



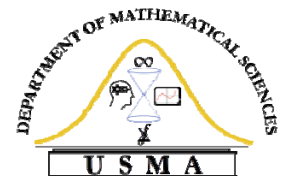
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**WEST POINT**

## **Success Indicators in the USMA Advanced Core Mathematics Program**

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**Conference on Applied Statistics in Defense**

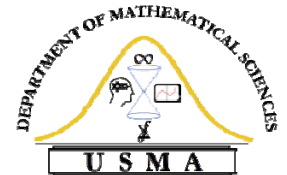




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## *Problem Background*

- Core Math Program
  - MA103, MA104, MA205, MA206
- Advanced Math Program
  - MA153, MA255, MA206
  - **Special selection process required for the Advanced Math track**

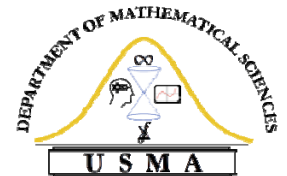




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## *Research Goal*

- Reduce the amount of summer testing
  - Instructors don't have to grade as much
  - Kill fewer trees
  - Students don't have to take as many tests during Cadet Basic Training
- Predict the success of cadets in the advanced mathematics program

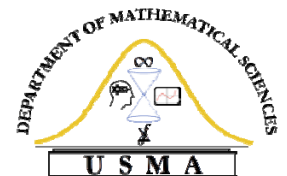




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# WEST POINT *Data Collected on Cadets*

- Class Rank
  - SAT Math Score
  - ACT Math Score
  - CEER Score (combination of SAT/ACT Scores and class rank)
  - AP Calculus AB/BC scores
  - Scores in both MA153 and MA255 (for regression training)
- All data used to determine if a cadet is going to be successful in the advanced math track must be collected before the cadet takes any math classes at USMA

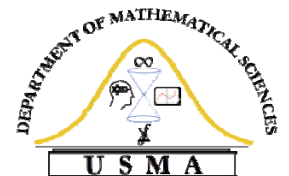




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# WEST POINT *Problems with the data*

- Not all cadets take both the ACT or SAT tests
- Many cadets do not take the AB/BC test
- High school rank is a wishy-washy number at best
- Lots and lots of missing data

