4122** at iteration 40

Performing MCMC data augmentation ...

Multivariate imputation	Imputations =	10
Multivariate normal regression	added =	10
Imputed: m=1 through m=10	updated =	0

Prior: uniform	Iterations =	1000
	burn-in =	100
	between =	100

Variable	Observations per m			
	Complete	Incomplete	Imputed	Total
geoequity	1153	173	165	1326
ancl	318	1008	1001	1326
pab	1093	233	225	1326

(complete + incomplete = total; imputed is the minimum across m
 of the number of filled-in observations.)

Note: Right-hand-side variables (or weights) have missing values;
 model parameters estimated using listwise deletion.

```
60 .
61 . *Specify a linear regression model to estimate the missing values.*
62 .
63 . mi estimate: regress q5coverage qlcoverage geoequity ancl pab
```

Multiple-imputation estimates	Imputations	=	10
Linear regression	Number of obs	=	212
	Average RVI	=	0.1211
	Largest FMI	=	0.2395
	Complete DF	=	207
DF adjustment: Small sample	DF: min	=	82.41
	avg	=	135.34
	max	=	186.54
Model F test: Equal FMI	F(4 , 181.6)	=	29.27
Within VCE type: OLS	Prob > F	=	0.0000

	Imputation variance					Relative
	Within	Between	Total	RVI	FMI	efficiency
qlcoverage	.001692	.000076	.001775	.049141	.047829	.99524
geoequity	.00047	.000037	.000511	.087544	.082642	.991804
anc1	.002179	.000587	.002825	.296505	.239515	.976609
pab	.005428	.001351	.006914	.27388	.224846	.97801
_cons	26.8366	2.68696	29.7923	.110135	.102158	.989887

q5coverage	Coef.	Std. Err.	t	P> t	DF	% Increase Std. Err.
q1coverage	.2735273	.0421289	6.49	0.000	186.5	2.43
geoequity	.0000196	.0226001	0.00	0.999	166.0	4.29
anc1	.0722887	.0531523	1.36	0.178	82.4	13.86
pab	.1054068	.0831516	1.27	0.208	88.1	12.87
_cons	51.2888	5.458233	9.40	0.000	153.7	5.36

```

68 .
69 . *****
70 . ***Creating new variables for socioeconomic vaccine equity & integrated vaccine delivery.***
71 . *****
72 .
73 . *Create and label a new variable, "ceqr," representing the ratio of MCV1 coverage in the wealth
74 .
75 . generate ceqr = q5coverage/q1coverage
    (12,243 missing values generated)

76 . label variable ceqr "Socioeconomic Equity"

77 .
78 . *Create and label a new variable, integration, representing integrated vaccine delivery.*
79 .
80 . generate integration = 0

81 . label variable integration "Integrated Vaccine Delivery"

82 .
83 . *Create new variables representing all possible absolute differences between MCV1, DTP3, ANC1,
84 .
85 . generate abs_mcv1dtp3 = abs(mcv1-dtp3)
    (110 missing values generated)

86 . generate abs_mcv1anc1 = abs(mcv1-anc1)
    (1,089 missing values generated)

87 . generate abs_mcv1pab = abs(mcv1-pab)
    (313 missing values generated)

88 . generate abs_dtp3anc1 = abs(dtp3-anc1)
    (1,110 missing values generated)

89 . generate abs_dtp3pab = abs(dtp3-pab)
    (334 missing values generated)

90 . generate abs_anc1pab = abs(anc1-pab)
    (1,152 missing values generated)

91 .
92 . *Set "integration" to 0 if MCV1, DTP3, ANC1, and PAB all fall below 70%.*
93 .
94 . replace integration=0 if mcv1<70 & dtp3<70 & anc1<70 & pab<70
    (0 real changes made)

95 .
96 . *Set "integration" to 1 if coverage of at least one of the four services is greater than or equ
97 .
98 . replace integration=1 if mcv1>=70 | dtp3>=70 | anc1>=70 | pab>=70
    (12,089 real changes made)

99 .

