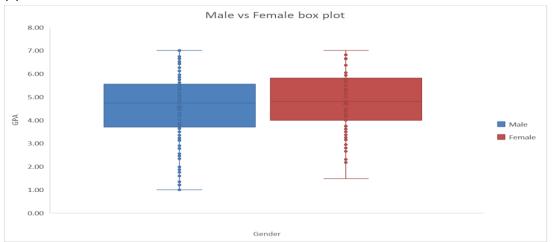
Research Report

ASSESSMENT ITEM 2
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Task 1 (Boxplot and t-tests)

1. (a)



Females GPA both has a higher central location than Male GPA and is skewed upwards towards higher GPA whereas males are skewed downwards. Females also have less of a spread compared to males.

(b)

Since the test is for any difference, the t-test will be two-tailed, to test if higher or lower average GPA.

H0: MAverage = FAverage , H1: MAverage =/= FAverage

Therefore, if $P(T \le t) > 0.05$, there is significant difference.

Variance is assumed equal as the standard deviations of males and females are similar.

t-Test: Two-Sample Assuming Equal Variances

	Male	Female
Mean	4.522965517	4.752025316
Variance	1.96737795	1.403093281
Observations	145	79
Pooled Variance	1.769115769	
Hypothesized Mean Difference	0	
df	222	
	-	
t Stat	1.231527989	
P(T<=t) one-tail	0.109714208	
t Critical one-tail	1.651746359	
P(T<=t) two-tail	0.219428416	
t Critical two-tail	1.970707395	

The P(T<=t) two-tail result is 0.219, which is greater than the significance level of 0.05 therefore there is not strong evidence to accept the base hypothesis that male and female students have no difference in average GPA.

2.

(a)

Since the test is for specifically higher GPA, the t-test will be one-tailed.

H0: PAverage = UAverage , H1: PAverage > UAverage

Postgraduate parents' students have a higher average sample GPA. Therefore, if P(T<=t) < 0.05, there is significant proof of achieving a higher GPA.

Variance is assumed equal as the standard deviations of postgraduates and undergraduates are similar.

t-Test: Two-Sample Assuming Equal Variances

	Undergrad	Postgrad
Mean	4.88647619	5.1040625
Variance	1.56784804	1.238366835
Observations	105	32
Pooled Variance	1.492189393	
Hypothesized Mean Difference	0	
df	135	
t Stat	-0.882122596	
P(T<=t) one-tail	0.189639238	
t Critical one-tail	1.656219133	
P(T<=t) two-tail	0.379278477	
t Critical two-tail	1.977692277	

P(T<=t) one-tail result is 0.189, which is greater than the significance level of 0.05, therefore there is not strong evidence to reject the hypothesis that postgraduate and undergraduate parents' students have no difference in average GPA, therefore there is strong evidence that postgraduate parents' students do not achieve a higher GPA.

Since the test is for specifically higher GPA, the t-test will be one-tailed.

H0: UAverage = SAverage , H1: UAverage > SAverage

Undergraduate parents' students have a higher average sample GPA. Therefore, if P(T<=t) < 0.05, there is significant proof of achieving a higher GPA.

Variance is assumed equal as the standard deviations of undergraduates and secondary or lower are similar.

t-Test: Two-Sample Assuming Equal Variances

	Secondary	Undergrad
Mean	4.078505747	4.88647619
Variance	1.785773323	1.56784804
Observations	87	105
Pooled Variance	1.666487905	
Hypothesized Mean Difference	0	
df	190	
t Stat	-4.317159085	
P(T<=t) one-tail	1.27085E-05	
t Critical one-tail	1.652912949	
P(T<=t) two-tail	2.54169E-05	
t Critical two-tail	1.972528182	

P(T<=t) one-tail result is 0.000012, which is less than the significance level of 0.05, therefore there is strong evidence to reject the hypothesis that undergraduate and secondary or lower parents' students have no difference in average GPA, therefore there is strong evidence that undergraduate parents' students achieve a higher GPA.

Task 2 (Regression Analysis)

3.

	GPA	HS_SCI	HS_ENG	HS_MATH	ATAR
GPA	1				
HS_SCI	0.344282	1			
HS_ENG	0.304046	0.579375	1		
HS_MATH	0.444387	0.575686	0.446887	1	
ATAR	0.423808	0.852447	0.763957	0.797436	1

All quantitative variables have a positive association towards GPA. Science and English have a moderate association towards GPA with 0.344 and 0.304, whereas Math and ATAR have a strong association with 0.444 and 0.423 respectively.

