## **AP Calculus Final Project**

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#### **Abstract**

This is an analysis of data taken from the GOSH Flight Path Predictor<sup>TM</sup>. Four separate sets of data were analyzed: temperature vs. density, wind velocity vs. pressure, wind angle vs. wind velocity, and wind velocity vs. altitude. Each is discussed in more depth in subsequent parts.

### Part I. Wind Velocity Vs. Altitude

This data has several interesting patterns. Initially, the data points are closely clustered around the same windspeed (about  $5\frac{\rm m}{\rm s}$ ). These are the ground conditions in the Rapid City area. As altitude increases, however, the windspeed dips significantly before rising again - forming what appears to be a cusp (though it could possibly be a relative minimum). This can be seen in Table 1: Where x=2641.95, the first derivative is negative, but at the next value recorded, x=2861.54, the first derivative has become positive.

The next notable feature of the data is a sharp change in the rate at which the wind speed is increasing. This occurs when the altitude is approximately 5000m. After this point, the wind picks up speed at a much slower rate than before. This is the overall shape of the graph as demonstrated by Figure 1.

After these initial features the most prominent pattern in the data is what appears to be an absolute maximum slightly after 10000m, before 15000m meters. At this point the wind speed is nearly  $40\frac{\rm m}{\rm s}$ . Wind speed increases as it approaches this maximum, though it increases at a slower and slower rate. After the maximum, the wind speed begins to decrease at an increasing rate. After this the wind speed appears to decay exponentially.

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Tab. 1: Raw Data From Predictions of Wind Speed Vs. Height

| altitude (m) | wind speed (m/s) | first derivative | second    | f is | concave |
|--------------|------------------|------------------|-----------|------|---------|
| 947.84       | 5.90581712       |                  |           |      |         |
| 985.55       | 6.1990502        | 0.007776003      |           | +    |         |
| 1023.37      | 6.39453892       | 0.005168924      | -6.89E-05 | +    | DOWN    |
| 1061.3       | 6.49228328       | 0.002576967      | -6.83E-05 | +    | DOWN    |
| 1101.25      | 6.49228328       | 0                | -6.45E-05 | -    | DOWN    |
| 1141.34      | 6.49228328       | 0                | 0         | -    | DOWN    |
| 1182.52      | 6.59002764       | 0.002373588      | 5.76E-05  | +    | UP      |
| 1224.81      | 6.59002764       | 0                | -5.61E-05 | -    | DOWN    |
| 1268.21      | 6.59002764       | 0                | 0         | -    | DOWN    |
| 1313.71      | 6.59002764       | 0                | 0         | -    | DOWN    |
| 1361.33      | 6.59002764       | 0                | 0         | -    | DOWN    |
| 1411.1       | 6.59002764       | 0                | 0         | -    | DOWN    |
| 1463.04      | 6.49228328       | -0.001881871     | -3.62E-05 | -    | DOWN    |
| 1518.18      | 6.49228328       | 0                | 3.41E-05  | -    | UP      |
| 1575.56      | 6.47684996       | -0.000268967     | -4.69E-06 | -    | DOWN    |
| 1639.2       | 6.47684996       | 0                | 4.23E-06  | -    | UP      |
| 1710.22      | 6.3791056        | -0.001376293     | -1.94E-05 | -    | DOWN    |
| 1792.78      | 6.3791056        | 0                | 1.67E-05  | -    | UP      |
| 1889.17      | 6.26592792       | -0.001174164     | -1.22E-05 | -    | DOWN    |
| 2000.74      | 6.26592792       | 0                | 1.05E-05  | -    | UP      |
| 2130.05      | 6.15275024       | -0.000875243     | -6.77E-06 | -    | DOWN    |
| 2277.72      | 5.41709532       | -0.004981749     | -2.78E-05 | -    | DOWN    |
| 2447.89      | 3.54451916       | -0.01100415      | -3.54E-05 | -    | DOWN    |
| 2641.95      | 2.81400868       | -0.003764354     | 3.73E-05  | -    | UP      |
| 2861.54      | 5.82350608       | 0.013705075      | 7.96E-05  | +    | UP      |
| 3107.44      | 9.14681432       | 0.013514877      | -7.73E-07 | +    | DOWN    |
| 3381.51      | 15.16066468      | 0.021942753      | 3.08E-05  | +    | UP      |
| 3681.25      | 18.38622856      | 0.010761206      | -3.73E-05 | +    | DOWN    |
| 4002.43      | 18.86980592      | 0.001505627      | -2.88E-05 | +    | DOWN    |

