# Mindprint - Math

# Felicia Zhang

## 2018-08-01

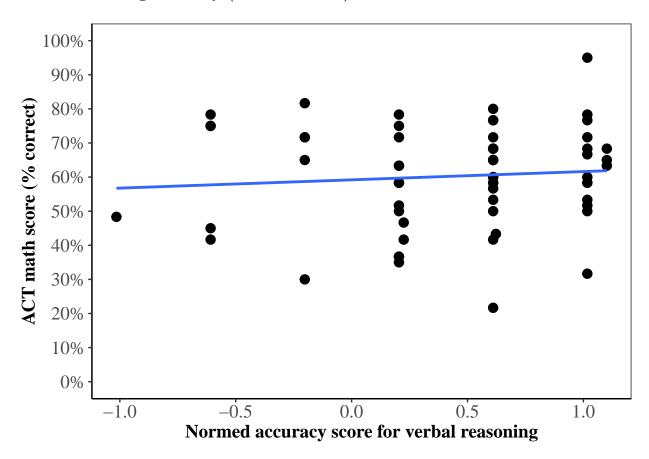
## Contents

ACT Math $(n = 61)$   no binning
Overall score
Verbal reasoning accuracy (no correlation)
Working memory efficiency (p = $0.049$ , r = $0.25$ )
Spatial perception accuracy (p = 0.011, r = 0.32)
Multi-variate analysis
EA/ Pre-Algebra/Elementary Algebra Subsection
Visual motor speed (no correlation)
Spatial perception accuracy (p = $0.002$ , r = $0.39$ )
GT/ Plane Geometry/Trigonometry Subsection
Abstract reasoning accuracy (no correlation)
Spatial perception accuracy (p = $0.027$ , r = $0.28$ )
AG/ Intermediate Algebra/Coordinate Geometry Subsection
Working memory accuracy (p = $0.019$ , r = $0.29$ )
Working memory speed (no correlation)
Working memory efficiency (p = 0.016, r = 0.3) $\dots$
Spatial perception accuracy (no correlation)
Appleseed Suggested Analyses
EA - abstract reasoning model
EA - abstract reasoning broken down by difficulty of questions
GT - abstract reasoning & spatial perception
GT - abstract reasoning & spatial perception broken down by difficulty of questions
AG - abstract reasoning & spatial perception
AG - abstract reasoning & spatial perception broken down by difficulty of
questions
AG - abstract reasoning & spatial perception & flexible thinking
AG - abstract reasoning & spatial perception & flexible thinking broken down by difficulty of questions
Summary

## ACT Math (n = 61) | no binning

### Overall score

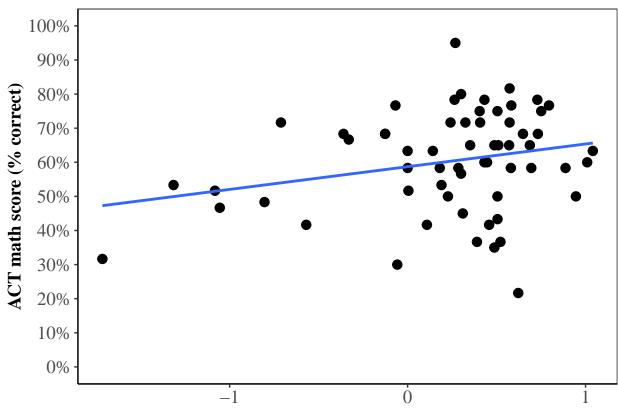
Verbal reasoning accuracy (no correlation)



```
##
## Pearson's product-moment correlation
##
## data: finalDF2$LAN_Az and finalDF2$ACTmathscore
## t = 0.66719, df = 59, p-value = 0.5073
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.1689678  0.3311398
## sample estimates:
## cor
## 0.08653498
```

Working memory efficiency (p = 0.049, r = 0.25)

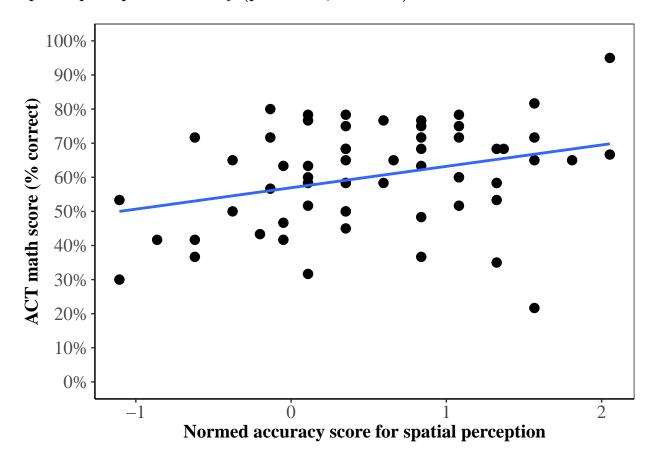
Average of normed accuracy and speed scores for working memory.



