



Stony Brook University

# FAR BEYOND

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**Using Advanced Analytics to Boost Student  
Success**

**Dr. Braden J. Hosch, Asst. Vice President for Institutional  
Research, Planning & Effectiveness, Nov. 11, 2018**

# Overview

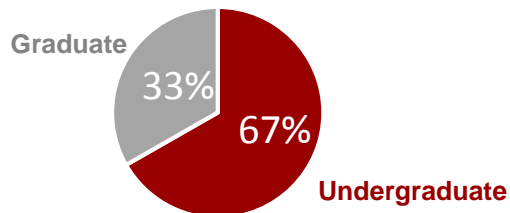
- Institutional profile and grad rate improvements
- Initiatives
- “Traditional” IR / Analytics
- Predictive Analytics
- Takeaways

# Stony Brook University Institutional Profile

Students:

**26,254**

Fall headcount



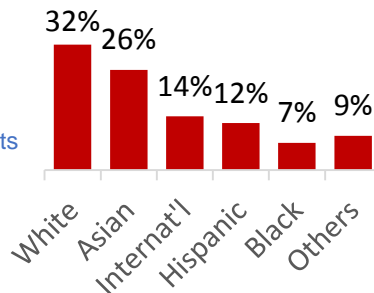
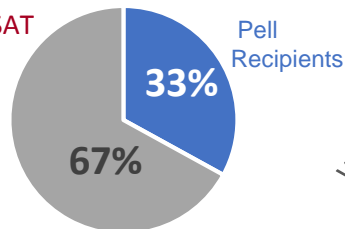
Institution:

Doctoral, Highest Research Activity  
Founded 1957, joined AAU 2001

Undergraduate Profile

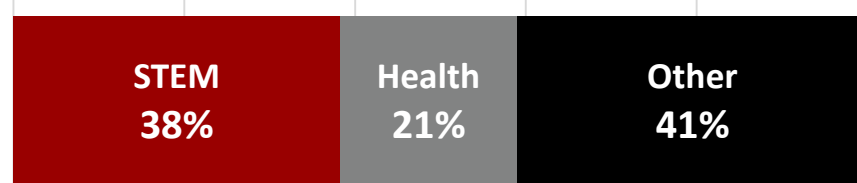
**1323**

avg. SAT



Program Profile

**7,272** Completions 2017-18



Employees:

**14,732** including hospital

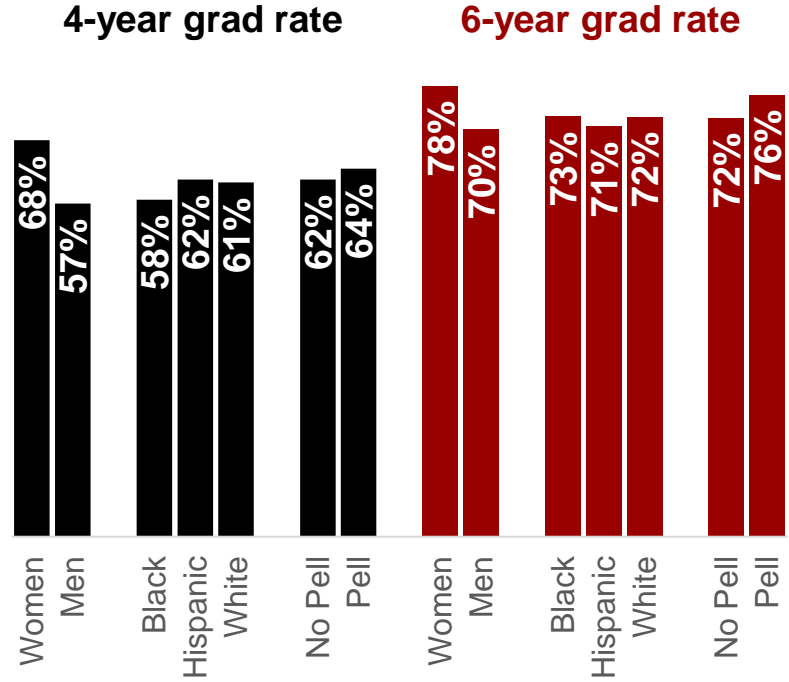
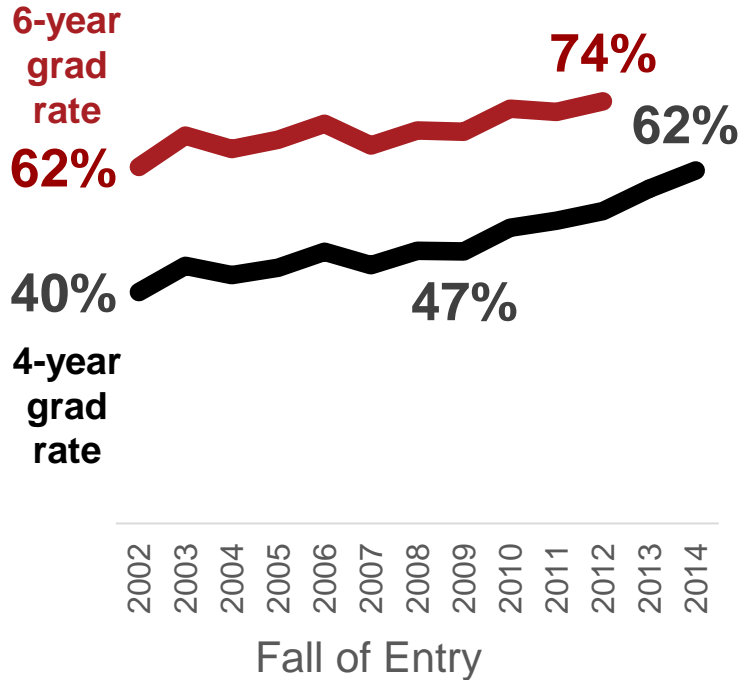
**2,704** faculty (FT & PT)