- 4. Based on the correlation matrix obtained in Question 3, would you say that:
 - (i) HS_SCI is a predictor of GPA?

Based on the correlation coefficient 0.344, HS_SCI is a moderate predictor of GPA.

When performing simple regression for HS_SCI onto GPA, the results are:

SUMMARY OUTPUT

Regression Statistics					
Multiple R	0.344281789				
R Square	0.11852995				
Adjusted R Square	0.114559365				
Standard Error	1.253026831				
Observations	224				

ANOVA

					Significance
	df	SS	MS	F	F
Regression	1	46.86992495	46.86992495	29.85200578	1.24741E-07
Residual	222	348.556925	1.570076239		
Total	223	395.42685			

		Standard			Lower	Upper	Lower	Upper
	Coefficients	Error	t Stat	P-value	95%	95%	95.0%	95.0%
		0.408032	5.935337	1.11773E	1.617699	3.225927	1.617699	3.225927
Intercept	2.42181339	996	13	-08	75	038	75	038
-		0.049367	5.463698	1.24741E	0.172441	0.367021	0.172441	0.367021
HS_SCI	0.26973167	962	91	-07	871	484	871	484

 $H_0: \beta_1 = 0 \ (no \ relationship)$ $H_0: \beta_1 \neq 0 \ (some \ relationship)$ $\alpha = 5\% \rightarrow Pvalue < \alpha \rightarrow reject \ H_0$ $\rightarrow Pvalue > \alpha \rightarrow accept \ H_0$ Since checking for $\beta_1 \neq 0$, Pvalue is two tailed $\therefore Pvalue = 1.2474E^{-7}$ $Pvalue < \alpha \therefore reject \ H_0$

Therefore, simple regression supports the claim that HS_SCI is a predictor of GPA.

(ii) HS_ENG is a predictor of GPA?

Based on the correlation coefficient 0.304, HS_ENG is a moderate predictor of GPA.

When performing simple regression for HS_ENG onto GPA, the results are:

SUMMARY OUTPUT

Regression Statistics					
Multiple R	0.304045999				
R Square	0.092443969				
Adjusted R Square	0.088355879				
Standard Error	1.271432515				
Observations	224				

ANOVA

					Significance
	df	SS	MS	F	F
Regression	1	36.55482764	36.55482764	22.61299636	3.56432E-06
Residual	222	358.8720224	1.616540641		
Total	223	395.42685			

	Coefficien	Standard	4 5404	Dyalua	Lower	Upper	Lower	Upper
	ts	Error	t Stat	P-value	95%	95%	95.0%	95.0%
	2.430524	0.464838	5.228749	3.9359	1.514463	3.346585	1.514463	3.346585
Intercept	499	543	931	3E-07	745	253	745	253
	0.268506	0.056464	4.755312	3.5643	0.157231	0.379781	0.157231	0.379781
HS ENG	626	56	436	2E-06	499	752	499	752

 $H_0: \beta_1 = 0 \ (no \ relationship)$ $H_0: \beta_1 \neq 0 \ (some \ relationship)$ $\alpha = 5\% \rightarrow Pvalue < \alpha \rightarrow reject \ H_0$ $\rightarrow Pvalue > \alpha \rightarrow accept \ H_0$ Since checking for $\beta_1 \neq 0$, Pvalue is two tailed $\therefore Pvalue = 3.5643E^{-6}$ $Pvalue < \alpha \therefore reject \ H_0$

Therefore, simple regression supports the claim that HS_ENG is a predictor of GPA.

(iii) HS_MATH is a predictor of GPA?

Based on the correlation coefficient 0.444, HS_MATH is a strong predictor of GPA.