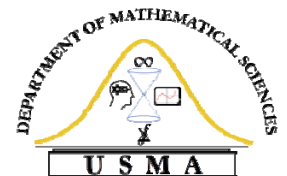




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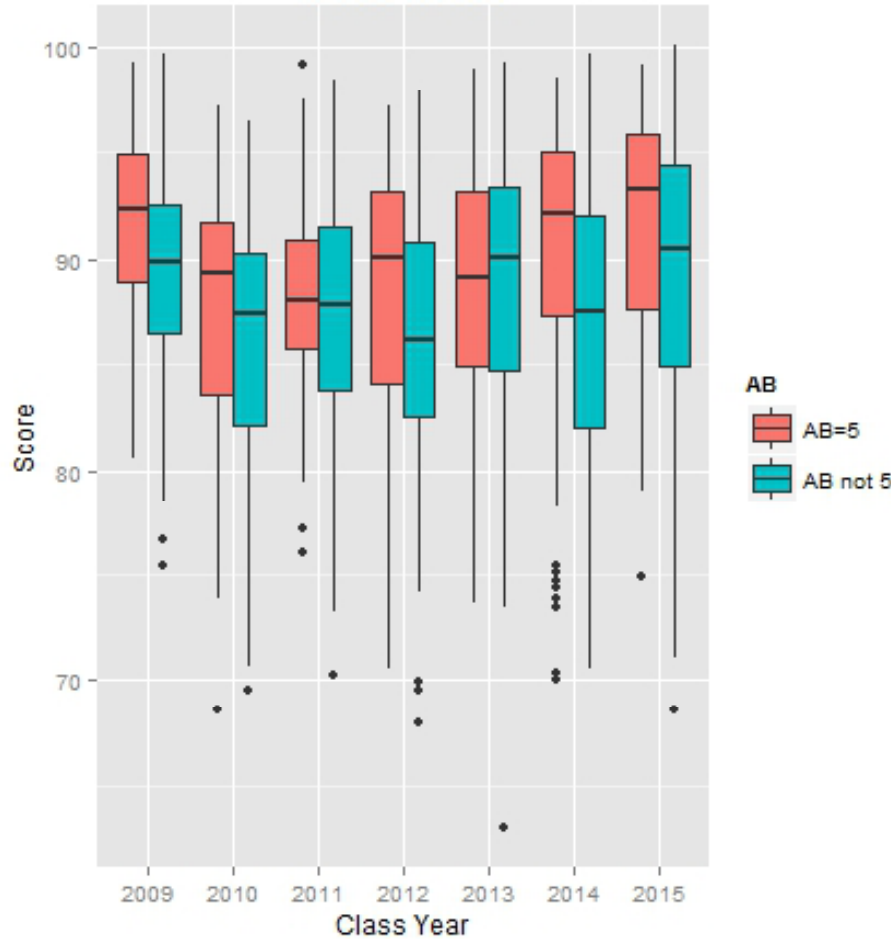
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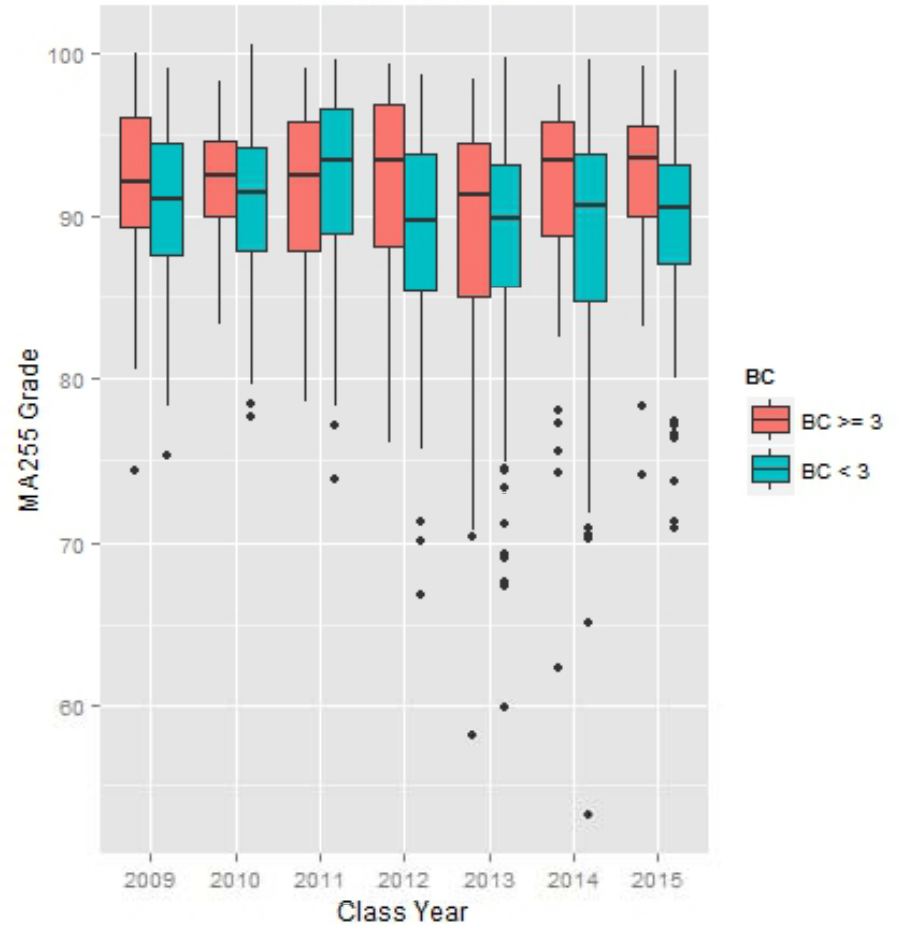