Average of normed accuracy and speed scores for working memory

```
##
## Pearson's product-moment correlation
##
## data: finalDF2$WM_EFFICIENCY and finalDF2$ACTmathscore
## t = 2.0083, df = 59, p-value = 0.04919
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.001216049 0.474550976
## sample estimates:
## cor
## 0.2529593
```

### Spatial perception accuracy (p = 0.011, r = 0.32)



```
##
## Pearson's product-moment correlation
##
## data: finalDF2$SPA_Az and finalDF2$ACTmathscore
## t = 2.6027, df = 59, p-value = 0.01168
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.07516989 0.52991266
## sample estimates:
## cor
## 0.3209159
```

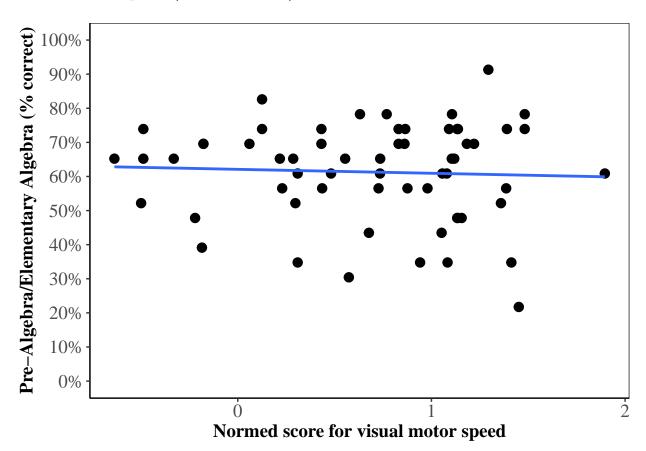
#### Multi-variate analysis

```
##
## Call:
## lm(formula = ACTmathscore ~ SPA_Az + WM_EFFICIENCY, data = finalDF2)
##
## Residuals:
                                   3Q
##
       Min
                 1Q
                      Median
                                           Max
## -0.47021 -0.06918 0.00500 0.09832 0.25560
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                 0.55762
                            0.02255 24.732
                                              <2e-16 ***
## SPA Az
                 0.05883
                            0.02371
                                      2.481
                                               0.016 *
## WM EFFICIENCY 0.05960
                            0.03193
                                      1.867
                                               0.067 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1383 on 58 degrees of freedom
## Multiple R-squared: 0.1538, Adjusted R-squared: 0.1246
## F-statistic: 5.272 on 2 and 58 DF, p-value: 0.007879
```

Spatial perception accuracy is a stronger predictor of overall math score compared to working memory efficiency, but WM efficiency is still important.

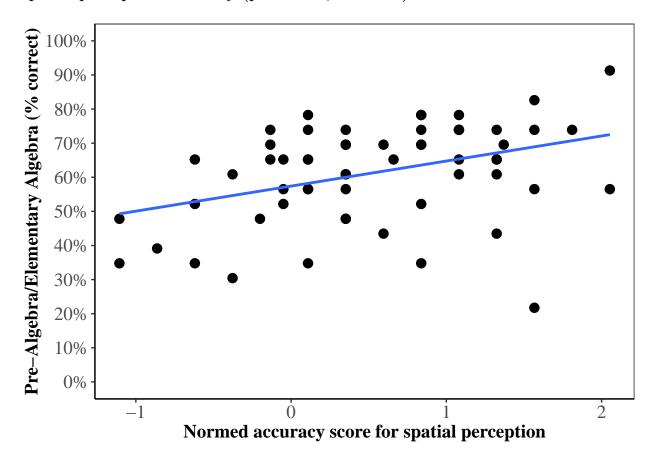
## EA/ Pre-Algebra/Elementary Algebra Subsection

Visual motor speed (no correlation)



```
##
## Pearson's product-moment correlation
##
## data: EA_DF$SM_Sz and EA_DF$EAscore
## t = -0.36649, df = 59, p-value = 0.7153
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.2959277 0.2066422
## sample estimates:
## cor
## -0.04765849
```

