

## 设立双对数模型消除量纲的影响

Dependent Variable: LOG(Y)  
Method: Least Squares  
Date: 06/24/20 Time: 19:55  
Sample: 2001 2017  
Included observations: 17

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-13.13508	3.463622	-3.792297	0.0026
LOG(X1)	2.778341	0.664735	4.179623	0.0013
LOG(X2)	-0.760149	0.286397	-2.654181	0.0210
LOG(X3)	-0.293647	0.745133	-0.394087	0.7004
LOG(X4)	0.197749	0.119079	1.660655	0.1227
R-squared	0.939835	Mean dependent var	7.851729	
Adjusted R-squared	0.919780	S.D. dependent var	0.614905	
S.E. of regression	0.174161	Akaike info criterion	-0.417750	
Sum squared resid	0.363983	Schwarz criterion	-0.172687	
Log likelihood	8.550872	Hannan-Quinn criter.	-0.393390	
F-statistic	46.86275	Durbin-Watson stat	0.723474	
Prob(F-statistic)	0.000000			

$R^2=0.94$ ，修正的  $R^2=0.91$ ，模型整体拟合效果较好，模型对网络消费的解释力度达到了 94%，F 统计量等于 46.86，在 5% 的显著性水平下它是显著的，说明模型整体上是显著的。

LogX3 和 logX4 的 t 检验在统计意义上不显著，logx3 的符号和我们的预期是相反的，这显然与我们的实践经验是不相符合的，这是严重多重共线性导致的典型现象，我们用相关系数法和方差扩大因子法检验多重共线性。

## 相关系数法检验多重共线性

	LOG(X1)	LOG(X2)	LOG(X3)	LOG(X4)
LOG(X1)	1.000000	0.946221	0.930585	0.832379
LOG(X2)	0.946221	1.000000	0.947904	0.939013
LOG(X3)	0.930585	0.947904	1.000000	0.945609
LOG(X4)	0.832379	0.939013	0.945609	1.000000

相关系数矩阵每两个解释变量之间的相关系数都很大，均大于 0.8，解释变量之间可能存在严重的多重共线性。

# 方差扩大因子法

Variance Inflation Factors  
Date: 06/24/20    Time: 20:04  
Sample: 2001 2017  
Included observations: 17

Variable	Coefficient Variance	Uncentered VIF	Centered VIF
C	11.99668	6723.732	NA
LOG(X1)	0.441873	24782.33	<b>33.04084</b>
LOG(X2)	0.082023	4794.374	<b>44.14903</b>
LOG(X3)	0.555224	2607.482	<b>34.18106</b>
LOG(X4)	0.014180	681.9208	<b>35.15306</b>

每一个解释变量的方差扩大因子都远大于 10，解释变量之间存在比较严重的多重共线性。

## 处理多重共线性的问题——逐步回归

被解释变量对解释变量逐个做一元回归

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-7.627133	1.341714	-5.684618	0.0000
LOG(X1)	1.548392	0.134126	11.54433	0.0000
R-squared	0.898834	Mean dependent var		7.851729
Adjusted R-squared	0.892090	S.D. dependent var		0.614905
S.E. of regression	0.201994	Akaike info criterion		-0.251024
Sum squared resid	0.612025	Schwarz criterion		-0.152999
Log likelihood	4.133702	Hannan-Quinn criter.		-0.241280
F-statistic	133.2715	Durbin-Watson stat		0.498756
Prob(F-statistic)	0.000000			

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	2.524339	0.816518	3.091589	0.0074
LOG(X2)	0.524083	0.079954	6.554772	0.0000
R-squared	0.741223	Mean dependent var		7.851729
Adjusted R-squared	0.723972	S.D. dependent var		0.614905
S.E. of regression	0.323061	Akaike info criterion		0.688181
Sum squared resid	1.565529	Schwarz criterion		0.786206
Log likelihood	-3.849542	Hannan-Quinn criter.		0.697925
F-statistic	42.96503	Durbin-Watson stat		0.373093
Prob(F-statistic)	0.000009			

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	3.216611	0.598741	5.372295	0.0001
LOG(X3)	1.611849	0.206841	7.792691	0.0000
R-squared	0.801918	Mean dependent var		7.851729
Adjusted R-squared	0.788712	S.D. dependent var		0.614905
S.E. of regression	0.282648	Akaike info criterion		0.420899
Sum squared resid	1.198345	Schwarz criterion		0.518924
Log likelihood	-1.577644	Hannan-Quinn criter.		0.430643
F-statistic	60.72604	Durbin-Watson stat		0.687050
Prob(F-statistic)	0.000001			

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	5.839669	0.419118	13.93325	0.0000
LOG(X4)	0.223036	0.045246	4.929444	0.0002
R-squared	0.618315	Mean dependent var		7.851729
Adjusted R-squared	0.592869	S.D. dependent var		0.614905
S.E. of regression	0.392351	Akaike info criterion		1.076812
Sum squared resid	2.309091	Schwarz criterion		1.174837
Log likelihood	-7.152900	Hannan-Quinn criter.		1.086556
F-statistic	24.29941	Durbin-Watson stat		0.323789
Prob(F-statistic)	0.000182			