```

```

100 . *Set "integration" to 2 if co-coverage levels of at least two of the four services are greater
    > percentage points of one another.*
101 .
102 . replace integration=2 if mcv1>=70 & dtp3>=70 & abs_mcv1dtp3<=10 | mcv1>=70 & anc1>=70 & abs_mcv1
    > mcv1pab<=10 | dtp3>=70 & anc1>=70 & abs_dtp3anc1<=10 | dtp3>=70 & pab>=70 & abs_dtp3pab<=10 | a
    (10,517 real changes made)

103 .
104 . *Set "integration" to 3 if co-coverage levels of at least three of the four services are greater
    > percentage points of one another.*
105 .
106 . replace integration=3 if mcv1>=70 & dtp3>=70 & anc1>=70 & abs_mcv1dtp3<=10 & abs_mcv1anc1<=10 &
    > 70 & pab>=70 & abs_mcv1dtp3<=10 & abs_mcv1pab<=10 & abs_dtp3pab<=10 | mcv1>=70 & anc1>=70 & pab
    > <=10 & abs_anc1pab<=10 | dtp3>=70 & anc1>=70 & pab>=70 & abs_dtp3anc1<=10 & abs_dtp3pab<=10 & a
    (7,627 real changes made)

107 .
108 . *Set "integration" to 4 if co-coverage levels of all four services are greater than or equal to
    > of one another.*
109 .
110 . replace integration=4 if mcv1>=70 & dtp3>=70 & anc1>=70 & pab>=70 & abs_mcv1dtp3<=10 & abs_mcv1
    > anc1<=10 & abs_dtp3pab<=10 & abs_anc1pab<=10
    (2,503 real changes made)

111 .
112 . *Create a table summarizing all values of "integration."
113 .
114 . tabulate integration

```

Integrated Vaccine Delivery	Freq.	Percent	Cum.
0	807	6.26	6.26
1	1,572	12.19	18.45
2	2,890	22.41	40.86
3	5,124	39.73	80.59
4	2,503	19.41	100.00
Total	12,896	100.00	

```

115 .
116 . *Create a new variable ("year_dup") that duplicates the "Year" column of the dataset.*
117 .
118 . generate year_dup = year

119 .
120 . ****
    > ***
121 . **Group-based trajectory analysis using geographic equity ("geoequity") as the outcome of inter
    > e**
122 . ****
    > ***

```

```

123 .
124 . *Specify a directory for reshaped files.*
125 .
126 . cd "C:\Users\sjrav\Desktop\STATA Folder Temp"
    C:\Users\sjrav\Desktop\STATA Folder Temp

127 .
128 . *Reshape the dataset from long to wide format; wide format is required to run the traj Stata pl
129 . mi reshape wide country q5coverage qlcoverage geoequity dtp3 mcv1 anc1 pab femeduc polstability
    > exthlth land lingfrac distance ceqr abs_mcvldtp3 abs_mcvlanc1 abs_mcvlpab abs_dtp3anc1 abs_dtp3
    > i(alpha3) j(year)

```

reshaping $m=0$ data ...

(note: j = 2003 2004 2005 2006 2007 2008 2009 2010 2011 2012 2013 2014 2015 2016 2017 2018 2019)