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Tab. 2: Table 1 Continued

| altitude (m) | wind speed (m/s) | first derivative | second    | f is | concave |
|--------------|------------------|------------------|-----------|------|---------|
| 4344.09      | 18.91610588      | 0.000135515      | -4.01E-06 | +    | DOWN    |
| 4706.73      | 19.2144834       | 0.000822793      | 1.90E-06  | +    | UP      |
| 5089.27      | 20.63434884      | 0.003711678      | 7.55E-06  | +    | UP      |
| 5491.59      | 22.02849208      | 0.00346526       | -6.12E-07 | +    | DOWN    |
| 5913.8       | 21.9153144       | -0.00026806      | -8.84E-06 | -    | DOWN    |
| 6358.13      | 23.72615728      | 0.004075446      | 9.78E-06  | +    | UP      |
| 6822.71      | 26.43213272      | 0.005824563      | 3.76E-06  | +    | UP      |
| 7313.41      | 24.72932308      | -0.003470164     | -1.89E-05 | -    | DOWN    |
| 7830.24      | 26.751088        | 0.003911857      | 1.43E-05  | +    | UP      |
| 8382.36      | 29.10209708      | 0.004258149      | 6.27E-07  | +    | UP      |
| 8972.84      | 33.18678244      | 0.006917568      | 4.50E-06  | +    | UP      |
| 9591.32      | 36.33003528      | 0.005082222      | -2.97E-06 | +    | DOWN    |
| 10215.39     | 37.811634        | 0.002374091      | -4.34E-06 | +    | DOWN    |
| 10824.28     | 39.2006328       | 0.002281198      | -1.53E-07 | +    | DOWN    |
| 11416.76     | 39.18519948      | -2.60E-05        | -3.89E-06 | -    | DOWN    |
| 11995.67     | 36.77760156      | -0.004158847     | -7.14E-06 | -    | DOWN    |
| 12565.71     | 30.64028464      | -0.010766467     | -1.16E-05 | -    | DOWN    |
| 13130.59     | 28.41788656      | -0.003934284     | 1.21E-05  | -    | UP      |
| 13704.45     | 27.4970318       | -0.001604668     | 4.06E-06  | -    | UP      |
| 14307.19     | 22.40918064      | -0.008441204     | -1.13E-05 | -    | DOWN    |
| 14949.59     | 16.31301924      | -0.009489666     | -1.63E-06 | -    | DOWN    |
| 15626.44     | 21.2722594       | 0.007326941      | 2.48E-05  | +    | UP      |
| 16364.28     | 22.4040362       | 0.001533905      | -7.85E-06 | +    | DOWN    |
| 17178.71     | 9.42461408       | -0.015936817     | -2.15E-05 | -    | DOWN    |
| 18095.86     | 5.80292832       | -0.003948848     | 1.31E-05  | -    | UP      |
| 19133.84     | 5.57142852       | -0.000223029     | 3.59E-06  | -    | UP      |
| 20359.21     | 2.829442         | -0.00223768      | -1.64E-06 | -    | DOWN    |
| 21888.32     | 2.55164224       | -0.000181674     | 1.34E-06  | -    | UP      |
| 23904.7      | 0.20063316       | -0.001165955     | -4.88E-07 | -    | DOWN    |
| 26910.97     | 0.31381084       | 3.76E-05         | 4.00E-07  | +    | UP      |
| 33038.6      | 8.58607036       | 0.001349993      | 2.14E-07  | +    | UP      |
| AVG:         | 14.57059741      | 0.000699214      | -3.47E-06 | +    | DOWN    |