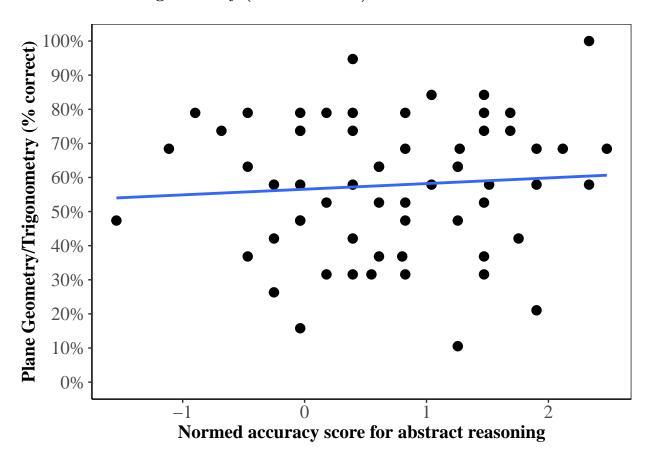
### Spatial perception accuracy (p = 0.002, r = 0.39)



```
##
## Pearson's product-moment correlation
##
## data: EA_DF$SPA_Az and EA_DF$EAscore
## t = 3.2251, df = 59, p-value = 0.002055
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.1499307 0.5821980
## sample estimates:
## cor
## 0.3871349
```

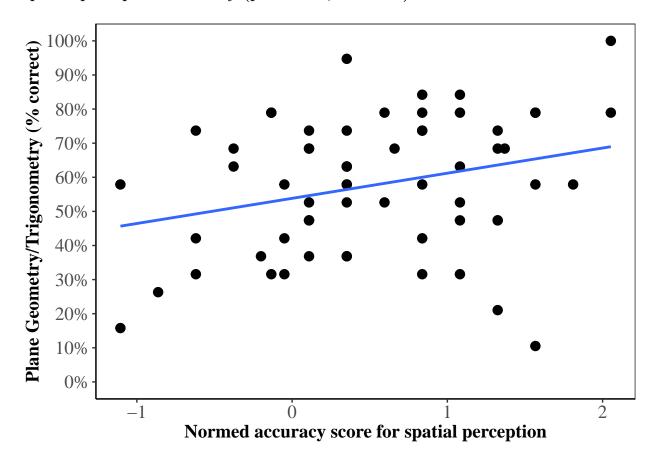
## GT/ Plane Geometry/Trigonometry Subsection

Abstract reasoning accuracy (no correlation)



```
##
## Pearson's product-moment correlation
##
## data: GT_DF$NVR_Az and GT_DF$GTscore
## t = 0.58306, df = 59, p-value = 0.5621
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.1795533 0.3213849
## sample estimates:
## cor
## 0.07568981
```

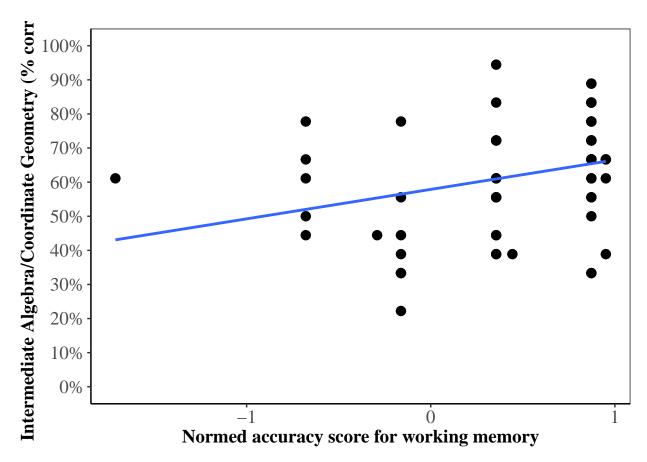
### Spatial perception accuracy (p = 0.027, r = 0.28)



```
##
## Pearson's product-moment correlation
##
## data: GT_DF$SPA_Az and GT_DF$GTscore
## t = 2.2615, df = 59, p-value = 0.02743
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.03296079 0.49878278
## sample estimates:
## cor
## 0.2824372
```

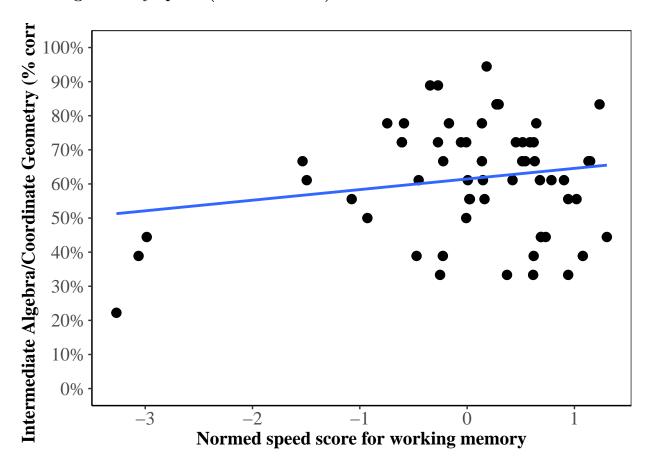
## AG/ Intermediate Algebra/Coordinate Geometry Subsection

Working memory accuracy (p = 0.019, r = 0.29)