Finance:

**2.5 billion** USD annual budget

**230 million** USD research exp.

# Freshman graduation rates increased fifteen percentage points in the last five years; equity gaps are largely closed



## Improvements realized through multi-pronged approach

Broad-based  
academic  
success team

“Traditional”  
institutional  
research

In-house  
analytics

3<sup>rd</sup>-party  
analytics

Policy and  
procedure  
reform

Mini-grants to  
seniors

Attention to  
special  
populations

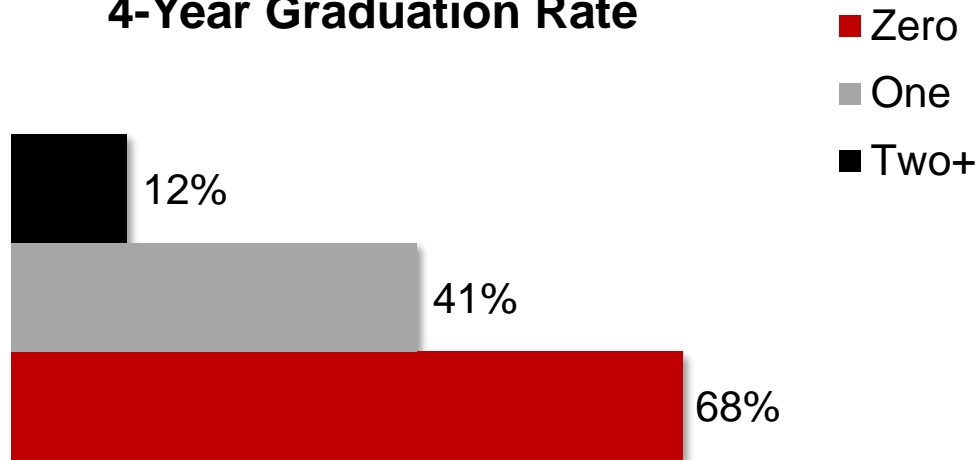
Expanded  
advising

Class availability

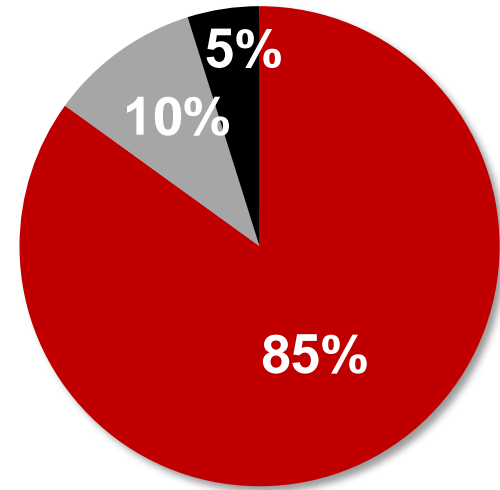
# Traditional IR - grad rates by DFW rates