比较 4 个一元回归结果我们知道， $\log(y)$ 对  $\log(x_1)$ 做回归的这个模型的  $R^2$ 最高，把这个模型作为基础回归模型，再引入第二个回归变量。

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-10.82473	2.623287	-4.126401	0.0010
LOG(X1)	2.081981	0.401796	5.181685	0.0001
LOG(X2)	-0.210184	0.149758	-1.403488	0.1823
R-squared	0.911312	Mean dependent var		7.851729
Adjusted R-squared	0.898643	S.D. dependent var		0.614905
S.E. of regression	0.195765	Akaike info criterion		-0.265018
Sum squared resid	0.536536	Schwarz criterion		-0.117980
Log likelihood	5.252649	Hannan-Quinn criter.		-0.250402
F-statistic	71.92878	Durbin-Watson stat		0.599881
Prob(F-statistic)	0.000000			

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-6.637461	2.691627	-2.465966	0.0272
LOG(X1)	1.398239	0.376789	3.710936	0.0023
LOG(X3)	0.177826	0.415256	0.428232	0.6750
R-squared	0.900142	Mean dependent var		7.851729
Adjusted R-squared	0.885877	S.D. dependent var		0.614905
S.E. of regression	0.207728	Akaike info criterion		-0.146390
Sum squared resid	0.604112	Schwarz criterion		0.000647
Log likelihood	4.244319	Hannan-Quinn criter.		-0.131775

F-statistic	63.09972	Durbin-Watson stat	0.516050
Prob(F-statistic)	0.000000		

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-7.728517	2.188718	-3.531070	0.0033
LOG(X1)	1.560886	0.250476	6.231669	0.0000
LOG(X4)	-0.002607	0.043501	-0.059926	0.9531
R-squared	0.898860	Mean dependent var	7.851729	
Adjusted R-squared	0.884412	S.D. dependent var	0.614905	
S.E. of regression	0.209057	Akaike info criterion	-0.133633	
Sum squared resid	0.611868	Schwarz criterion	0.013404	
Log likelihood	4.135882	Hannan-Quinn criter.	-0.119017	
F-statistic	62.21112	Durbin-Watson stat	0.502835	
Prob(F-statistic)	0.000000			

引入  $\log(x_2)$  之后，修正的可决系数为 0.899，比原先只有一个解释变量时的可决系数 0.892 更高，说明修正的可决系数得到了改进，并且引入  $\log(x_2)$  之后并不影响  $\log(x_1)$  的显著性，因此考虑保留变量  $\log(x_2)$ ，引入  $\log(x_3)$  和  $\log(x_4)$  后修正的可决系数并没有得到改进，所以这两个变量不予考虑。接下来考虑引入第三个变量。

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-9.191300	2.686328	-3.421511	0.0046
LOG(X1)	1.870519	0.402950	4.642057	0.0005
LOG(X2)	-0.367928	0.172592	-2.131778	0.0527
LOG(X3)	0.724702	0.451011	1.606840	0.1321
R-squared	0.926008	Mean dependent var	7.851729	
Adjusted R-squared	0.908933	S.D. dependent var	0.614905	
S.E. of regression	0.185562	Akaike info criterion	-0.328533	
Sum squared resid	0.447631	Schwarz criterion	-0.132483	
Log likelihood	6.792533	Hannan-Quinn criter.	-0.309046	
F-statistic	54.23157	Durbin-Watson stat	0.858600	
Prob(F-statistic)	0.000000			

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-12.15128	2.321635	-5.233930	0.0002
LOG(X1)	2.573394	0.400345	6.427937	0.0000
LOG(X2)	-0.704177	0.240483	-2.928183	0.0118
LOG(X4)	0.159129	0.065412	2.432704	0.0302
R-squared	0.939056	Mean dependent var	7.851729	
Adjusted R-squared	0.924992	S.D. dependent var	0.614905	
S.E. of regression	0.168407	Akaike info criterion	-0.522538	
Sum squared resid	0.368694	Schwarz criterion	-0.326487	
Log likelihood	8.441570	Hannan-Quinn criter.	-0.503050	
F-statistic	66.77041	Durbin-Watson stat	0.732388	
Prob(F-statistic)	0.000000			

引入  $\log(x_4)$  后修正的可决系数得到了改进， $\log(x_1)$ ,  $\log(x_2)$  仍然是显著的，引入

$\log(x_3)$ 后虽然修正的可决系数得到了改进，但是改进的力度没有引入  $\log(x_4)$ 的大，并且  $\log(x_3)$ 后， $\log(x_2)$ 的显著程度并没有很明显的改进，所以经过对比分析后，我们引入了  $\log(x_4)$ 这个变量