Data	long	->	wide
Number of obs.	1326	->	78
Number of variables	30	->	477
j variable (17 values)	year	->	(dropped)
xij variables:			
country	->	country2003 country2004 ... country2019	
q5coverage	->	q5coverage2003 q5coverage2004 ... q5coverage2019	
qlcoverage	->	qlcoverage2003 qlcoverage2004 ... qlcoverage2019	
geoequity	->	geoequity2003 geoequity2004 ... geoequity2019	
dtp3	->	dtp32003 dtp32004 ... dtp32019	
mcv1	->	mcv12003 mcv12004 ... mcv12019	
anc1	->	anc12003 anc12004 ... anc12019	
pab	->	pab2003 pab2004 ... pab2019	
femeduc	->	femeduc2003 femeduc2004 ... femeduc2019	
polstability	->	polstability2003 polstability2004 ... polstability2019	
goveffect	->	goveffect2003 goveffect2004 ... goveffect2019	
corrupt	->	corrupt2003 corrupt2004 ... corrupt2019	
gii	->	gii2003 gii2004 ... gii2019	
oopexp	->	oopexp2003 oopexp2004 ... oopexp2019	
govexp	->	govexp2003 govexp2004 ... govexp2019	
exthlth	->	exthlth2003 exthlth2004 ... exthlth2019	
land	->	land2003 land2004 ... land2019	
lingfrac	->	lingfrac2003 lingfrac2004 ... lingfrac2019	
distance	->	distance2003 distance2004 ... distance2019	
ceqr	->	ceqr2003 ceqr2004 ... ceqr2019	
abs_mcvldtp3	->	abs_mcvldtp32003 abs_mcvldtp32004 ... abs_mcvldtp32019	
abs_mcvlanc1	->	abs_mcvlanc12003 abs_mcvlanc12004 ... abs_mcvlanc12019	
abs_mcvlpab	->	abs_mcvlpab2003 abs_mcvlpab2004 ... abs_mcvlpab2019	
abs_dtp3anc1	->	abs_dtp3anc12003 abs_dtp3anc12004 ... abs_dtp3anc12019	
abs_dtp3pab	->	abs_dtp3pab2003 abs_dtp3pab2004 ... abs_dtp3pab2019	
abs_anc1pab	->	abs_anc1pab2003 abs_anc1pab2004 ... abs_anc1pab2019	
integration	->	integration2003 integration2004 ... integration2019	
year_dup	->	year_dup2003 year_dup2004 ... year_dup2019	

reshaping $m=1$ data ...

reshaping $m=2$ data ...

reshaping $m=3$ data ...

reshaping $m=4$ data ...

reshaping $m=5$ data ...

reshaping $m=6$ data ...

reshaping $m=7$ data ...

reshaping $m=8$ data ...

reshaping $m=9$ data ...

reshaping $m=10$ data ...

assembling results ...

130 .

131 . *Run the traj plugin using a censored normal model, with "year_dup" as the independent variable
> terest. The censored normal distribution ("cnorm") model is specified because geoequity is a re
> censored by minimum and maximum values.*

132 .

133 . *First, drop "geoequity2003" and "year_dup2003" since there is no available outcome data for th
> imes, changing only the number of groups specified ("order") and holding all other parameters c
> produces the highest BIC value.*

134 .

135 . drop geoequity2003

136 . drop year_dup2003

137 . drop integration2003

138 .

139 . traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(0 0)

==== traj stata plugin ==== Jones BL Nagin DS, build: Mar 17 2021

858 observations read.

858 observations used in the trajectory model.

Maximum Likelihood Estimates
Model: Censored Normal (cnorm)

Group	Parameter	Estimate	Standard Error	T for H0: Parameter=0	Prob > T
1	Intercept	37.21814	0.47916	77.674	0.0000
2	Intercept	71.42367	0.37870	188.602	0.0000
	Sigma	29.08228	0.17730	164.029	0.0000
Group membership					
1	(%)	41.32175	1.80656	22.873	0.0000
2	(%)	58.67825	1.80656	32.481	0.0000

BIC=-65502.21 (N=13563) BIC=-65496.69 (N=858) AIC=-65487.18 ll= -65483.18

Entropy = 0.911

140 . traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(0 0 0)

==== traj stata plugin ==== Jones BL Nagin DS, build: Mar 17 2021

858 observations read.

858 observations used in the trajectory model.

