# Using Baye's Theorem of Conditional Probability to Analyze Course Performance 

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## Baye's Theorem

1. Used to update prior beliefs about the probability of an event, given new evidence
2. Derived from the concept of conditional probability

# Applications of Baye's Theorem 

1. Medical Testing/Diagnosis
2. Operations Management/Quality Control
3. Spam Filtering

## Baye's Theorem

## Prob of Event ${ }_{1}=$ Prior Probability

## Prob(Event ${ }_{1} \mid$ Event $\left._{2}\right)=$

Prob of Event ${ }_{2}$ given Event ${ }_{1}$ is true
Prob(Event ${ }_{1}$ ) $\mathbf{x} \operatorname{Prob}\left(\right.$ Event $_{2} \mid$ Event $\left._{1}\right)$

## Prob(Event ${ }_{2}$ )

## Result = Posterior Probability

## Medical Test Example

## Prob(Disease | Test +) =



Posterior Probability $=31.7 \%$

## Analyzing Sequential Courses

1. Examine pre-requisite / next-level course pairs ENGL 1310 (Writing I) / ENGL 1320 (Writing II) MATH 1710 (Calculus I) / MATH 1720 (Calculus II)
2. Calculate prior probabilities for $2^{\text {nd }}$ course grades * Probability of A, B or Higher, Etc.
3. Use $1^{\text {st }}$ course grades \& Baye's theorem to update prior probabilities
4. Compare posterior \& prior probabilities

## Population / Data Set

For each course pair...

1. Select students passing first course, Fall 2013 Fall 2017
2. Of the above group, limit to students taking $2^{\text {nd }}$ course within the next year
3. Of the above group, pare down to those completing $2^{\text {nd }}$ course

## Calculus I / Calculus II Example

1. Total Population $=1,628$ students
2. Overall Probability of B or Higher in Calculus II = 52.3\% (Prior Probability)
3. Probability (B / Higher) in Calculus II, given B in Calculus I = ???? (Posterior Probability)

## Calculus I / Calculus II Example

## $\operatorname{Prob}\left(\mathrm{B}+{ }_{\text {cal ıl }} \mid \mathrm{B}_{\text {Calı }}\right)=$

$=$ Prob of B in Calculus I \& B+ in Calculus II

## $\operatorname{Prob}\left(\mathrm{B}+{ }_{\text {cal II }}\right) \mathbf{x} \operatorname{Prob}\left(\mathrm{B}_{\text {Calı }} \mid{ }^{\mathrm{B}}+_{\text {cal॥ }}\right)$

## $\operatorname{Prob}\left(\mathrm{B}_{\text {CalI }}\right)$

$=$ Prob of $\mathrm{B}_{\text {Cal। }} \& \mathrm{~B}_{{ }_{\text {Cal II }}}+$ Prob of $\mathrm{B}_{\text {Cal। }} \&<\mathrm{B}_{\text {Cal II }}$

## Calculus I / Calculus II Example

## $\operatorname{Prob}\left(\mathrm{B}_{\text {calıl }} \mid \mathrm{B}_{\text {call }}\right)=$



## ([205/1688] + [258/1628])

\# students with B in Calculus I \& <B in Calculus II

Posterior Probability $=44.3 \%$

Calculus I / Calculus II: Prior vs. Updated Probabilities

| Grade | Prior Probability: <br> Cal II Grade = <br> Grade or Higher | Posterior Probability: <br> Given Cal I Grade = <br> Grade |
| :--- | ---: | ---: |
| A | $31.2 \%$ | $63.0 \%$ |
| B | $52.3 \%$ | $44.3 \%$ |
| C | $69.4 \%$ | $42.9 \%$ |
| D | $80.5 \%$ | $49.0 \%$ |

Writing I / Writing II: Prior vs. Updated Probabilities

| Grade | Prior Probability: <br> Wri II Grade = <br> Grade or Higher | Posterior Probability: <br> Given Wri I Grade = <br> Grade |
| :--- | ---: | ---: |
| A | $50.7 \%$ | $66.8 \%$ |
| B | $80.2 \%$ | $74.6 \%$ |
| C | $90.9 \%$ | $74.6 \%$ |
| D | $93.4 \%$ | $70.9 \%$ |

## Potential Issues

1. Skills/Concepts Not Aligned Between $1^{\text {st }} \&$ $2^{\text {nd }}$ Course
2. Grade Inflation in $1^{\text {st }} /$ Pre-Requisite Course
3. Excessively Stringent Grading in $2^{\text {nd }}$ Course-
4. Large Scale Decline in Student Effort
$2^{\text {nd }}$ Course Performance \& Next-Term Persistence

| $2^{\text {nd }}$ <br> Course | $\begin{aligned} & 2^{\text {nd }} \text { Course Grade } \\ & \text { vs. } \\ & 1^{\text {st }} \text { Course Grade } \end{aligned}$ | Persistence Rate |
| :---: | :---: | :---: |
| Calculus II | Equal to / Greater Than | 95.1\% |
|  | Lower Than | 86.5\% |
| Writing II | Equal to / Greater Than | 89.0\% |
|  | Lower Than | 77.6\% |

## Calculus I / Calculus II: Updated Probabilities by Instructor Rank

 (Calculus I Grade = B)| Rank | Prior Probability: <br> Cal II Grade = <br> B or Higher | Posterior Probability: <br>  <br> Rank = Rank |
| :--- | ---: | ---: |
| Prof/Instructor | $52.3 \%$ |  |
| Adjunct/Other | $52.3 \%$ | $68.0 \%$ |
| Teaching Assistant | $52.3 \%$ | $38.0 \%$ |

## Calculus I / Calculus II: Updated Probabilities by Instructor Rank (Calculus I Grade = C)

| Rank | Prior Probability: Cal II Grade = C or Higher | Posterior Probability: Given Cal I Grade = C \& Rank $=$ Rank |
| :---: | :---: | :---: |
| Prof/Instructor | 69.4\% | 65.9\% |
| Adjunct/Other | 69.4\% | 35.9\% |
| Teaching Assistant | 69.4\% | 53.2\% |

Writing I / Writing II: Updated Probabilities by Instructor Rank (Writing I Grade = B)

| Rank | Prior Probability: <br> Wri II Grade = <br> B or Higher | Posterior Probability: <br>  <br> Rank = Rank |
| :--- | ---: | ---: |
| Adjunct/Other | $80.2 \%$ |  |
| Teaching Assistant | $80.2 \%$ | $74.9 \%$ |

Writing I / Writing II: Updated Probabilities by Instructor Rank (Writing I Grade = C)

| Rank | Prior Probability: <br> Wri II Grade = <br> C or Higher | Posterior Probability: <br>  <br> Rank = Rank |
| :--- | ---: | ---: |
| Adjunct/Other | $90.9 \%$ |  |
| Teaching Assistant | $90.9 \%$ | $75.6 \%$ |

## Thank You

## Session Evaluation Form Available via the Conference App

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