

This example demonstrates how %GEEZIP is used to model pre and post zero inflated count data with continuous covariates.

The data used in this example was simulated. For each observation  $i$ , there are three independent continuous covariates  $x_{i1}, x_{i2}, x_{i3}$ , each of which follows a normal distribution  $N(1,1)$ . The bivariate pre and post count response  $y_i = (y_{i1}, y_{i2})$  satisfies the following marginal ZIP model:

$$y_{it}|x_{i1}, x_{i2}, x_{i3} \sim ZIP(\rho_i, \mu_i)$$

$$\text{logit}(\rho_i) = \beta_{u0}$$

$$\log(\mu_i) = \beta_0 + x_{i1}\beta_1 + x_{i2}\beta_2 + x_{i3}\beta_3$$

In the simulated data, we set  $\beta_{u0} = -1$ ;  $\beta_0 = \beta_1 = \beta_2 = \beta_3 = 1$ .

The simulated data used to demonstrate is shown below

```
data mydata;
  input id count time x1 x2 x3 @@;
  datalines;
1      37      1      0.06155278  2.148548496 0.434040304
2      139     1      1.801373099  0.080430585 2.092864909
3       15     1      -0.504148447      1.158435425 0.771048924
4        1     1      -0.686471459      0.355961741 -0.145750225
5        7     1      -0.820546857      0.442175622 1.825474402
6       11     1      0.268240074  0.802493407 0.080893178
7        0     1      -0.493636867      0.375293153 0.573253225
8        8     1      0.72767749   0.070195021 -0.228101346
9       23     1      0.527134111  1.196801133 0.589503425
10      5      1      -1.540530272      1.619615831 1.071691351
11     200     1      0.934676218  1.012937027 2.408493739
12     321     1      1.613109628  1.395561261 1.772718184
13     86     1      -0.665947638      2.601282293 1.476294195
14      0     1      2.58609672   0.070249734 1.204037005
15     75     1      1.633343397  0.058584787 1.501908833
16    4117     1      2.158476338  2.344014304 2.809786812
17     13     1      1.639288732  0.140851515 0.190201761
18     10     1      -0.26405467  0.915985131 0.848716353
19      0     1      -0.132223162      1.041922045 1.864684555
20      4     1      0.284495636  0.100280935 0.238173281
21      0     1      -0.07853971  2.345437551 -0.133841944
22    1543     1      2.815858844  1.584458271 1.939240632
23    106     1      1.815947006  1.204528823 0.510764623
24      6     1      -0.919935918      1.01288542  1.441913079
25      0     1      1.600916988  0.987582435 0.001774726
26     74     1      -0.805464711      0.700728191 3.417625719
27     40     1      1.158006518  0.318182064 1.247635988
28      0     1      1.832724378  1.880785968 0.382622566
29      0     1      0.669880454  0.038102551 0.630297368
30     241     1      1.041165514  1.682074495 1.799590357
31      5     1      1.826781029 -1.936939901      0.954953194
32     45     1      1.298312616  0.588530186 0.835506127
33    952     1      1.205678291  1.122062448 3.524682698
34      2     1      -0.248608134      0.25198281  0.913111879
```