When performing simple regression for HS_MATH onto GPA, the results are:

SUMMARY OUTPUT

Regression Statistics					
Multiple R	0.444387078				
R Square	0.197479875				
Adjusted R Square	0.193864919				
Standard Error	1.195596284				
Observations	224				

ANOVA

					Significance
	df	SS	MS	F	F
Regression	1	78.08884482	78.08884482	54.62857668	2.93473E-12
Residual	222	317.3380052	1.429450474		
Total	223	395.42685			

	Coefficie	Standard			Lower	Upper	Lower	Upper
	nts	Error	t Stat	P-value	95%	95%	95.0%	95.0%
	1.598844	0.414330	3.858865	0.000149	0.782321	2.415368	0.782321	2.415368
Intercept	823	306	261	345	026	621	026	621
HS_MAT	0.361104	0.048856	7.391114	2.93473E	0.264822	0.457386	0.264822	0.457386
<u>H</u>	485	566	712	-12	489	481	489	481

 $H_0: \beta_1 = 0 \ (no \ relationship)$ $H_0: \beta_1 \neq 0 \ (some \ relationship)$ $\alpha = 5\% \rightarrow Pvalue < \alpha \rightarrow reject \ H_0$ $\rightarrow Pvalue > \alpha \rightarrow accept \ H_0$ Since checking for $\beta_1 \neq 0$, Pvalue is two tailed $\therefore Pvalue = 2.9347E^{-12}$ $Pvalue < \alpha \therefore reject \ H_0$

Therefore, simple regression supports the claim that HS_MATH is a predictor of GPA.

(iv) ATAR is a predictor of GPA?

Based on the correlation coefficient 0.4238, ATAR is a strong predictor of GPA.

When performing simple regression for ATAR onto GPA, the results are:

SUMMARY OUTPUT

Regression Statistics							
Multiple R	0.423807694						
R Square	0.179612961						
Adjusted R Square	0.175917524						
Standard Error	1.208832104						
Observations	224						

ANOVA

					Significance
	df	SS	MS	F	F
Regression	1	71.02378743	71.02378743	48.6039826	3.53788E-11
Residual	222	324.4030626	1.461275057		
Total	223	395.42685			

	Coefficie nts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	Upper 95.0%
					-		-	
	1.007992	0.522053	1.930820	0.05477	0.020823	2.036807	0.020823	2.036807
Intercept	343	917	382	886	171	857	171	857
•	0.045888	0.006582	6.971655	3.53788	0.032917	0.058860	0.032917	0.058860
ATAR	818	198	657	E-11	232	405	232	405

 $H_0: \beta_1 = 0 \ (no \ relationship)$ $H_0: \beta_1 \neq 0 \ (some \ relationship)$ $\alpha = 5\% \rightarrow Pvalue < \alpha \rightarrow reject \ H_0$ $\rightarrow Pvalue > \alpha \rightarrow accept \ H_0$ Since checking for $\beta_1 \neq 0$, $Pvalue \ is two \ tailed$ $\therefore Pvalue = 3.53788E^{-11}$ $Pvalue < \alpha \therefore reject \ H_0$

Therefore, simple regression supports the claim that ATAR is a predictor of GPA.

Step 1: HS_SCI only

SUMMARY OUTPUT

Regression Statistics							
Multiple R	0.344281789						
R Square	0.11852995						
Adjusted R Square	0.114559365						
Standard Error	1.253026831						
Observations	224						

ANOVA

					Significance
	df	SS	MS	F	F
Regression	1	46.86992495	46.86992495	29.85200578	1.24741E-07
Residual	222	348.556925	1.570076239		
Total	223	395.42685			

	Coefficien ts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	<i>Upper</i> 95.0%
	2.421813	0.408032	5.93533	1.1177	1.617699	3.225927	1.617699	3.225927
Intercept	394	996	713	3E-08	75	038	75	038
	0.269731	0.049367	5.46369	1.2474	0.172441	0.367021	0.172441	0.367021
HS_SCI	678	962	891	1E-07	871	484	871	484

Step 2: HS_SCI and HS_ENG

SUMMARY OUTPUT

Regression Statistics							
Multiple R	0.367413355						
R Square	0.134992574						
Adjusted R Square	0.127164452						
Standard Error	1.244075847						
Observations	224						

					Significance
	df	SS	MS	F	F
Regression	2	53.37968815	26.68984408	17.244568	1.09823E-07
Residual	221	342.0471618	1.547724714		
Total	223	395.42685			