Number of 1<sup>st</sup> Term Course Grades of D, F, W or U

## 4-Year Graduation Rate

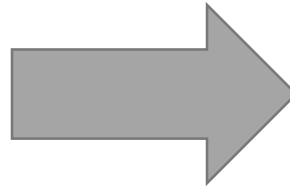
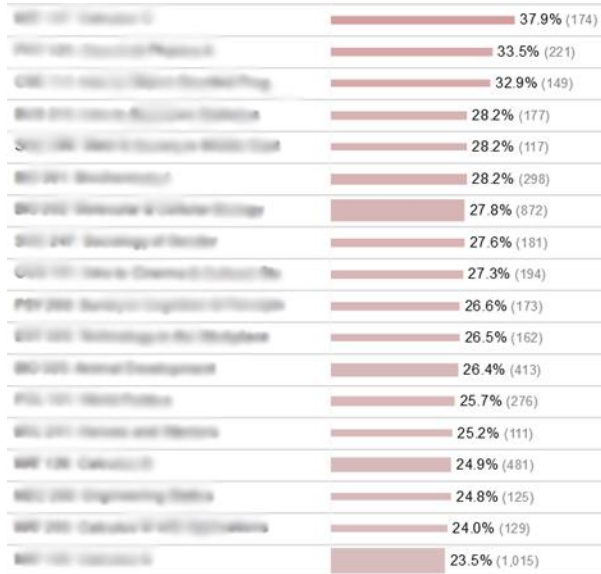


## Share of Cohort

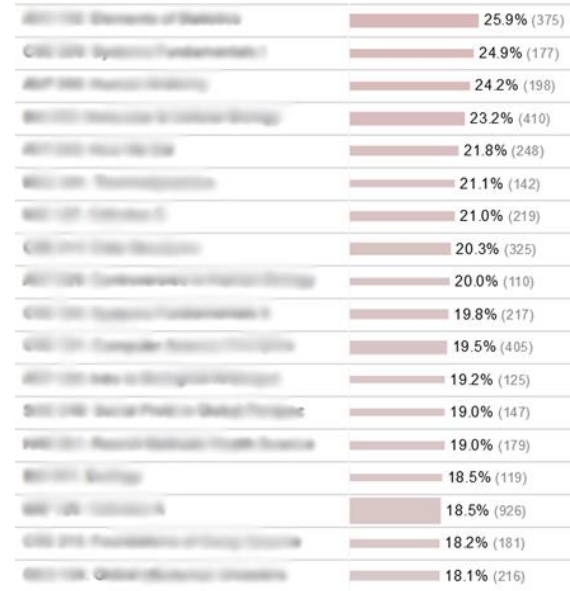


# Address Courses with Higher DFW Rates

Top 18 Fall 2010 courses  
**23.5%-37.9%**



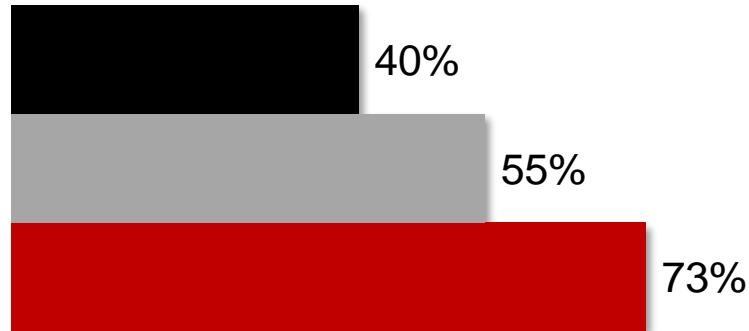
Top 18 Fall 2017 courses  
**18.1%-25.9%**



# Exploratory IR – number of course grades of A

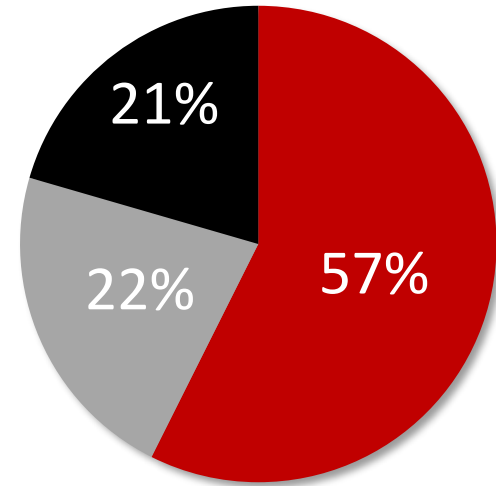
Number of 1<sup>st</sup> Term Course Grades of A or A-