35	109	1	3.102556754	1.124687414	-0.416833253	
36	213	1	1.01369739	1.218032003	2.181664059	
37	0	1	0.491717946	2.686430712	1.264299687	
38	57	1	1.538281573	1.640759419	-0.388871051	
39	76	1	0.831307714	1.110495127	1.505124911	
40	29	1	0.10000232	2.629723576	-0.495964427	
41	0	1	2.237064622	1.201867297	0.516706244	
42	2	1	-1.028786768	0.330159096	0.191258677	
43	20	1	-0.138692937	1.364370033	0.618534677	
44	90	1	1.933672104	1.591918153	-0.197365162	
45	0	1	0.492817929	-0.719812154	0.019198246	
46	13	1	0.172185728	1.240199677	0.417637589	
47	19	1	0.285813009	0.590229573	1.419569923	
48	1	1	-0.820661872	-0.38471966	1.124148233	
49	26	1	1.394492725	-0.268906917	1.041842922	
50	107	1	1.998495218	1.093543328	0.665449117	
51	1053	1	0.979190049	2.444203043	2.490915015	
52	21	1	1.874292524	0.098065975	0.254254291	
53	31	1	1.226109818	0.527391491	0.644971437	
54	0	1	2.356911517	0.775583104	1.859593196	
55	155	1	2.299232416	2.500828472	-0.728587176	
56	65	1	1.217483374	1.481188675	0.497854519	
57	26	1	1.48400698	-0.815609677	1.300043223	
58	0	1	2.48713067	0.90949837	0.831035604	
59	0	1	1.315560455	0.150026561	0.493335813	
60	4	1	-0.644685681	1.105909031	-0.442400788	
61	534	1	2.321458044	1.370274483	1.559825769	
62	13	1	-0.460574532	-0.198342202	2.275644021	
63	280	1	1.62745939	2.096186064	0.907013322	
64	1	1	-1.462302942	0.131325555	0.808617873	
65	60	1	2.628936719	0.134406434	0.446405554	
66	32	1	1.294384341	1.18273574	-0.231874576	
67	14	1	0.08413495	1.949344126	-0.382151923	
68	87	1	-0.411609242	1.708463382	2.053365065	
69	3	1	-0.554934502	-0.167479704	-0.131514797	
70	0	1	-1.101663245	0.935372333	-0.86894494	
71	12	1	0.189842914	2.21741084	-0.788981857	
72	0	1	0.740625863	0.794476382	0.71140164	
73	0	1	1.715290086	2.143801108	0.816039282	
74	0	1	1.252572723	3.022170235	-0.004890403	
75	25	1	-0.373922989	0.056760082	2.416334131	
76	11	1	1.411277797	-0.3071286	-0.076262558	
77	260	1	1.058433007	1.960420741	1.494615753	
78	10	1	1.04273236	-0.236274723	0.332190734	
79	0	1	1.582046761	1.135317898	0.595587385	
80	56	1	1.852239065	0.420771426	0.84740689	
81	0	1	-0.095761603	1.702980397	0.906572762	
82	0	1	-1.484126124	0.724602174	0.52956048	
83	53	1	0.728951443	1.151280293	1.008606828	
84	71	1	1.024409437	1.374301981	0.687993842	
85	0	1	-1.01518042	0.054318734	1.487828812	
86	0	1	-0.172992781	-0.617774526	1.395822374	
87	95	1	2.354415617	1.134775138	-0.130221596	
88	232	1	3.598660247	1.893259548	-1.095419869	
89	16	1	1.708743348	0.830808035	-0.805728862	
90	31	1	0.8056603	0.862692183	0.856548543	
91	98	1	0.854586785	2.390460476	0.312085051	

92	485	1	1.769052428	3.404715908	0.057472015	
93	320	1	1.111846819	2.209737982	1.589324759	
94	0	1	0.984481251	1.121123717	0.749495271	
95	3178	1	2.563733829	2.468397009	2.013996089	
96	61	1	2.15334645	0.178267871	0.843308478	
97	0	1	-0.127117911	0.564778856	0.038863895	
98	182	1	0.905156631	0.819153039	2.571524279	
99	60	1	1.390395848	1.56900858	0.487291816	
100	3166	1	2.355217089	1.50671147	3.209739736	
1	43	2	0.06155278	2.148548496	0.434040304	
2	145	2	1.801373099	0.080430585	2.092864909	
3	12	2	-0.504148447	1.158435425	0.771048924	
4	0	2	-0.686471459	0.355961741	-0.145750225	
5	13	2	-0.820546857	0.442175622	1.825474402	
6	9	2	0.268240074	0.802493407	0.080893178	
7	0	2	-0.493636867	0.375293153	0.573253225	
8	5	2	0.72767749	0.070195021	-0.228101346	
9	32	2	0.527134111	1.196801133	0.589503425	
10	10	2	-1.540530272	1.619615831	1.071691351	
11	195	2	0.934676218	1.012937027	2.408493739	
12	321	2	1.613109628	1.395561261	1.772718184	
13	90	2	-0.665947638	2.601282293	1.476294195	
14	0	2	2.58609672	0.070249734	1.204037005	
15	62	2	1.633343397	0.058584787	1.501908833	
16	4019	2	2.158476338	2.344014304	2.809786812	
17	20	2	1.639288732	0.140851515	0.190201761	
18	12	2	-0.26405467	0.915985131	0.848716353	
19	0	2	-0.132223162	1.041922045	1.864684555	
20	7	2	0.284495636	0.100280935	0.238173281	
21	0	2	-0.07853971	2.345437551	-0.133841944	
22	1569	2	2.815858844	1.584458271	1.939240632	
23	94	2	1.815947006	1.204528823	0.510764623	
24	15	2	-0.919935918	1.01288542	1.441913079	
25	0	2	1.600916988	0.987582435	0.001774726	
26	74	2	-0.805464711	0.700728191	3.417625719	
27	43	2	1.158006518	0.318182064	1.247635988	
28	0	2	1.832724378	1.880785968	0.382622566	
29	0	2	0.669880454	0.038102551	0.630297368	
30	259	2	1.041165514	1.682074495	1.799590357	
31	7	2	1.826781029	-1.936939901	0.954953194	
32	43	2	1.298312616	0.588530186	0.835506127	
33	934	2	1.205678291	1.122062448	3.524682698	
34	5	2	-0.248608134	0.25198281	0.913111879	
35	115	2	3.102556754	1.124687414	-0.416833253	
36	228	2	1.01369739	1.218032003	2.181664059	
37	0	2	0.491717946	2.686430712	1.264299687	
38	52	2	1.538281573	1.640759419	-0.388871051	
39	95	2	0.831307714	1.110495127	1.505124911	
40	28	2	0.10000232	2.629723576	-0.495964427	
41	0	2	2.237064622	1.201867297	0.516706244	
42	1	2	-1.028786768	0.330159096	0.191258677	
43	19	2	-0.138692937	1.364370033	0.618534677	
44	84	2	1.933672104	1.591918153	-0.197365162	
45	0	2	0.492817929	-0.719812154	0.019198246	
46	14	2	0.172185728	1.240199677	0.417637589	
47	30	2	0.285813009	0.590229573	1.419569923	
48	1	2	-0.820661872	-0.38471966	1.124148233	