	Coefficie nts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	<i>Upper</i> 95.0%
	1.874651	0.485078	3.864635	0.000146	0.918680	2.830622	0.918680	2.830622
Intercept	543	473	619	249	101	984	101	984
•	0.198276	0.060136	3.297075	0.001138	0.079760	0.316791	0.079760	0.316791
HS_SCI	036	944	388	29	778	295	778	295
	0.139019	0.067785	2.050858	0.041460	0.005429	0.272608	0.005429	0.272608
HS_ENG	237	868	687	405	812	662	812	662

Step 3: HS_SCI, HS_ENG and HS_MATH

SUMMARY OUTPUT

Regression Statistics							
Multiple R	0.464008313						
R Square	0.215303715						
Adjusted R Square	0.204603311						
Standard Error	1.187606417						
Observations	224						

					Significance
	df	SS	MS	F	F
Regression	3	85.13686975	28.37895658	20.12108301	1.46316E-11
Residual	220	310.2899802	1.410409001		
Total	223	395.42685			

	Coefficie nts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	<i>Upper</i> 95.0%
Intercept	0.988217	0.499322	1.979118	0.049049	0.004150	1.972284	0.004150	1.972284
	781	12	771	736	954	608	954	608
HS_SCI	0.066884	0.063736	1.049394	0.295147	-0.058	0.192496	-0.058	0.192496
	563	315	886	826	727323	45	727323	45
HS_ENG	0.086024	0.065665	1.310034	0.191550	-0.043	0.215438	-0.043	0.215438
	345	727	16	49	390036	727	390036	727
HS_MATH	0.285795	0.060229	4.745133	3.7495E-	0.167095	0.404495	0.167095	0.404495
	199	116	559	06	32	077	32	077

Step 4: HS_SCI, HS_ENG, HS_MATH and PARENT EDUC

SUMMARY OUTPUT

Regression Statistics						
Multiple R	0.483235669					
R Square	0.233516712					
Adjusted R Square	0.21593682					
Standard Error	1.179115031					
Observations	224					

					Significance
	df	SS	MS	F	F
Regression	5	92.33877792	18.46775558	13.28317109	2.64537E-11
Residual	218	303.0880721	1.390312257		
Total	223	395.42685			

	Coefficie nts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	Upper 95.0%
Intercept	1.645405	0.582608	2.824204	0.005179	0.497139	2.793671	0.497139	2.793671
	529	41	903	169	35	709	35	709
HS_SCI	0.073707	0.063370	1.163128	0.246048	-0.051	0.198603	-0.051	0.198603
	482	002	927	774	188809	774	188809	774
HS_ENG	0.053236	0.066787	0.797093	0.426264	-0.078	0.184869	-0.078	0.184869
	241	964	334	11	396532	014	396532	014
HS_MATH	0.246371	0.062366	3.950386	0.000105	0.123453	0.369289	0.123453	0.369289
	369	4	288	37	083	656	083	656
PARENT EDUC (1=P)	0.152716 051	0.239075 283	0.638778 081	0.523637 856	-0.318 478764	0.623910 865	-0.318 478764	0.623910 865
PARENT EDUC (1=S)	-0.362 405148	0.187469 737	-1.933 139472	0.054514 243	-0.731 890302	0.007080 006	-0.731 890302	0.007080 006

Step 5: HS_SCI, HS_ENG and HS_MATH, PARENT EDUC AND GENDER

SUMMARY OUTPUT

Regression Statistics						
Multiple R	0.48457333					
R Square	0.234811312					
Adjusted R Square	0.213654021					
Standard Error	1.18083028					
Observations	224					

					Significance
	df	SS	MS	F	F
Regression	6	92.85069735	15.47511623	11.0983638	8.66761E-11
Residual	217	302.5761526	1.39436015		
Total	223	395.42685			

	Coefficie nts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	<i>Upper</i> 95.0%
Intercept	1.785415	0.627546	2.845072	0.004865	0.548548	3.022281	0.548548	3.022281
	287	42	857	164	716	857	716	857
HS_SCI	0.083460	0.065471	1.274759	0.203757	-0.045	0.212502	-0.045	0.212502
	714	756	06	801	581256	684	581256	684
HS_ENG	0.036872	0.072131	0.511177	0.609746	-0.105	0.179040	-0.105	0.179040
	164	848	301	615	296558	885	296558	885
HS_MATH	0.244315	0.062549	3.905971	0.000125	0.121033	0.367597	0.121033	0.367597
	461	221	284	351	68	243	68	243
PARENT EDUC (1=P)	0.162986 456	0.240022 316	0.679047 095	0.497831 628	-0.310 087039	0.636059 952	-0.310 087039	0.636059 952
PARENT EDUC (1=S)	-0.363 53318	0.187751 678	-1.936 244641	0.054136 555	-0.733 583531	0.006517 172	-0.733 583531	0.006517 172
GENDER	-0.108	0.179440	-0.605	0.545202	-0.462	0.244943	-0.462	0.244943
(1=M)	726003	344	917265	949	39508	075	39508	075