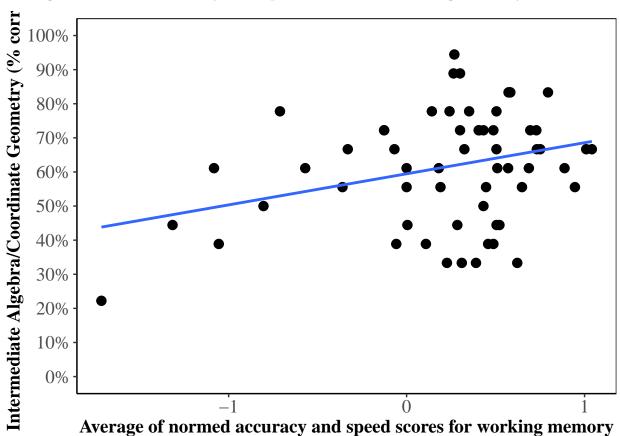
```
##
## Pearson's product-moment correlation
##
## data: AG_DF$WM_Az and AG_DF$AGscore
## t = 2.4009, df = 59, p-value = 0.01952
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.05029999 0.51171783
## sample estimates:
## cor
## 0.2983418
```

### Working memory speed (no correlation)



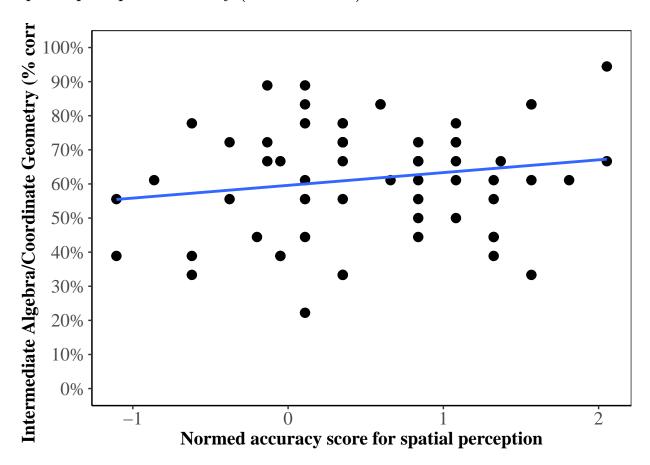
Working memory efficiency (p = 0.016, r = 0.3)

Average of normed accuracy and speed scores for working memory.



```
##
## Pearson's product-moment correlation
##
## data: AG_DF$WM_EFFICIENCY and AG_DF$AGscore
## t = 2.4711, df = 59, p-value = 0.01638
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.05897705 0.51811333
## sample estimates:
## cor
## 0.3062495
```

### Spatial perception accuracy (no correlation)

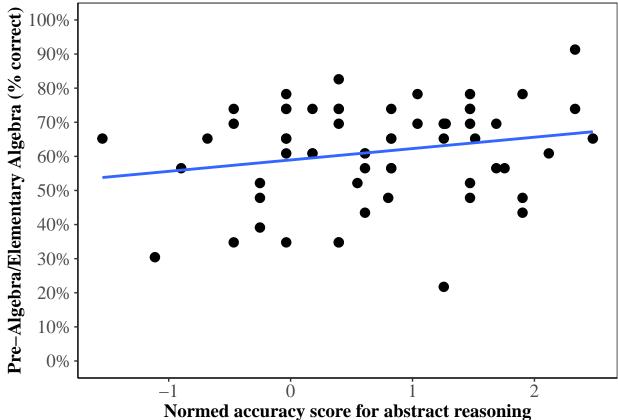


```
##
## Pearson's product-moment correlation
##
## data: AG_DF$SPA_Az and AG_DF$AGscore
## t = 1.3187, df = 59, p-value = 0.1924
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.08629409 0.40381802
## sample estimates:
## cor
## 0.1692035
```

### Appleseed Suggested Analyses

#### EA - abstract reasoning model

```
##
## Call:
## lm(formula = EAscore ~ NVR_Az, data = EA_DF)
##
## Residuals:
##
        Min
                  1Q
                       Median
                                     3Q
                                             Max
## -0.41398 -0.08279
                      0.02081 0.10058
                                       0.24574
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
                0.58945
## (Intercept)
                           0.02306
                                    25.560
                                              <2e-16 ***
                                               0.105
## NVR Az
                0.03336
                           0.02024
                                      1.648
## ---
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 0.1415 on 59 degrees of freedom
## Multiple R-squared: 0.04401,
                                    Adjusted R-squared:
## F-statistic: 2.716 on 1 and 59 DF, p-value: 0.1047
   100%
    90%
```



Elementary algebra is not predicted by abstract reasoning accuracy (p=0.1).