49	24	2	1.394492725	-0.268906917	1.041842922
50	132	2	1.998495218	1.093543328	0.665449117
51	965	2	0.979190049	2.444203043	2.490915015
52	21	2	1.874292524	0.098065975	0.254254291
53	36	2	1.226109818	0.527391491	0.644971437
54	0	2	2.356911517	0.775583104	1.859593196
55	173	2	2.299232416	2.500828472	-0.728587176
56	81	2	1.217483374	1.481188675	0.497854519
57	19	2	1.48400698	-0.815609677	1.300043223
58	0	2	2.48713067	0.90949837	0.831035604
59	0	2	1.315560455	0.150026561	0.493335813
60	2	2	-0.644685681	1.105909031	-0.442400788
61	506	2	2.321458044	1.370274483	1.559825769
62	14	2	-0.460574532	-0.198342202	2.275644021
63	259	2	1.62745939	2.096186064	0.907013322
64	0	2	-1.462302942	0.131325555	0.808617873
65	75	2	2.628936719	0.134406434	0.446405554
66	29	2	1.294384341	1.18273574	-0.231874576
67	15	2	0.08413495	1.949344126	-0.382151923
68	87	2	-0.411609242	1.708463382	2.053365065
69	0	2	-0.554934502	-0.167479704	-0.131514797
70	0	2	-1.101663245	0.935372333	-0.86894494
71	10	2	0.189842914	2.21741084	-0.788981857
72	0	2	0.740625863	0.794476382	0.71140164
73	0	2	1.715290086	2.143801108	0.816039282
74	0	2	1.252572723	3.022170235	-0.004890403
75	25	2	-0.373922989	0.056760082	2.416334131
76	11	2	1.411277797	-0.3071286	-0.076262558
77	242	2	1.058433007	1.960420741	1.494615753
78	8	2	1.04273236	-0.236274723	0.332190734
79	0	2	1.582046761	1.135317898	0.595587385
80	63	2	1.852239065	0.420771426	0.84740689
81	0	2	-0.095761603	1.702980397	0.906572762
82	0	2	-1.484126124	0.724602174	0.52956048
83	65	2	0.728951443	1.151280293	1.008606828
84	53	2	1.024409437	1.374301981	0.687993842
85	9	2	-1.01518042	0.054318734	1.487828812
86	0	2	-0.172992781	-0.617774526	1.395822374
87	70	2	2.354415617	1.134775138	-0.130221596
88	203	2	3.598660247	1.893259548	-1.095419869
89	13	2	1.708743348	0.830808035	-0.805728862
90	29	2	0.8056603	0.862692183	0.856548543
91	94	2	0.854586785	2.390460476	0.312085051
92	500	2	1.769052428	3.404715908	0.057472015
93	389	2	1.111846819	2.209737982	1.589324759
94	0	2	0.984481251	1.121123717	0.749495271
95	3066	2	2.563733829	2.468397009	2.013996089
96	72	2	2.15334645	0.178267871	0.843308478
97	0	2	-0.127117911	0.564778856	0.038863895
98	188	2	0.905156631	0.819153039	2.571524279
99	83	2	1.390395848	1.56900858	0.487291816
100	3220	2	2.355217089	1.50671147	3.209739736

;  
run;

The macro is used to fit the above data set to estimate the parameter value  $\theta = (\beta_{u0}, \beta_0, \beta_1, \beta_2, \beta_3)$  and its corresponding asymptotic variances. The following statements should be used:

```
filename GEEZIP URL
"http://www.ctspedia.org/wiki/pub/CTSpedia/StatToolsTopic051/Rochester_GEEZIP
.sas";
%include GEEZIP;

%GEEZIP (DSName=mydata,
        Outcome=count,
        PredictNum=x1 x2 x3,
        ID=id,
        Time=time,
        OutForm=);
```

The output generated from these statements are the parameter estimate *theta* and the asymptotic standard deviation *sigma*:

*theta*=(-1.25, 0.81, 1.07, 1.03, 1.07)

*sigma*=(0.24, 0.14, 0.06, 0.07, 0.05)