## 4-Year Graduation Rate (pct)



- Two+
- One
- Zero

## Share of Cohort





# Method for local analytics: student-level predictions

Credit to: Nora Galambos, Ph.D., Senior Data Scientist

## Decision trees using SAS Enterprise Miner

Classification  
and  
Regression  
Trees (CART)  
method

Clustering to  
reduce multi-  
collinearity

Imputation of  
some but not  
all missing  
values

Data  
partitioned  
into training,  
test, and  
validation sets

# Data included in model

Demographics	Pre-college academic characteristics	College academic characteristics	Transactions, service utilization, activities.	Financial aid
<ul style="list-style-type: none"><li>• Gender</li><li>• Race/ethnicity</li><li>• geographic residence when admitted.</li></ul>	<ul style="list-style-type: none"><li>• SAT scores</li><li>• high school GPA</li><li>• average SAT scores of the high school (to control for high school GPA).</li></ul>	<ul style="list-style-type: none"><li>• Credits accepted when admitted</li><li>• AP credits</li><li>• number of STEM and non-STEM courses current term</li><li>• enrollment in high DFW courses</li><li>• area of major.</li></ul>	<ul style="list-style-type: none"><li>• <b>Learning management system (LMS) logins</b></li><li>• advising visits</li><li>• tutoring center utilization</li><li>• intramural and fitness class participation</li></ul>	<ul style="list-style-type: none"><li>• Expected family contribution AGI</li><li>• types and amounts of disbursed aid</li><li>• Pell, Tuition Assistance Program (TAP).</li></ul>

# LMS Data Processing

- Count only one login per course per hour
  - A course can have up to 24 logins per day
  - Eliminates multiple logins just few minutes apart.
- Logins totaled by week
- Per-course login rates calculated for STEM and non-STEM courses
- Class assignment grades not yet included
  - Timing and data processing issues
  - Completeness issues
  - Significant noise and false positives

# Decision Tree Model for Freshmen GPA: Part 1—HS GPA $\leq 92.0$

## HS GPA $\leq 92.0$

LMS logins per non-STEM crs, wk 2-6  $\geq 11.3$  or missing

LMS logins per non-STEM crs, wks 2-6  $< 11.3$

Avg. HS SAT CR  $> 570$

Avg. HS SAT CR  $\leq 570$

Avg. HS SAT CR  $\geq 540$

Avg. HS SAT CR  $< 540$

SAT Math CR  $> 1360$

SAT Math CR  $\leq 1360$

Logins per STEM crs, wk 2-6  $\geq 32.2$

Logins per STEM crs, wk 2-6  $< 32.2$

AP STEM Crs.  $\geq 1$

AP STEM Crs. = 0

Logs per STEM crs, wk 2-6  $\geq 5.3$  or miss

Logs per STEM crs, wk 2-6  $< 5.3$

AP STEM Crs  $\geq 1$

AP Stem Crs = 0

Highest DFW STEM Crs. Rate  $\geq 17\%$

Highest DFW STEM Crs. Rate  $< 17\%$

SAT Math  $\geq 680$

SAT Math  $< 680$  or miss.

Non-STEM crs logs  $\geq 3$  or miss.

Non-STEM crs logins  $< 3$

STEM crs logs Wk. 1  $\geq 5$  or miss.

STEM crs logs Wk 1  $< 5$

STEM logs Wk. 1  $\geq 5$  or miss.

STEM crs logs Wk. 1  $< 5$

STEM crs logs Wk 1  $\geq 1$  or miss.

STEM crs logs Wk 1 = 0

Avg. GPA = 1.59  
N = 13

Avg. GPA = 3.63  
N = 46

Avg. GPA = 3.20  
N = 23

Avg. GPA = 2.92  
N = 34

Avg. GPA = 3.25  
N = 94

Avg. GPA = 3.35  
N = 78

Avg. GPA = 3.09  
N = 121

Avg. GPA = 2.94  
N = 371

Avg. GPA = 2.53  
N = 57

Avg. GPA = 3.21  
N = 64

Avg. GPA = 2.69  
N = 16

Avg. GPA = 2.75  
N = 73

Avg. GPA = 2.12  
N = 18

Avg. GPA = 2.62  
N = 305

Avg. GPA = 1.94  
N = 25

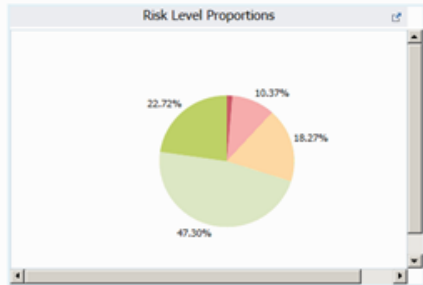
## Decision Tree Model for F14 Freshmen GPA: Part 2—HS GPA &gt; 92.0