#### EA - abstract reasoning broken down by difficulty of questions

```
Level 1 EA
##
## Call:
## lm(formula = EA1 ~ NVR Az, data = finalDF3)
##
## Residuals:
##
      Min
                1Q Median
                                3Q
                                      Max
## -0.4254 -0.0419 0.0132 0.1260 0.1711
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.85480
                          0.02539
                                   33.672
                                            <2e-16 ***
## NVR Az
               0.02326
                          0.02229
                                     1.044
                                             0.301
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.1557 on 59 degrees of freedom
## Multiple R-squared: 0.01813,
                                   Adjusted R-squared: 0.001485
## F-statistic: 1.089 on 1 and 59 DF, p-value: 0.3009
Level 2 EA
##
## Call:
## lm(formula = EA2 ~ NVR Az, data = finalDF3)
## Residuals:
##
                      Median
                                    3Q
                                           Max
                  1Q
## -0.65725 -0.11427 0.04395 0.14433 0.30371
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept)
               0.73211
                          0.03414 21.445
                                            <2e-16 ***
## NVR Az
                                    1.332
                                             0.188
               0.03991
                          0.02997
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2094 on 59 degrees of freedom
## Multiple R-squared: 0.02918,
                                 Adjusted R-squared:
## F-statistic: 1.774 on 1 and 59 DF, p-value: 0.1881
```

```
Level 3 EA
##
## Call:
## lm(formula = EA3 ~ NVR_Az, data = finalDF3)
## Residuals:
##
       Min
                  10
                      Median
                                    30
                                           Max
## -0.55366 -0.27832 -0.03677 0.21323 0.48856
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.52974
                          0.04613 11.484
                                            <2e-16 ***
## NVR Az
               0.03921
                          0.04049
                                    0.968
                                             0.337
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.283 on 59 degrees of freedom
## Multiple R-squared: 0.01564,
                                 Adjusted R-squared:
                                                        -0.001044
## F-statistic: 0.9375 on 1 and 59 DF, p-value: 0.3369
Level 4 EA
##
## Call:
## lm(formula = EA4 ~ NVR_Az, data = finalDF3)
##
## Residuals:
##
       Min
                  1Q
                      Median
                                   3Q
                                           Max
## -0.42638 -0.31559 -0.05276 0.27050 0.70456
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
                          0.05161 7.838 1.03e-10 ***
## (Intercept) 0.40455
## NVR Az
              -0.04676
                          0.04531 - 1.032
                                             0.306
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.3166 on 59 degrees of freedom
## Multiple R-squared: 0.01773,
                                 Adjusted R-squared:
## F-statistic: 1.065 on 1 and 59 DF, p-value: 0.3063
Level 5 EA
##
## Call:
## lm(formula = EA5 ~ NVR Az, data = finalDF3)
```

```
##
## Residuals:
##
       Min
                 1Q Median
                                   3Q
                                           Max
## -0.2010 -0.1765 -0.1569 -0.1373
                                       0.8872
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
                 0.14790
                             0.06127
                                         2.414
                                                 0.0189 *
## (Intercept)
## NVR Az
                             0.05379
                                         0.423
                                                 0.6739
                 0.02275
## ---
                    0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 0.3759 on 59 degrees of freedom
## Multiple R-squared: 0.003023,
                                       Adjusted R-squared:
                                                               -0.01388
## F-statistic: 0.1789 on 1 and 59 DF, p-value: 0.6739
Pre–Algebra/Elementary Algebra (% correc
   100%
    90%
    80%
    70%
    60%
    50%
    40%
    30%
    20%
    10%
     0%
                     Normed accuracy score for abstract reasoning
                     Difficulty level \bullet 1 \bullet 2 \bullet 3 \bullet 4 \bullet 5
```

#### GT - abstract reasoning & spatial perception

```
##
## Call:
## lm(formula = GTscore ~ NVR_Az + SPA_Az, data = GT_DF)
##
## Residuals:
                      Median
                                   3Q
##
       Min
                 1Q
## -0.54855 -0.15501 0.01489 0.13689 0.38310
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.5383367 0.0338266 15.915
                                             <2e-16 ***
## NVR Az
              -0.0001412 0.0286241 -0.005
                                             0.9961
## SPA Az
              0.0738042 0.0341645
                                     2.160
                                             0.0349 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1926 on 58 degrees of freedom
## Multiple R-squared: 0.07977,
                                Adjusted R-squared:
## F-statistic: 2.514 on 2 and 58 DF, p-value: 0.08974
```

Plane geometry/trigonometry is predicted by spatial perception accuracy (p=0.034).