Maximum Likelihood Estimates
Model: Censored Normal (cnorm)

Group	Parameter	Estimate	Standard Error	T for H0: Parameter=0	Prob > T
1	Intercept	34.48031	0.63902	53.958	0.0000
2	Intercept	58.93798	1.52642	38.612	0.0000
3	Intercept	76.92272	0.77407	99.375	0.0000
	Sigma	28.47316	0.17618	161.614	0.0000
Group membership					
1	(%)	33.85012	2.17934	15.532	0.0000
2	(%)	29.27772	2.52098	11.614	0.0000
3	(%)	36.87216	3.20559	11.502	0.0000

BIC=-65409.32 (N=13563) BIC=-65401.04 (N=858) AIC=-65386.77 ll= -65380.77

Entropy = 0.761

141 . traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(0 0 0 0)

==== traj stata plugin ==== Jones BL Nagin DS, build: Mar 17 2021

858 observations read.

858 observations used in the trajectory model.

Maximum Likelihood Estimates
Model: Censored Normal (cnorm)

Group	Parameter	Estimate	Standard Error	T for H0: Parameter=0	Prob > T
1	Intercept	22.18748	1.19543	18.560	0.0000
2	Intercept	41.32798	0.75649	54.631	0.0000
3	Intercept	63.80735	1.12093	56.924	0.0000
4	Intercept	78.75269	0.89054	88.432	0.0000
	Sigma	28.10855	0.17490	160.713	0.0000
Group membership					
1	(%)	9.36152	1.37983	6.785	0.0000
2	(%)	30.67877	1.94765	15.752	0.0000
3	(%)	31.23747	3.12988	9.980	0.0000
4	(%)	28.72223	3.39676	8.456	0.0000

BIC=-65348.06 (N=13563) BIC=-65337.02 (N=858) AIC=-65318.00 ll= -65310.00

Entropy = 0.745

```
142 . traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(0 0 0 0 0)
```

```
==== traj stata plugin ==== Jones BL Nagin DS, build: Mar 17 2021
```

```
858 observations read.
```

```
858 observations used in the trajectory model.
```

Maximum Likelihood Estimates
Model: Censored Normal (cnorm)

Group	Parameter	Estimate	Standard Error	T for H0: Parameter=0	Prob > T
1	Intercept	22.18685	1.19548	18.559	0.0000
2	Intercept	41.32638	0.75622	54.649	0.0000
3	Intercept	63.79922	1.11458	57.241	0.0000
4	Intercept	78.73550	0.82156	95.837	0.0000
5	Intercept	86.04447	42.68093	2.016	0.0438
	Sigma	28.10837	0.17489	160.718	0.0000
Group membership					
1	(%)	9.36067	1.37980	6.784	0.0000
2	(%)	30.67628	1.94742	15.752	0.0000
3	(%)	31.21126	3.10064	10.066	0.0000
4	(%)	28.71695	3.40292	8.439	0.0000
5	(%)	0.03485	0.90134	0.039	0.9692

```
BIC=-65357.58 (N=13563) BIC=-65343.77 (N=858) AIC=-65320.00 ll= -65310.00
```

```
Entropy = 0.779
```

```
143 .
```

```
144 . *The two-group model produced a high BIC value, so we will move forward with this option. Next,
> group to achieve the largest possible BIC. The model below represents the tested option with t
> membership in each group. The "detail" command generates parameter estimates that will be used
> a later step.*
```

```
145 .
```

```
146 . traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(1 1) tcov(integr
```

```
==== traj stata plugin ==== Jones BL Nagin DS, build: Mar 17 2021
```

```
858 observations read.
```

```
858 observations used in the trajectory model.
```

```
Start
```

```
Parameter estimates
```

```
35.01100, 0.00000, 0.00000, 79.80680, 0.00000, 0.00000,
33.59685, 50.00000, 50.00000
```

```
Neg. Log Likelihood Percent Decrease
```

```
0 65968.9581171
```

```
too big of a step
```

```
too big of a step
```

```
1 65751.5765772 0.32952095
2 65749.3238922 0.00342605
3 65747.4340507 0.00287431
4 65743.6878109 0.00569793
```