## HS GPA > 92.0 or Missing

Scholarship = Yes								Scholarship = No							
HS GPA $\geq 96.5$ or missing				HS GPA < 96.5				LMS logins per non-STEM crs. Wk 2-6 $\geq 10.4$				LMS logins per non-STEM crs. wk 2-6 < 10.4			
Math Placement Exam $\geq 5$		Math Placement Exam < 5		Logs per non-STEM crs, wks 2-6 $\geq 29.1$		Logs per non-STEM crs, wks 2-6 < 29.1		AP STEM Crs. $\geq 1$		AP STEM Crs = 0		Logs per STEM crs, wks 2-6 $\geq 10.9$ or miss.		Logs per STEM crs. wks 2 6 < 10.9	
Logs per STEM Crs., wks 2-6 $\geq 15.6$	Logs per STEM Crs, wk 2-6 < 15.6	Ethnic Group = White, Hisp.	Ethnic Group = Asian, Afr. Amer., Unk.	SAT Math $\geq 70$ 0	SAT Math < 70 or miss.	Avg HS. CR, M Wrt $\geq 183$ 0 miss	Avg. HS CR, M, Wrt < 1830	DFW STEM Crs Total $\geq 2$	DFW STEM Crs Total < 2	SAT Math $\geq 76$ 0	SAT Math < 760	DFW non-STEM 1 <sup>st</sup> yrs $\geq 28\%$	DFW non-STEM 1 <sup>st</sup> yrs < 28%	STEM Crs logs Wk 1 $\geq 8$	STEM Crs logs Wk 1 < 8 or miss
Avg. GPA = 3.63 N = 285	Avg. GPA = 3.40 N = 83	Avg. GPA = 3.50 N = 73	Avg. GPA = 3.05 N = 30	Avg. GPA = 3.76 N = 26	Avg. GPA = 3.52 N = 74	Avg. GPA = 3.59 N = 54	Avg. GPA = 3.13 N = 54	Avg. GPA = 3.23 N = 163	Avg. GPA = 3.49 N = 101	Avg. GPA = 3.76 N = 11	Avg. GPA = 3.03 N = 194	Avg. GPA = 3.05 N = 72	Avg. GPA = 2.90 N = 73	Avg. GPA = 1.30 N = 11	Avg. GPA = 2.52 N = 16

# Analytics dashboard

## Risk Levels



**Risk Level**

- Highest Risk
- High Risk
- Moderate Risk
- Neutral
- Low Risk

**DistinctRecords**

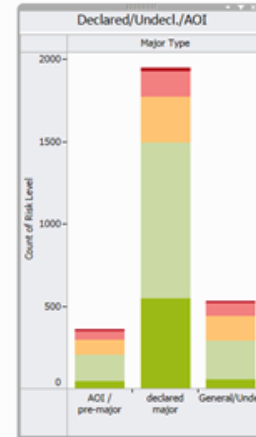
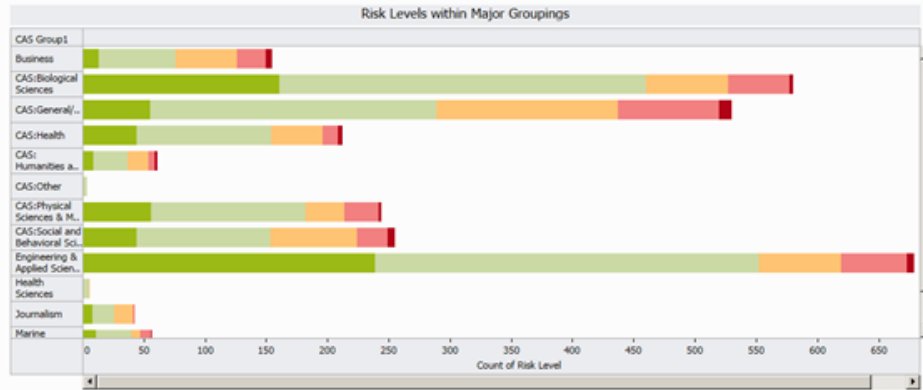
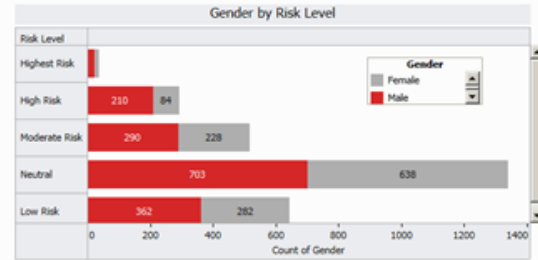
- (All)
- Distinct
- Other