# $\operatorname{GT}$ - abstract reasoning & spatial perception broken down by difficulty of questions

```
Level 1 GT
##
## Call:
## lm(formula = GT1 ~ NVR Az + SPA Az, data = finalDF3)
##
## Residuals:
       Min
##
                  1Q
                      Median
                                    3Q
                                           Max
## -0.55251 -0.11299 0.09844 0.16147 0.23454
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.83067
                          0.03604 23.047
                                            <2e-16 ***
## NVR Az
              -0.04181
                          0.03050 - 1.371
                                             0.176
## SPA Az
               0.05825
                          0.03640
                                    1.600
                                             0.115
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2052 on 58 degrees of freedom
## Multiple R-squared: 0.05708,
                                   Adjusted R-squared:
## F-statistic: 1.756 on 2 and 58 DF, p-value: 0.1819
Level 2 GT
##
## Call:
## lm(formula = GT2 ~ NVR_Az + SPA_Az, data = finalDF3)
##
## Residuals:
##
       Min
                      Median
                                   3Q
                  1Q
                                           Max
## -0.49224 -0.22356 0.03266 0.22540 0.34613
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.694324
                         0.041792 16.614
                                            <2e-16 ***
## NVR Az
              0.005774
                         0.035365
                                    0.163
                                             0.871
## SPA Az
                                    1.395
              0.058903
                         0.042210
                                             0.168
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2379 on 58 degrees of freedom
## Multiple R-squared: 0.03754, Adjusted R-squared:
                                                        0.004349
## F-statistic: 1.131 on 2 and 58 DF, p-value: 0.3297
```

```
Level 3 GT
##
## Call:
## lm(formula = GT3 ~ NVR_Az + SPA_Az, data = finalDF3)
## Residuals:
##
       Min
                 1Q
                      Median
                                   30
                                           Max
## -0.64725 -0.20224 -0.01614 0.18714 0.49292
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.44476
                          0.04635
                                    9.595 1.41e-13 ***
## NVR Az
               0.02658
                          0.03923
                                    0.678
                                            0.5007
## SPA Az
                                    2.305
                                            0.0248 *
               0.10790
                          0.04682
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2639 on 58 degrees of freedom
## Multiple R-squared: 0.1095, Adjusted R-squared: 0.07884
## F-statistic: 3.568 on 2 and 58 DF, p-value: 0.03457
Level 4 GT
##
## Call:
## lm(formula = GT4 ~ NVR Az + SPA Az, data = finalDF3)
##
## Residuals:
       Min
                 1Q
                      Median
                                   3Q
## -0.46669 -0.19826 -0.05629 0.17840 0.53098
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.224076
                                    4.711 1.58e-05 ***
                         0.047565
                                    0.135 0.89337
## NVR Az
              0.005419
                         0.040250
## SPA Az
              0.150470
                         0.048040
                                    3.132 0.00272 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2708 on 58 degrees of freedom
## Multiple R-squared: 0.1576, Adjusted R-squared: 0.1285
## F-statistic: 5.424 on 2 and 58 DF, p-value: 0.006928
Level 5 GT
##
```

```
## Call:
## lm(formula = GT5 ~ NVR Az + SPA Az, data = finalDF3)
##
## Residuals:
       Min
                      Median
                                   3Q
                 1Q
                                           Max
## -0.34153 -0.17890 0.03582 0.11754 0.50998
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.14082
                          0.03635
                                    3.874 0.000275 ***
## NVR_Az
               0.03406
                          0.03076 1.107 0.272729
## SPA Az
               0.09141
                          0.03671
                                    2.490 0.015672 *
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.207 on 58 degrees of freedom
## Multiple R-squared: 0.1422, Adjusted R-squared: 0.1126
## F-statistic: 4.808 on 2 and 58 DF, p-value: 0.01169
```

The more difficult questions of plane geometry/trigonometry (level 3-5) is predicted by spatial perception accuracy.

#### AG - abstract reasoning & spatial perception

```
##
## Call:
## lm(formula = AGscore ~ NVR_Az + SPA_Az, data = AG_DF)
##
## Residuals:
##
                      Median
                                   3Q
       Min
                 1Q
                                           Max
## -0.36879 -0.14144 0.01698 0.11534 0.29510
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.591279
                         0.029384 20.122
                                           <2e-16 ***
## NVR Az
              0.008661
                         0.024865
                                    0.348
                                            0.729
## SPA Az
              0.034607
                         0.029678
                                    1.166
                                             0.248
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1673 on 58 degrees of freedom
## Multiple R-squared: 0.03066,
                                  Adjusted R-squared:
                                                       -0.002768
## F-statistic: 0.9172 on 2 and 58 DF, p-value: 0.4054
```

Algebra/coordinate geometry is not predicted by abstract reasoning or spatial perception.