5	65739.0457890	0.00706079
6	65734.3557857	0.00713427
7	65523.9087774	0.32014767
8	65500.3373013	0.03597386
9	65497.6523533	0.00409914
10	65497.3213103	0.00050543
11	65497.2993145	0.00003358
12	65497.2436275	0.00008502
13	65469.3978156	0.04251448
14	65402.2554153	0.10255540
15	64929.7921616	0.72239596
16	64887.7164876	0.06480180
17	64853.8489856	0.05219401
18	64801.5897323	0.08058003
19	64796.3001512	0.00816273
20	64795.8364988	0.00071555
21	64795.4314414	0.00062513
22	64794.4066987	0.00158150
23	64791.1645075	0.00500381
24	64783.1238211	0.01241016
25	64761.9073839	0.03274994
26	64708.2619383	0.08283488
27	64575.5820429	0.20504321
28	64274.0243521	0.46698408
29	63753.0146241	0.81060698
30	63339.5853713	0.64848581
31	62928.9183533	0.64835760
32	62679.7152629	0.39600727
33	62538.9340260	0.22460414
34	62523.5477515	0.02460271
35	62520.8194404	0.00436365
36	62520.5509345	0.00042947
37	62520.4938731	0.00009127
38	62520.4871447	0.00001076
39	62520.4813751	0.00000923
40	62520.4021108	0.00012678
41	62520.2348776	0.00026749
42	62519.8106931	0.00067848
43	62518.7124596	0.00175662
44	62515.9789242	0.00437235
45	62509.6100490	0.01018760
46	62497.2721119	0.01973766
47	62482.0289358	0.02439015
48	62471.7584717	0.01643747
49	62467.8411770	0.00627051
50	62467.7067824	0.00021514
51	62467.7049393	0.00000295
52	62467.7049121	0.00000004
53	62467.7049101	0.00000000

Maximum Likelihood Estimates
Model: Censored Normal (cnorm)

Group	Parameter	Estimate	Standard Error	T for H0: Parameter=0	Prob > T
1	Intercept	-3508.41607	157.90245	-22.219	0.0000
	Linear	1.75532	0.07861	22.329	0.0000
	integration2	6.61464	0.29670	22.294	0.0000
2	Intercept	-8101.39374	118.93935	-68.114	0.0000
	Linear	4.05227	0.05923	68.419	0.0000
	integration2	7.26871	0.33440	21.736	0.0000
	Sigma	23.28173	0.14201	163.943	0.0000

```

Group membership
1      (%)      39.68346      1.80566      21.977      0.0000
2      (%)      60.31654      1.80566      33.404      0.0000

```

```

BIC=-62505.77 (N=13563)  BIC=-62494.72 (N=858)  AIC=-62475.70  ll= -62467.70

```

```

Parameter estimates for adding risk factors

```

```

-3508.41607,      1.75532,      6.61464,-8101.39374,      4.05227,      7.26871,
  23.28173,      0.41867

```

```

Parameter estimates

```

```

-3508.41607,      1.75532,      6.61464,-8101.39374,      4.05227,      7.26871,
  23.28173,      39.68346,      60.31654

```

```

Entropy = 0.923

```

```

147 .
148 . *Plot the trajectories for the two groups, along with accompanying confidence intervals. Assess
> an additional diagnostic check for the model (i.e., narrower, non-overlapping CIs are preferred)
149 .
150 . trajplot, xtitle("Year") ytitle("Percentage of districts with 80% MCV1 coverage or higher") ci
151 .
152 . *Perform parametric bootstrap sampling to estimate group size confidence intervals.*
153 .
154 . matrix strt = -3508.41607, 1.75532, 6.61464, -8101.39374, 4.05227, 7.26871, 23.28173, 39.68346,
155 .
156 . bootstrap_b (100/(1+exp(_b[theta2]))) (100*exp(_b[theta2])/(1+exp(_b[theta2])), reps(1000) do
> ity*) indep(year_dup*) min(-1000) max(1000) order(1 1) tcov(integration*) start(strt) novar
(running traj on estimation sample)

```

```

Bootstrap replications (1000)

```

```

-----|----- 1 -----|----- 2 -----|----- 3 -----|----- 4 -----|----- 5
..... 500
..... 1000