Step 6: HS_SCI, HS_ENG and HS_MATH, PARENT EDUC, GENDER and ATAR

SUMMARY OUTPUT

Regression Statistics						
Multiple R	0.4846456					
R Square	0.234881358					
Adjusted R Square	0.210085846					
Standard Error	1.183506354					
Observations	224					

					Significance
	df	SS	MS	F	F
Regression	7	92.87839541	13.2683422	9.472736919	3.03317E-10
Residual	216	302.5484546	1.40068729		
Total	223	395.42685			

	Coefficie nts	Standard Error	t Stat	P-value	Lower 95%	Upper 95%	Lower 95.0%	<i>Upper</i> 95.0%
Intercept	1.805044	0.644271	2.801682	0.005545	0.535180	3.074908	0.535180	3.074908
	186	494	525	411	258	115	258	115
HS_SCI	0.094815	0.104045	0.911281	0.363162	-0.110	0.299890	-0.110	0.299890
	062	807	908	722	260002	125	260002	125
HS_ENG	0.047577	0.104988	0.453173	0.650879	-0.159	0.254510	-0.159	0.254510
	887	341	048	037	354919	692	354919	692
HS_MATH	0.255711	0.102456	2.495812	0.013314	0.053769	0.457652	0.053769	0.457652
	15	076	457	863	459	84	459	84
PARENT EDUC (1=P)	0.160789 746	0.241072 929	0.666975 536	0.505499 616	-0.314 366798	0.635946 29	-0.314 366798	0.635946 29
PARENT EDUC (1=S)	-0.363 417157	0.188178 981	-1.931 231397	0.054763 147	-0.734 319335	0.007485 021	-0.734 319335	0.007485 021
GENDER	-0.106	0.180330	-0.592	0.554042	-0.462	0.248561	-0.462	0.248561
(1=M)	870835	221	639627	273	303047	377	303047	377
ATAR	-0.003	0.026671	-0.140	0.888299	-0.056	0.048818	-0.056	0.048818
	750572	252	622271	403	319808	664	319808	664

HS_SCI:

High school Science score has a regression coefficient of 0.083460714, which means that each increase in score from 1 to 10 will increase the expected GPA by about 0.08. Overall this means that by achieving the maximum of 10, you would increase your expected GPA by 0.72 compared to someone who achieved the absolute minimum science score of 1. The p-value of HS_SCI is 0.203757801, yet since we are only interested in if HS_SCI is increasing the expected GPA, the t-test would only be 1 tailed and therefore the p-value must be halved. This gives a new p-value of about 0.1019, which is almost double that of the usual significance level cut-off of 0.05. Overall, both the p-value and regression coefficient haev shown that HS_SCI has only a very small impact on the expected GPA and is therefore not statistically significant.

HS_ENG:

High school English score has a regression coefficient of 0.036872164, which means that each increase in score from 1 to 10 will increase the expected GPA by about 0.037. Overall this means that by achieving the maximum of 10, you would increase your expected GPA by 0.333 compared to someone who achieved the absolute minimum science score of 1. The p-value of HS_ENG is 0.609746615, yet since we are only interested in if HS_ENG is increasing the expected GPA, the t-test would only be 1 tailed and therefore the p-value must be halved. This gives a new p-value of about 0.30487, which is over 6 times that of the usual 0.05. Overall, based on both the p-value and regression coefficient, HS_ENG has much less impact on the expected GPA than HS_SCI did and therefore is also not statistically significant.