MA153 Grades



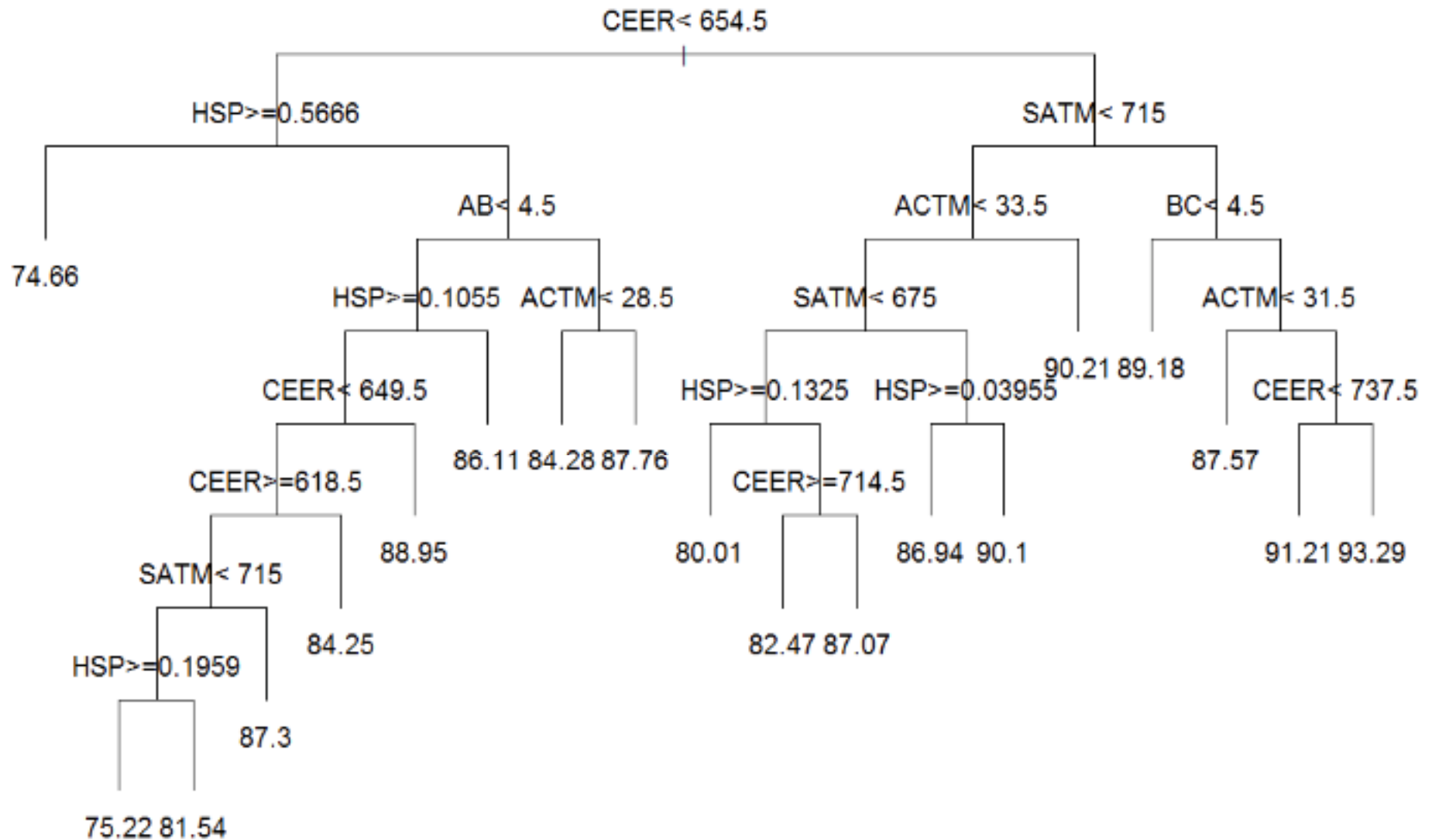
MA255 Grades





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# WEST POINT. *Decision Trees for MA153*







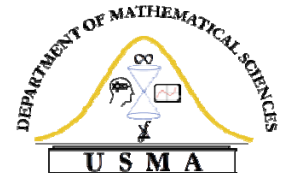
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# WEST POINT *Resulting Confusion Matrix*

Had to decide on a threshold for “failure.” First guess: scoring below 80% in the class

<b>Predicted \ True</b>	<b>Under 80%</b>	<b>Over 80%</b>
<b>Under 80%</b>	9	8
<b>Over 80%</b>	146	1226

88.9% correct prediction rate





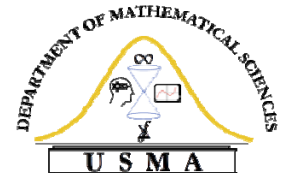
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# WEST POINT *Prediction with new data*

We perfectly predicted everyone that would score over an 80%!

<b>Predicted \ True</b>	<b>Under 80%</b>	<b>Over 80%</b>
<b>Under 80%</b>	2	6
<b>Over 80%</b>	35	261

86.5% correct prediction rate





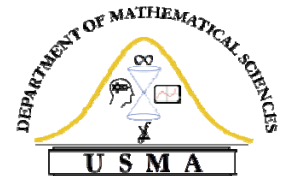
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# WEST POINT *A little about the prediction*

Correct prediction of success on new data: 86.5%

However, if we were just to say that everyone that everyone was in the program was going to pass, we would be correct 87% of the time, a better prediction rate than our model.

Why is this prediction so terrible?