# $\operatorname{AG}$ - abstract reasoning & spatial perception broken down by difficulty of questions

```
Level 1 AG
##
## Call:
## lm(formula = AG1 ~ NVR Az + SPA Az, data = finalDF3)
##
## Residuals:
      Min
               1Q Median
##
                               3Q
                                      Max
## -0.9618 -0.1525 0.1128 0.2140 0.4255
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.732804
                         0.055892 13.111
                                            <2e-16 ***
## NVR Az
              0.005217
                         0.047296
                                    0.110
                                            0.9126
## SPA Az
              0.141974
                         0.056451
                                    2.515
                                            0.0147 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.3182 on 58 degrees of freedom
## Multiple R-squared: 0.1077, Adjusted R-squared: 0.07689
## F-statistic: 3.499 on 2 and 58 DF, p-value: 0.03676
Level 2 AG
##
## Call:
## lm(formula = AG2 ~ NVR_Az + SPA_Az, data = finalDF3)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -0.7800 -0.2171 0.2216 0.2798 0.3424
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.731320
                          0.057273 12.769
                                             <2e-16 ***
                                     0.151
## NVR Az
               0.007302
                          0.048464
                                              0.881
## SPA Az
                          0.057845 - 0.764
                                              0.448
              -0.044210
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.3261 on 58 degrees of freedom
## Multiple R-squared: 0.01003, Adjusted R-squared:
                                                        -0.02411
## F-statistic: 0.2937 on 2 and 58 DF, p-value: 0.7466
```

```
Level 3 AG
##
## Call:
## lm(formula = AG3 ~ NVR_Az + SPA_Az, data = finalDF3)
## Residuals:
##
       Min
                 1Q
                      Median
                                   30
                                           Max
## -0.50628 -0.15479 0.04543 0.17675 0.36403
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.57201
                          0.03959 14.448
                                            <2e-16 ***
## NVR Az
               0.04406
                          0.03350 1.315
                                             0.194
## SPA Az
                                    1.372
               0.05488
                          0.03999
                                             0.175
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2254 on 58 degrees of freedom
## Multiple R-squared: 0.07863, Adjusted R-squared:
## F-statistic: 2.475 on 2 and 58 DF, p-value: 0.09304
Level 4 AG
##
## Call:
## lm(formula = AG4 ~ NVR Az + SPA Az, data = finalDF3)
##
## Residuals:
       Min
                 1Q
                      Median
                                   3Q
## -0.48170 -0.12493 -0.03673 0.21216 0.59689
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.40678
                          0.05152 7.896 9.15e-11 ***
                          0.04359 -1.024
## NVR Az
                                             0.310
              -0.04464
                                             0.295
## SPA Az
              0.05503
                          0.05203
                                  1.058
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2933 on 58 degrees of freedom
## Multiple R-squared: 0.02859,
                                Adjusted R-squared:
                                                       -0.004911
## F-statistic: 0.8534 on 2 and 58 DF, p-value: 0.4312
Level 5 AG
##
```

```
## Call:
## lm(formula = AG5 ~ NVR Az + SPA Az, data = finalDF3)
##
## Residuals:
      Min
               1Q Median
                               3Q
                                      Max
## -0.2824 -0.1593 -0.1180 0.2780 0.8413
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.19015
                          0.04677
                                   4.065 0.000146 ***
## NVR_Az
              -0.05879
                          0.03958 -1.486 0.142825
## SPA Az
                          0.04724
                                    0.282 0.778814
               0.01333
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2663 on 58 degrees of freedom
## Multiple R-squared: 0.0369, Adjusted R-squared: 0.003687
## F-statistic: 1.111 on 2 and 58 DF, p-value: 0.3361
```

Overall algebra/coordinate geometry is not predicted by abstract reasoning or spatial perception. But level 1 algebra/coordinate geometry is predicted by spatial perception.

#### AG - abstract reasoning & spatial perception & flexible thinking

```
##
## Call:
## lm(formula = AGscore ~ NVR_Az + SPA_Az + ABF_Az, data = AG_DF)
##
## Residuals:
##
       Min
                 1Q
                      Median
                                   3Q
## -0.39359 -0.12459 0.03113 0.11493 0.31446
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.58965
                          0.02931 20.118
                                            <2e-16 ***
## NVR Az
               0.01183
                          0.02492
                                    0.475
                                             0.637
## SPA Az
               0.02498
                          0.03065
                                    0.815
                                             0.418
## ABF_Az
               0.02656
                          0.02225
                                    1.194
                                             0.238
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1667 on 57 degrees of freedom
## Multiple R-squared: 0.05429,
                                   Adjusted R-squared:
## F-statistic: 1.091 on 3 and 57 DF, p-value: 0.3605
```

Algebra/coordinate geometry is not predicted by abstract reasoning, spatial perception or flexible thinking.