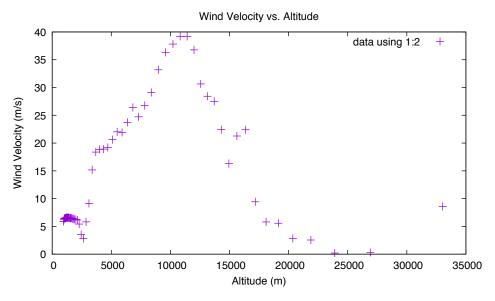


Fig. 1: Test

# Part II. Temperature Vs. Density

# Part III. Wind Velocity vs. Pressure

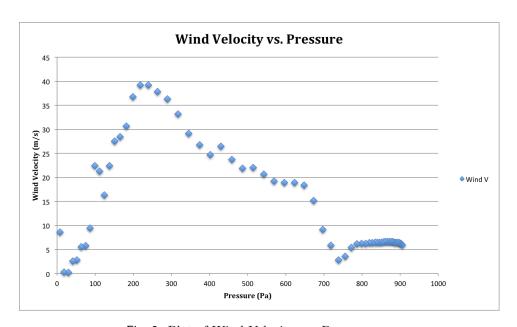


Fig. 2: Plot of Wind Velocity vs. Pressure

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Analysis: After plotting all the points in a scatterplot, we notice our predicted concavities are well matched. From the first derivative, we can split the data points into two distinct sections. Pressures  $\in$  [0,230) experience mostly increasing wind velocity, and Pressures  $\in$  (230,725] experience primarily decreasing wind velocity. Following a pressure of 800 Pascals, wind velocity stabilizes at  $6.3\frac{m}{s}\pm0.2\frac{m}{s}$ . We notice that wind speed is caused by shifts from high to low pressures, and the data from (230, 900) conforms to this principle: Wind speed increases as Pressure decreases. Factors including temperature and the location of Jet Streams will result in divergence from this pattern. Pressure is highest when altitude is lower, so the stable plateau of wind velocity at the highest pressures is expected. Pressure collected in our data monotonically decreased with altitude. Plots of Wind Velocity vs. Pressure or Altitude will simply be a horizontal reflection in this case.

### Part IV. Wind Velocity vs. Wind Angle

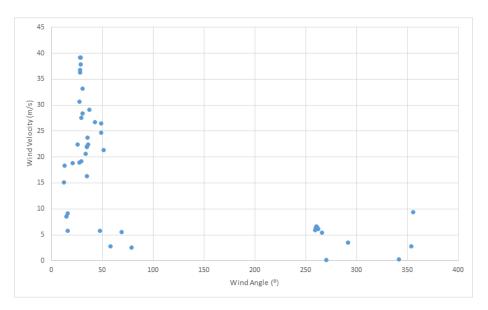


Fig. 3: Plot of Wind Velocity vs. Wind Angle

Although the tendencies of the data tend to wary between points, some overarching trends can be noted by analyzing the sign of the first and second derivatives (especially where they change). The data can be analyzed on various intervals.

- $angle \in (12^{\circ}, 16^{\circ})$ : Data varies wildly.
- angle ∈ (20°, 28°) Data is almost consistently increasing, before reaching a critical point while being concave down (thus being a local maximum).

- $angle \in (29^{\circ}, 35^{\circ})$  Data is also almost consistently increasing.
- $angle \in (35^{\circ}, 37^{\circ})$  Data varies before reaching a critical point while being concave down (thus being a local maximum).
- $angle \in (37^{\circ}, 48^{\circ})$  Data slowly and inconsistently decreases.
- angle ∈ (48°, 52°) Decreases before reaching a critical point and point of inflection (thus being a local minimum).
- $angle \in (53^{\circ}, 80^{\circ})$  Data varies.
- $angle \in (259^{\circ}, 260.2^{\circ})$  Data is increasing and concave up before reaching a point of inflection.
- angle ∈ (260.2°, 261°) Data is varying, but is critical and has a varying second derivative, meaning the data has a local maximum in this area.
- angle ∈ (261°, 271°) Data is decreasing, but second derivative goes from negative to positive, reaching a critical point where the second derivative is positive (thus being a local minimum).
- $angle \in (290^{\circ}, 355^{\circ})$  Data is consistently increasing, reaching a maximum at the end of the data.