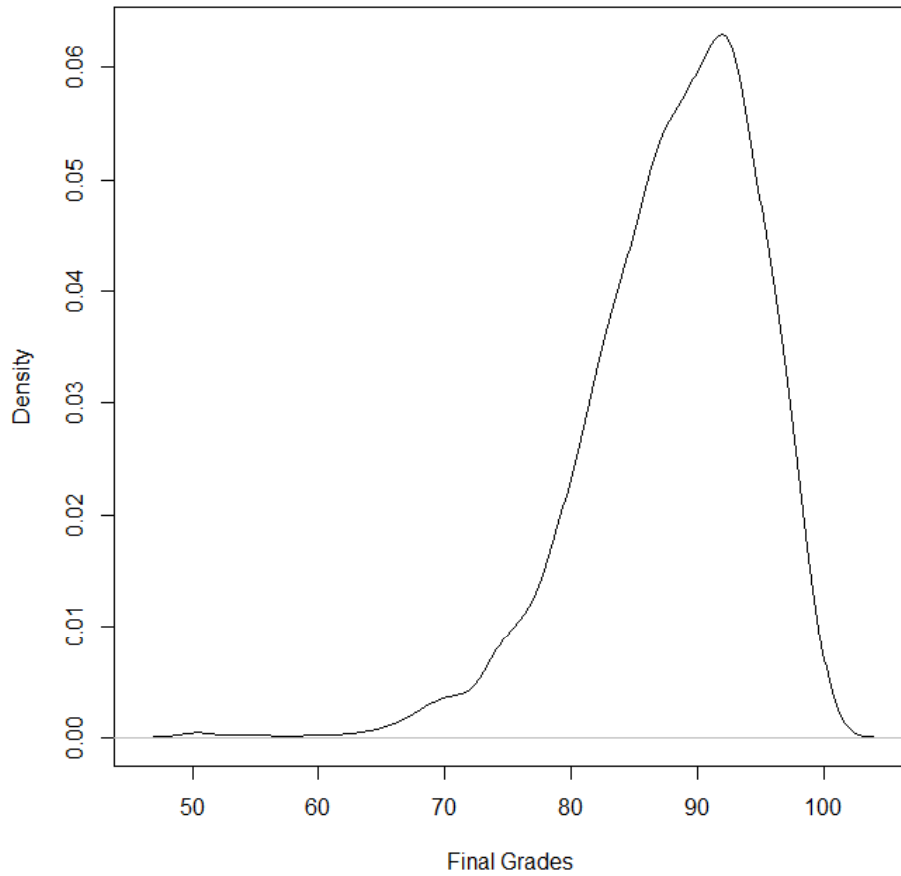




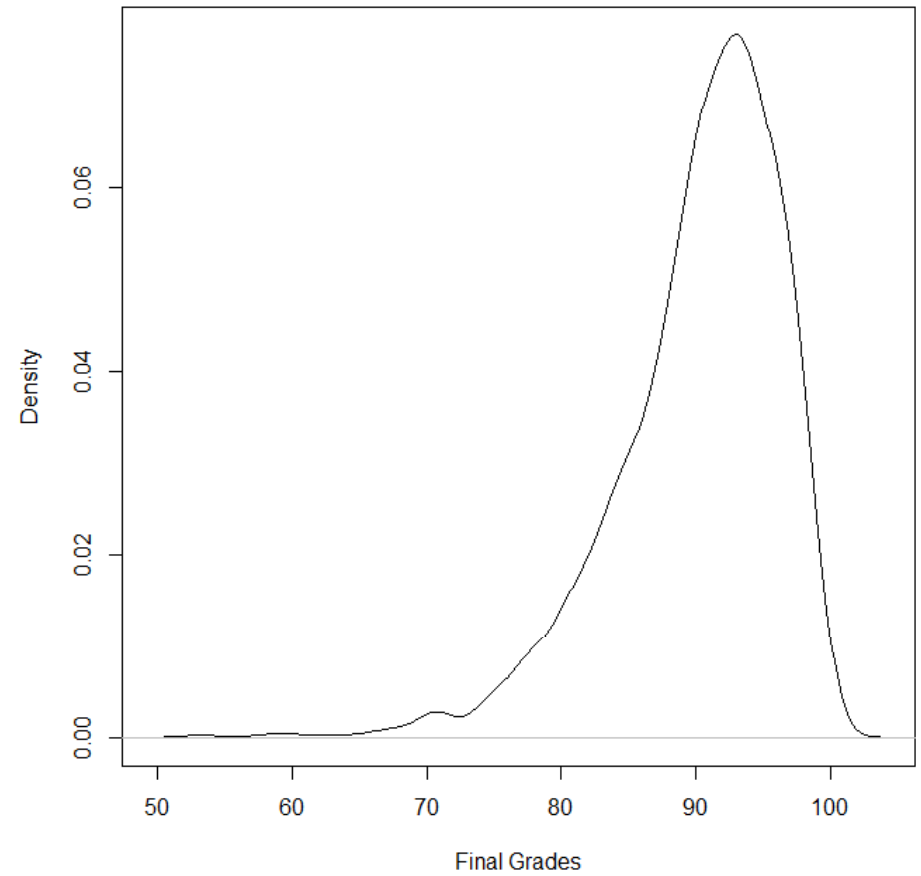
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# WEST POINT *Density Plots of Grades*