# AG - abstract reasoning & spatial perception & flexible thinking broken down by difficulty of questions

```
Level 1 AG
##
## Call:
## lm(formula = AG1 ~ NVR Az + SPA Az + ABF Az, data = finalDF3)
##
## Residuals:
      Min
##
               1Q Median
                               3Q
                                      Max
## -0.9540 -0.1449 0.1157 0.2146
                                  0.4224
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.731896
                         0.056383 12.981
                                            <2e-16 ***
## NVR Az
              0.006984
                         0.047933
                                    0.146
                                            0.8847
## SPA Az
                                    2.317
              0.136614
                         0.058960
                                            0.0241 *
## ABF Az
              0.014795
                         0.042809
                                    0.346
                                            0.7309
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.3207 on 57 degrees of freedom
## Multiple R-squared: 0.1095, Adjusted R-squared: 0.06266
## F-statistic: 2.337 on 3 and 57 DF, p-value: 0.08322
Level 2 AG
##
## Call:
## lm(formula = AG2 ~ NVR_Az + SPA_Az + ABF_Az, data = finalDF3)
##
## Residuals:
##
      Min
               10 Median
                               3Q
                                      Max
## -0.7912 -0.2146 0.1733 0.2716 0.4011
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.72897
                          0.05745 12.689
                                            <2e-16 ***
## NVR Az
                                    0.243
                                             0.809
               0.01186
                          0.04884
## SPA Az
              -0.05805
                          0.06008 -0.966
                                             0.338
## ABF Az
               0.03819
                          0.04362
                                    0.876
                                             0.385
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.3267 on 57 degrees of freedom
```

```
## Multiple R-squared: 0.02317, Adjusted R-squared:
                                                      -0.02825
## F-statistic: 0.4506 on 3 and 57 DF, p-value: 0.7178
Level 3 AG
##
## Call:
## lm(formula = AG3 ~ NVR Az + SPA Az + ABF Az, data = finalDF3)
## Residuals:
##
       Min
                 1Q
                      Median
                                  3Q
                                          Max
## -0.47882 -0.15379 0.02629 0.18046 0.37681
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.57058 0.03978 14.345 <2e-16 ***
## NVR Az
               0.04683
                          0.03382
                                  1.385
                                            0.171
## SPA Az
               0.04649
                          0.04160
                                   1.118
                                            0.268
## ABF Az
               0.02314
                        0.03020
                                   0.766
                                            0.447
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2262 on 57 degrees of freedom
## Multiple R-squared: 0.08802,
                                Adjusted R-squared:
## F-statistic: 1.834 on 3 and 57 DF, p-value: 0.1513
Level 4 AG
##
## Call:
## lm(formula = AG4 ~ NVR Az + SPA Az + ABF Az, data = finalDF3)
## Residuals:
                 1Q
                      Median
                                  3Q
                                          Max
## -0.49148 -0.13051 -0.03335 0.20272 0.59529
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 0.40600
                                  7.811 1.42e-10 ***
                        0.05198
## NVR Az
              -0.04312
                          0.04419 - 0.976
                                            0.333
                          0.05435
## SPA Az
              0.05042
                                   0.928
                                            0.358
## ABF Az
                                   0.323
              0.01274
                          0.03946
                                            0.748
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2956 on 57 degrees of freedom
## Multiple R-squared: 0.03036, Adjusted R-squared: -0.02068
```

```
## F-statistic: 0.5949 on 3 and 57 DF, p-value: 0.6209
Level 5 AG
##
## Call:
## lm(formula = AG5 ~ NVR Az + SPA Az + ABF Az, data = finalDF3)
## Residuals:
##
      Min
               1Q Median
                               ЗQ
                                      Max
## -0.3035 -0.1726 -0.1211 0.2479 0.8752
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
                          0.046987
                                     4.011 0.000178 ***
## (Intercept)
               0.188458
              -0.055510
## NVR Az
                          0.039945 -1.390 0.170045
## SPA Az
               0.003367
                          0.049136 0.069 0.945611
## ABF Az
               0.027499
                          0.035675
                                     0.771 0.443995
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2672 on 57 degrees of freedom
## Multiple R-squared: 0.04683,
                                   Adjusted R-squared:
                                                       -0.003334
## F-statistic: 0.9335 on 3 and 57 DF, p-value: 0.4305
```

Algebra/coordinate geometry is not predicted by abstract reasoning, spatial perception or flexible thinking but level 1 algebra/coordinate geometry is predicted by spatial perception.

### **Summary**

- 1. Overall math score is predicted by spatial perception and WM efficiency.
- 2. Elementary algebra score is predicted by spatial perception. It is not predicted by abstract reasoning even when broken down by question difficulty.
- 3. Plane geometry/trigonometry score is predicted by spatial perception accuracy. Specifically, the more difficult questions of plane geometry/trigonometry (level 3-5) is predicted by spatial perception accuracy.
- 4. Intermediate algebra/coordinate geometry is predicted by WM efficiency. But level 1 intermediate algebra/coordinate geometry is predicted by spatial perception.