HS MATH:

High school Maths score has a regression coefficient of 0.244315461, which means that each increase in score from 1 to 10 will increase the expected GPA by about 0.244. Overall this means that by achieving the maximum of 10, you would increase your expected GPA by 2.196 compared to someone who achieved the absolute minimum science score of 1. The p-value of HS_MATH is 0.000125351, yet since we are only interested in if HS_MATH is increasing the expected GPA, the t-test would only be 1 tailed and therefore the p-value must be halved. This gives a new p-value of about 0.00006, which is considerably less than the usual significance level cut-off of 0.05. Overall, both the p-value and regression coefficient have shown HS_MATH to have a large impact on the expected GPA and therefore is statistically significant.

PARENT EDUC:

to undergraduate ones.

Since Undergraduate education was used as the reference category for Parent Education level, both Postgraduate education and Secondary education have coefficients and p-values that are comparing the difference between those education levels and the Undergraduate education level. Postgraduate education level has a regression coefficient of 0.162986456, meaning that a student with a parents' education level of postgraduate would have an expected GPA increase of about 0.16 compared to a student with a parents' education level of only undergraduate. Conversely, a student with a parents' education level of Secondary education or lower has a regression coefficient of -0.36353318, meaning that student would have an expected GPA decrease of about 0.36 compared

Postgraduate has a p-value of 0.497831628 and Secondary or lower has a p-value of 0.054136555, however we are only interested in an increase of GPA and therefore the t-test would be 1 tailed and therefore the p-values must be halved. This gives new p-values of about 0.2489 for P and 0.027 for S. Using the same significance level cut-off, the difference between P and U has a no statistical significance, whereas the difference between S and U has a p-value less than the cut-off and therefore is shown to have statistical significance. Overall, since Secondary > Undergraduate > Postgraduate is a constant increase in education, the PARENT EDUC variable has shown that there is significant increase in expected GPA from those with a parental education higher than Secondary school, compared to those of Secondary or lower education.

GENDER:

Gender has a regression coefficient of -0.108726003 when males were set as 1 and females were set as 0, meaning that males have an expected GPA of about 0.109 less than that of females. Gender has a p-value of 0.545202949, however we are only interested in an increase of GPA based on gender and therefore the t-test would be 1 tailed and therefore the p-values must be halved. This gives new p-values of about 0.2726 which is much larger than the cut-off of 0.05 and therefore the gender variable is shown to not be of statistical significance.

ATAR having a negative coefficient at first seems surprising, however it can also be observed that the three grades' coefficients have increased in turn, meaning that these two will largely counteract each other. This is because, by the way ATAR is calculated, an increase in ATAR would come with an increase of all classes that the student is taking, meaning both an increase and decrease of expected GPA at the same time. After the inclusion of ATAR, the model fit, or R², goes from 0.234811312 in step 5 to 0.234881358. This is an increase of model fit by 0.00007004 which is an improvement upon step 5's fit by a measly 0.0298%, which can safely be described as no real improvement of overall model fit. Overall, this just shows that the inclusion of ATAR is just used as an extremely small adjustment that would only occur if a student does better on their subjects that are counted towards ATAR that are not Science, English or Maths.

Task 3 (Summary Report)

Based on the data analysis, there is an observable correlation between a student's GPA and their high school grades, most prominently that of their high school maths score, which during stepwise regression at step 3, improved the model fit from 13% to 21%. The students Science score is the second most important out of the three grades and was the first variable to be used during the stepwise regression. However, as English and Maths were added, the Science coefficient and p-value drop drastically, dropping out of significance range once Maths was added in. This shows that, while Science scores seemed to predict GPA somewhat on its own, it is not a good predictor overall once compared to Maths scores.

There has also been shown to be statistical significance in a students' social economic status affecting their academic achievement through the observation of a students' parent's level of education being above secondary education level having a significant impact on the student's GPA.

Gender and ATAR, however, proved to have an insignificant impact on a student's GPA during stepwise regression and shows that neither should be included in the regression model as both causes almost no increase to model fit yet including 2 extra variables would increase model complexity considerably. Despite this, ATAR itself is still a good predictor for GPA as is shown in the correlation matrix, it is just that most of its prediction functionality has already been taken by HS_SCI, HS_ENG and HS_MATH.

Overall, the best regression model came at step 4, before adding in the insignificant variables of gender and ATAR. This is the point where all the significant variables, namely HS_MATH and parental secondary education, has been added and further variables do not aid the model fit. Although, there is room for other factors which could influence academic performance, such as country of citizenship, class attendance and employment status which could all have a significant impact on a student's GPA.