```

```

Bootstrap results                                Number of obs      =           858
                                                Replications        =           1,000

```

```

command: traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(1
novar
[_eq2]_bs_1: 100/(1+exp(_b[theta2]))
[_eq2]_bs_2: 100*exp(_b[theta2])/(1+exp(_b[theta2]))

```

	Observed Coef.	Bootstrap Std. Err.	z	P> z	Normal-based [95% Conf. Interval]	
_eq1						
interc1	-3508.416	230.3577	-15.23	0.000	-3959.909	-3056.923
linear1	1.755322	.1148566	15.28	0.000	1.530207	1.980437
integration2G1	6.61464	.5016852	13.18	0.000	5.631355	7.597925
interc2	-8101.394	164.3837	-49.28	0.000	-8423.58	-7779.208
linear2	4.052272	.0821005	49.36	0.000	3.891359	4.213186
integration2G2	7.26871	.4921719	14.77	0.000	6.304071	8.233349
sigma	23.28172	.2549613	91.31	0.000	22.782	23.78143
theta2	.4186719	.0845333	4.95	0.000	.2529897	.5843541
_eq2						
_bs_1	39.68346	2.017103	19.67	0.000	35.73001	43.63691
_bs_2	60.31654	2.017103	29.90	0.000	56.36309	64.26999

```
157 .
158 . estat bootstrap, percentile bc
```

```
Bootstrap results      Number of obs      =      858
                       Replications      =      1000
```

```
command: traj, model(cnorm) var(geoequity*) indep(year_dup*) min(-1000) max(1000) order(1)
          novar
[_eq2]_bs_1: 100/(1+exp(_b[theta2]))
[_eq2]_bs_2: 100*exp(_b[theta2])/(1+exp(_b[theta2]))
```

	Observed Coef.	Bias	Bootstrap Std. Err.	[95% Conf. Interval]		
_eq1						
interc1	-3508.4161	9.88824	230.35772	-3948.979	-3017.529	(P)
				-3950.927	-3022.375	(BC)
linear1	1.755322	-.0049411	.11485661	1.510217	1.974707	(P)
				1.513038	1.975496	(BC)
integratio~1	6.61464	.0158754	.50168517	5.663135	7.671028	(P)
				5.64512	7.632634	(BC)
interc2	-8101.3937	3.586975	164.38365	-8408.338	-7776.332	(P)
				-8411.163	-7779.813	(BC)
linear2	4.0522725	-.0018116	.08210047	3.889759	4.205448	(P)
				3.892282	4.207128	(BC)
integratio~2	7.2687099	.0188222	.49217193	6.342952	8.263218	(P)
				6.273336	8.211984	(BC)
sigma	23.281717	-.0164842	.25496134	22.76464	23.79466	(P)
				22.82456	23.84458	(BC)
theta2	.41867188	.0010867	.08453328	.2564751	.5947749	(P)
				.2540792	.5897055	(BC)
_eq2						
_bs_1	39.68346	-.0082364	2.0171027	35.55401	43.62304	(P)
				35.67024	43.68197	(BC)
_bs_2	60.31654	.0082364	2.0171027	56.37696	64.446	(P)
				56.31803	64.32976	(BC)

```
(P)    percentile confidence interval
(BC)    bias-corrected confidence interval
```

```
159 .
160 . *Create a program, "trajstats," to calculate several other diagnostic criteria for group-based
161 .
162 . program trajstats
163 .     1.
164 .     2.
165 . *This step calculates the average posterior probability.*
```

```

166 . generate Mp=0
167 .   3.
167 .   foreach i of varlist _traj_ProbG* {
167 .       4.         replace Mp = `i' if `i' > Mp
167 .       5.       }
167 .       6.       sort _traj_Group
167 .       7.
168 . by _traj_Group: generate countG = _N
168 .   8.
169 . *This step calculates the odds of correct classification.*
170 .
171 .   by _traj_Group: egen groupAPP = mean(Mp)
171 .     9.   by _traj_Group: generate counter = _n
171 .     10.  generate n = groupAPP/(1 - groupAPP)
171 .     11.  generate p = countG/_N
171 .     12.  generate d = p/(1-p)
171 .     13.  generate occ = n/d
171 .     14.
172 . *This step calculates the estimated group probabilities vs. the proportion of the sample assigned
173 .
174 .     scalar c = 0
174 .     gen TotProb = 0
174 .     foreach i of varlist _traj_ProbG* {
174 .         15.     scalar c = c + 1
174 .         16.     quietly summarize `i'
174 .         17.     replace TotProb = r(sum)/_N if _traj_Group == c
174 .         18.   }
174 .         19.     gen d_pp = TotProb/(1 - TotProb)
174 .         20.     gen occ_pp = n/d_pp
174 .         21.
174 .         22.
174 .         23.
175 . *This step displays:
176 .   *Group number [_traj_~p],
177 .   *Count per group (based on the max post prob), [countG]
178 .   *Average posterior probability for each group, [groupAPP]
179 .   *Odds of correct classification (based on the maximum posterior group assignment rule), [occ]
180 .   *Odds of correct classification (based on the weighted posterior probabilities), [occ_pp]
181 .   *Observed probability of groups [p] versus the probability based on the posterior probabilities
182 .
183 . list _traj_Group countG groupAPP occ occ_pp p TotProb if counter == 1
183 .   24.
184 . restore
184 .   25.
185 . end

186 .
187 . *Now, run the trajstats program.*
188 .
189 . trajstats
189 .   (858 real changes made)
189 .   (511 real changes made)
189 .   (347 real changes made)
189 .   (511 real changes made)