**Risk Level**

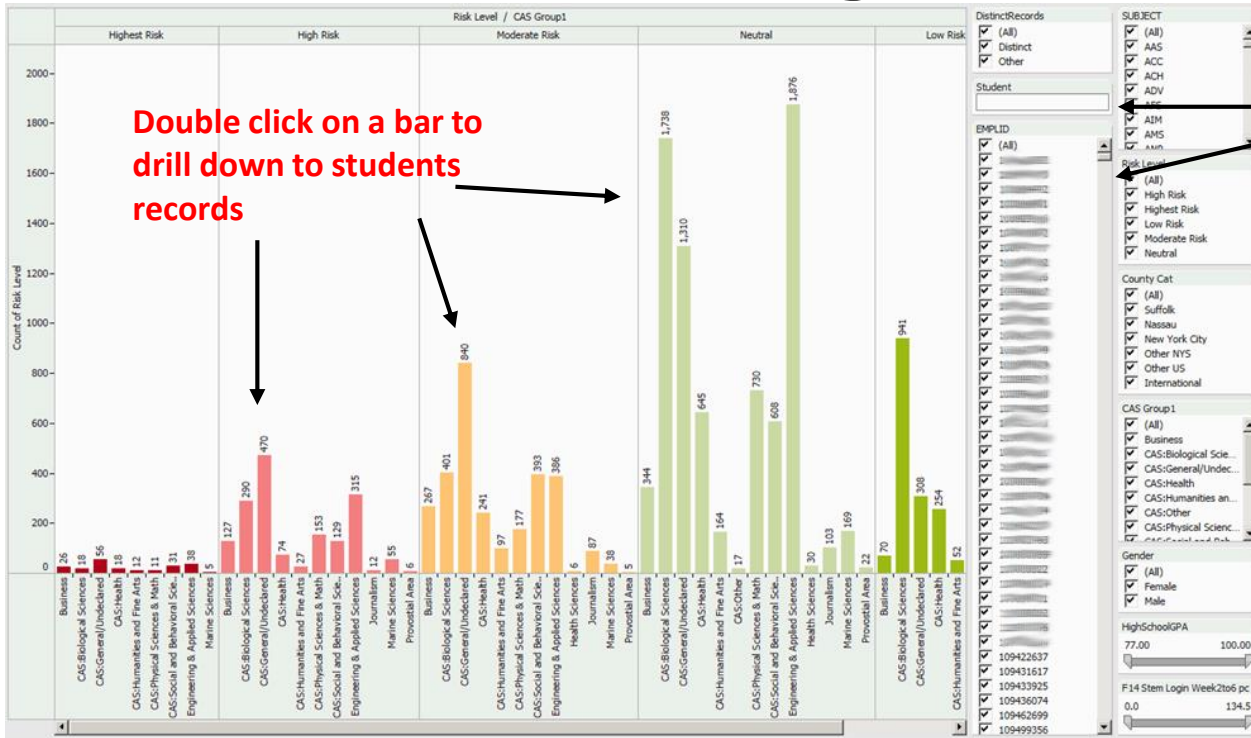
- (All)
- High Risk
- Highest Risk
- Low Risk
- Moderate Risk
- Neutral

**Gender**

- (All)
- Female
- Male



# Population monitoring and drill to detail



Double click on a bar to drill down to students records

Search for a student's name or choose an ID

HS GPA and LMS login sliders

# Final thoughts

## Selected Technical considerations

- Information delivery
- Data quality/governance
- False positives/negatives

**\*\*\*Use of analytics is not just technical\*\*\***

- Culture change
- Trust
- Ethics