Density Plot of MA153



Density Plot of MA255





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# WEST POINT *Changing the Threshold*

## Using the mean score: 88%

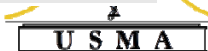
Off of the training set: 67% correct

<b>True \ Predicted</b>	<b>Under 80%</b>	<b>Over 80%</b>
<b>Under 80%</b>	462	303
<b>Over 80%</b>	155	469

Off of the test set: 59.5% correct

<b>True \ Predicted</b>	<b>Under 80%</b>	<b>Over 80%</b>
<b>Under 80%</b>	84	82
<b>Over 80%</b>	41	97

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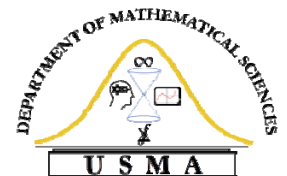




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## *Problems*

Using 88% as the threshold seems to yield better results, but there are problems associated with both false positives and false negatives.





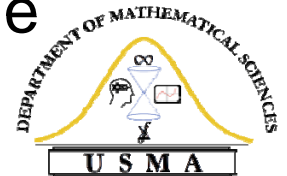
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## *Recommendations*

The following cadets should, without need for retesting, be immediately offered a seat in the Advanced Core Mathematics

Program:

1. Those cadets with an AP score of 4 or 5 on the AB Calculus exam.
2. Those cadets with an AP score of 3, 4 or 5 on the BC Calculus exam.
3. Those cadets with a CEER score greater than 654.5, assuming they have taken at least a single variable calculus course.
4. Those cadets with a SAT-Math score greater than 715, assuming they have taken at least a single variable calculus course.





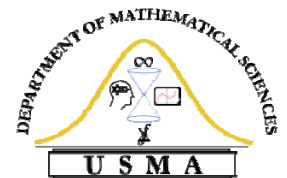
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## *Conclusion*

The Advanced Core Mathematics Program leadership went with the following steps from the recommendations of this study:

- Those cadets with an AP score of 5 on the AB Calculus exam or an AP score of 5 on the BC Calculus exam were given the choice of enrolling in the Advanced Core Mathematics Program

The model is not currently being used for predictions, but could be used as a tool to inform leadership about potential of a student.





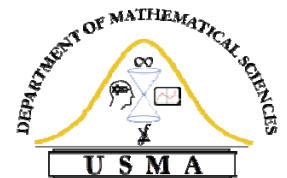


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## *Future Work*

Impute the missing data to fit a different type of regression for predictive reasons.

Use Bayesian methods for something somehow.

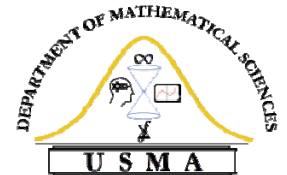




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## *AB Scores*

<b>Score</b>	<b>Total # of Cadets</b>	<b># with MA153 Final Grade &lt;80</b>	<b>% with MA153 Final Grade &lt;80</b>	<b># With MA255 Final Grade &lt;80</b>	<b>% with MA255 Final Grade &lt;80</b>
5	436	40	9.2	27	6.3
4	265	41	15.5	21	8.2
3	75	15	20.0	7	9.6
2	11	2	18.2	2	18.2
1	3	1	33.3	0	0.0





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## *BC Scores*

<b>Score</b>	<b>Total # of Cadets</b>	<b># with MA153 Final Grade &lt;80</b>	<b>% with MA153 Final Grade &lt;80</b>	<b># With MA255 Final Grade &lt;80</b>	<b>% with MA255 Final Grade &lt;80</b>
5	208	5	2.4	4	2.0
4	79	7	8.9	8	10.0
3	66	9	13.6	4	6.3
2	5	1	20.0	0	0.0
1	6	1	16.7	0	0.0