The critical points on the interval (26°, 37°) and the general clustering of data around them represents the jet stream, blowing towards the NEbN (Northeast by North), while the critical point near 260 degrees seems to be the surface wind, which blows towards WbS (West by South).

The jet stream data can be fit by a normal distribution with R = 0.536.

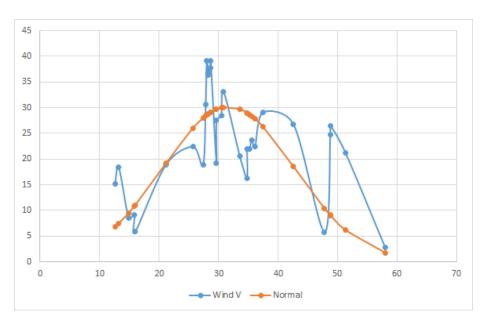


Fig. 4: Plot of Wind Velocity vs. Wind Angle on the Interval  $(10^{\circ}, 60^{\circ})$  Fit by a Normal Distribution

The equation for the distribution is:

$$wind(\theta) = \frac{1}{\sqrt{2*(11.18753)^2*\pi}} *e^{-\frac{(\theta-31.65742)^2}{2*(11.18753)^2}} *846$$

This gives us that the mean direction of the jet stream occurs at 31.65742 degrees.