```

	traj~p	countG	groupAPP	occ	occ_pp	p	TotProb
1.	1	347	.9624406	37.73522	38.94767	.4044289	.3968351
348.	2	511	.9872454	52.56156	50.9253	.5955711	.603165

```

190 .
    end of do-file

191 . graph export "C:\Users\sjrav\Desktop\Disseration\Aim 3 - Quantitative Analysis\Data\STATA Outp
> - trajplot.png", as(png) replace
    (file C:\Users\sjrav\Desktop\Disseration\Aim 3 - Quantitative Analysis\Data\STATA Output\MI GBTM
> .png written in PNG format)

192 . do "C:\Users\sjrav\AppData\Local\Temp\STD1e2c_000000.tmp"

193 . *Reshape the dataset from wide to long format.*
194 .
195 . mi reshape long country q5coverage q1coverage geoequity dtp3 mcv1 anc1 pab femeduc polstability
> exthlth land lingfrac distance ceqr abs_mcvldtp3 abs_mcvlanc1 abs_mcvlpab abs_dtp3anc1 abs_dtp3
> i(alpha3) j(year)
    (imputed variable geoequity2003 unregistered because not in m=0)

reshaping m=0 data ...
(note: j = 2003 2004 2005 2006 2007 2008 2009 2010 2011 2012 2013 2014 2015 2016 2017 2018 2019)
(note: geoequity2003 not found)
(note: integration2003 not found)
(note: year_dup2003 not found)