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| Р            | Wind V                   | dV/dP                   | d <sup>2</sup> V/dP <sup>2</sup> | Increasing/Decreasing | Second Derivative Sign | Concavity     |
|--------------|--------------------------|-------------------------|----------------------------------|-----------------------|------------------------|---------------|
| 905.5        | 5.90581712               |                         |                                  |                       |                        |               |
| 901.5        | 6.1990502                | -0.07330827             |                                  | -                     |                        |               |
| 897.5        | 6.39453892               | -0.04887218             | -0.006109023                     | -                     | -                      |               |
| 893.5        | 6.49228328               | -0.02443609             | -0.006109022                     | -                     | -                      | Concave Dowr  |
| 889.3        | 6.49228328               | 0                       | -0.005818117                     | CRIT                  | -                      | 1             |
| 885.1        | 6.49228328               | 0                       | 0                                | CRIT                  | +                      |               |
| 880.8        | 6.59002764               |                         | 0.005286336                      | -                     | +                      | 1             |
| 876.4        | 6.59002764               | 0                       | -0.005166192                     | CRIT                  | -                      | 1             |
| 871.9        | 6.59002764               | 0                       | 0                                | CRIT                  | +                      | 1             |
| 867.2        | 6.59002764               | 0                       | 0                                | CRIT                  | +                      | 1             |
| 862.3        | 6.59002764               | 0                       | 0                                | CRIT                  | +                      | 1             |
| 857.2        | 6.59002764               | 0                       | 0                                | CRIT                  | +                      | 1             |
| 851.9        | 6.49228328               | _                       | -0.003479685                     | +                     | <u> </u>               | Concave Up    |
| 846.3        | 6.49228328               | 0                       | 0.003293274                      | CRIT                  | +                      | 1             |
| 840.5        | 6.47684996               | _                       | -0.000458779                     | +                     | <u> </u>               | 1             |
| 834.1        | 6.47684996               | 0                       | 0.000415768                      | CRIT                  | +                      | 1             |
| 827          | 6.3791056                | 0.013766811             | -0.001938988                     | +                     | <u> </u>               | 1             |
| 818.8        | 6.3791056                | 0.013700011             | 0.001678879                      | CRIT                  | +                      | 1             |
| 809.3        | 6.26592792               | 0.01191344              | -0.001254046                     | +                     | <u> </u>               | 1             |
| 798.4        | 6.26592792               | 0.01131344              | 0.001234046                      | CRIT                  | +                      | 1             |
| 785.9        | 6.15275024               | ·                       | -0.000724337                     | +                     | <u> </u>               |               |
| 771.8        | 5.41709532               |                         | -0.003058148                     | +                     | _                      | Concave Dowi  |
| 755.8        | 3.54451916               | 0.11703601              | -0.004053869                     | +                     | _                      | - Concave Dow |
| 737.9        | 2.81400868               |                         | 0.0042584                        | +                     | +                      |               |
| 718.1        | 5.82350608               | -0.151994818            | 0.009737649                      | <u>'</u>              | +                      | 1             |
| 696.5        | 9.14681432               |                         | 8.62058E-05                      | -                     | +                      | Concave Up    |
| 673.1        | 15.1606647               | -0.257002152            | 0.004407918                      | -                     | +                      | 1             |
| 648.3        | 18.3862286               | -0.13006306             | -0.005118512                     | -                     | <u> </u>               |               |
| 622.6        | 18.8698059               | -0.01881624             | -0.00432867                      |                       | _                      | Concave Dow   |
| 596.2        | 18.9161059               |                         | -0.000646305                     | -                     |                        |               |
| 569.2        | 19.2144834               |                         | 0.000344342                      |                       | +                      |               |
| 541.8        | 20.6343488               |                         | 0.000344342                      | -                     | +                      |               |
| 514.1        | 22.0284921               |                         | -5.37843E-05                     | -                     | -                      |               |
| 486.2        | 21.9153144               |                         | -0.001949342                     | +                     | -                      | 1             |
| 458.1        | 23.7261573               |                         | 0.002437699                      | -                     | +                      | 1             |
| 430.1        | 26.4321327               | -0.09664198             | 0.002437033                      | -                     | +                      | Concave Up    |
| 402          | 24.7293231               |                         | -0.005595736                     | +                     | <del>_</del>           | 1             |
| 373.9        | 26.751088                | -0.07194893             | 0.00471698                       | -                     | +                      | -             |
| 345.5        | 29.1020971               | -0.08278201             | 0.000381446                      | -                     | +                      | 1             |
| 343.3        | 33.1867824               |                         | 0.000381440                      | <u> </u>              | +                      | -             |
| 289.2        | 36.3300353               |                         | -0.001088333                     | -                     | <del>_</del>           |               |
| 263.1        | 37.811634                | -0.11306649             | -0.001088333                     | -                     | -                      | -             |
| 239.4        | 39.2006328               | -0.058607544            | 7.76924E-05                      | · ·                   | +                      | -             |
| 218          | 39.1851995               |                         | -0.00277237                      | +                     |                        | Concave Dowi  |
| 198.7        | 36.7776016               |                         | -0.00277237                      | +                     | -                      | 1             |
| 181.3        | 30.6402846               |                         | -0.006426137                     | +                     | -                      | 1             |
| 165.6        | 28.4178866               |                         | 0.013450022                      | +                     | +                      | 1             |
| 151.1        | 27.4970318               | 0.063507225             | 0.015450022                      | +                     | +                      |               |
|              |                          |                         |                                  | +                     |                        |               |
| 137.3<br>124 | 22.4091806<br>16.3130192 | 0.368684867<br>0.458358 | -0.022114322<br>-0.006742341     | +                     | -                      |               |
|              | 21.2722594               |                         |                                  | +                     |                        | 1             |
| 111.3        |                          |                         | 0.066838532                      | -                     | +                      |               |
| 98.9         | 22.4040362               |                         | -0.024130567                     |                       |                        | -             |
| 86.9         | 9.42461408               | 1.08161851              | -0.097740903                     | +                     | -                      | 1             |
| 75.1         | 5.80292832               |                         | 0.065652202                      | +                     | +                      | -             |
| 63.6         | 5.57142852               |                         | 0.024938444                      | +                     | +                      | -             |
| 52.3         | 2.829442                 | 0.242653674             | -0.019692324                     | +                     | -                      |               |
| 41           | 2.55164224               |                         | 0.019298197                      | +                     | +                      | Concave Up    |
| 29.8         | 0.20063316               |                         | -0.016547096                     | +                     | -                      | 1             |
| 18.7         | 0.31381084               |                         | 0.019829524                      | -                     | +                      | 4             |
| 7.6          | 8.58607036               | -0.745248605            | 0.066220939                      | -                     | +                      |               |
|              |                          |                         |                                  |                       |                        |               |

Tab. 3: Numerical analysis of Wind Velocity vs. Pressure.

Note: Critical points are not limited to where the first derivative is equal to zero. Because the derivative is discrete, the intermediate value theorem applies to real world data. When the first derivative changes signs, a critical point will also be present.