```

Data	wide	->	long
Number of obs.	78	->	1326
Number of variables	477	->	33
j variable (17 values)		->	year
xij variables:			
country2003 country2004 ... country2019		->	country
q5coverage2003 q5coverage2004 ... q5coverage2019		->	q5coverage
q1coverage2003 q1coverage2004 ... q1coverage2019		->	q1coverage
geoequity2003 geoequity2004 ... geoequity2019		->	geoequity
dtp32003 dtp32004 ... dtp32019		->	dtp3
mcv12003 mcv12004 ... mcv12019		->	mcv1
anc12003 anc12004 ... anc12019		->	anc1
pab2003 pab2004 ... pab2019		->	pab
femeduc2003 femeduc2004 ... femeduc2019		->	femeduc
polstability2003 polstability2004 ... polstability2019		->	polstability
goveffect2003 goveffect2004 ... goveffect2019		->	goveffect
corrupt2003 corrupt2004 ... corrupt2019		->	corrupt
gii2003 gii2004 ... gii2019		->	gii
oopexp2003 oopexp2004 ... oopexp2019		->	oopexp
govexp2003 govexp2004 ... govexp2019		->	govexp
exthlth2003 exthlth2004 ... exthlth2019		->	exthlth
land2003 land2004 ... land2019		->	land
lingfrac2003 lingfrac2004 ... lingfrac2019		->	lingfrac
distance2003 distance2004 ... distance2019		->	distance
ceqr2003 ceqr2004 ... ceqr2019		->	ceqr
abs_mcvldtp32003 abs_mcvldtp32004 ... abs_mcvldtp32019		->	abs_mcvldtp3
abs_mcvlanc12003 abs_mcvlanc12004 ... abs_mcvlanc12019		->	abs_mcvlanc1
abs_mcvlpab2003 abs_mcvlpab2004 ... abs_mcvlpab2019		->	abs_mcvlpab
abs_dtp3anc12003 abs_dtp3anc12004 ... abs_dtp3anc12019		->	abs_dtp3anc1
abs_dtp3pab2003 abs_dtp3pab2004 ... abs_dtp3pab2019		->	abs_dtp3pab
abs_anc1pab2003 abs_anc1pab2004 ... abs_anc1pab2019		->	abs_anc1pab
integration2003 integration2004 ... integration2019		->	integration
year_dup2003 year_dup2004 ... year_dup2019		->	year_dup

```
reshaping m=1 data ...
```

```
reshaping m=2 data ...
```

```
reshaping m=3 data ...
```

reshaping $m=4$ data ...

reshaping $m=5$ data ...

reshaping $m=6$ data ...

reshaping $m=7$ data ...

reshaping $m=8$ data ...

reshaping $m=9$ data ...

reshaping $m=10$ data ...

assembling results ...

196 .

197 . *Perform multinomial logistic regression to identify covariates with statistically significant
> etting Group 1 membership as the base outcome.*

198 .

199 . mlogit _traj_Group femeduc polstability goveffect corrupt gii oopexp govexp exthlth land lingfrac
> 1)

Iteration 0: log likelihood = **-2112.8518**
Iteration 1: log likelihood = **-1649.5314**
Iteration 2: log likelihood = **-1624.3003**
Iteration 3: log likelihood = **-1621.6018**
Iteration 4: log likelihood = **-1621.4697**
Iteration 5: log likelihood = **-1621.4697**

Multinomial logistic regression	Number of obs	=	3,286
	LR chi2(12)	=	982.76
	Prob > chi2	=	0.0000
Log likelihood = -1621.4697	Pseudo R2	=	0.2326

_traj_Group	Coef.	Std. Err.	z	P> z	[95% Conf. Interval]	
1	(base outcome)					
2						
femeduc	-.0131726	.0031188	-4.22	0.000	-.0192852	-.0070599
polstability	-.1589456	.0804469	-1.98	0.048	-.3166187	-.0012725
goveffect	2.346586	.1676277	14.00	0.000	2.018042	2.675131
corrupt	-.9473753	.1416815	-6.69	0.000	-1.225066	-.6696847
gii	2.357569	.2474551	9.53	0.000	1.872566	2.842572
oopexp	.0153801	.003042	5.06	0.000	.0094179	.0213422
govexp	.003264	.0005131	6.36	0.000	.0022584	.0042697
exthlth	.0392419	.0035584	11.03	0.000	.0322675	.0462163
land	5.02e-07	9.25e-08	5.43	0.000	3.20e-07	6.83e-07
lingfrac	-2.795083	.2120787	-13.18	0.000	-3.21075	-2.379417
distance	-.0300936	.0023104	-13.03	0.000	-.0346219	-.0255653
integration	.0886595	.0498386	1.78	0.075	-.0090224	.1863414
_cons	2.446878	.3885081	6.30	0.000	1.685416	3.20834

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