



### Session learning outcomes:

You will learn one approach for developing predicted graduation rate models for your campus.

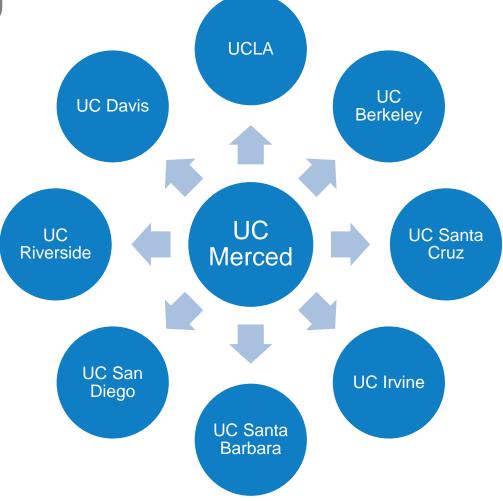
You will learn how to use the model results to develop a dashboard to engage campus leaders to use the results to develop a strategic plan for student completion.

# Modeling Methodology - Inputs

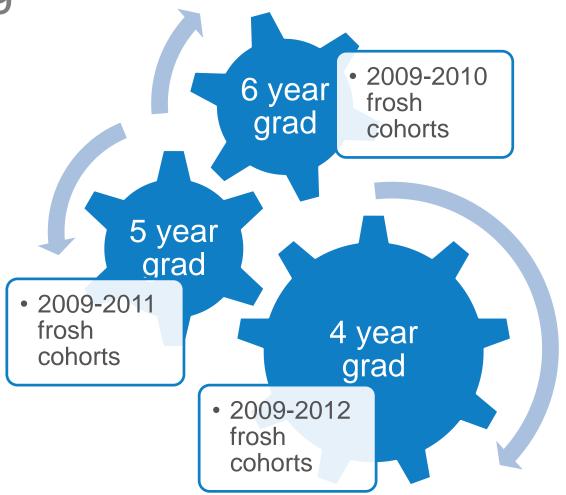
First Race/Ethnicity Residency Generation Status **Pell Grant** High School Gender Status **GPA** Major **Pre-UC Units Test Scores** Discipline

Modeling Methodology - Model

Building



Modeling Methodology – Model Building



# Modeling Methodology – Predictive Accuracy

	4 year grad	5 year grad	6 year grad
Pseudo R-squared	16%	12.4%	11.9%

# Modeling Methodology — Logistic Regression & Predicted Probabilities

Step 1: obtain coefficients for each predictor variable (Beta weights)

Step 2: apply coefficients to get predictions at student level

$$- EXP(Y)/[1+EXP(Y)]$$
 where Y = a + b1x1 + b2x2 + ... + bixi

Step 3: Calculate average predicted probabilities overall and across student groups

### Dashboard Development Steps

Clarify goals for end user interaction with the dashboard

Consider data structure and variables to ensure execution of dashboard design goals

### Dashboard Goals for User

Use predicted grad rates to set grad targets and/or view progress relative to targets

Use gaps between predicted and actual grad rates to identify intervention targets

### Dataset Structure and content

	pidm	cohort	gender	graduated_in_4_yrs	gender_OPmodel	predicted_prob_4yrgrad
1		200930	F	1	1	.51
2		201030	M	0	0	.60
3		200830	F	1	1	.38
4		200830	F	1	1	.72
5		200830	F	0	1	.59
6		200830	М	0	0	.49
7		200830	M	0	0	.35
8		200830	M	1	0	.40
9		200830	M	0	0	.39
10		200830	F	0	1	.36
11		200830	F	1	1	.61
12		200830	M	0	0	.27
13		200830	F	0	1	.51
14		200830	М	1	0	.26
15		200830	F	0	1	.47
16		200830	F	1	1	.42
17		200830	M	0	0	.33

### In Tableau

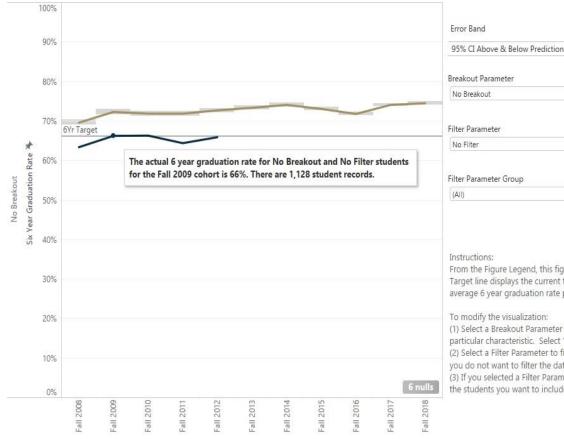
# Calculated average predicted probabilities

Calculated actual graduation rates

# Dashboard Demo – 6 year grad figure

Predicted and Actual 6 Year Graduation Rates for Each Cohort by No Breakout and No Filter - No Filter





Breakout Parameter

Filter Parameter

Filter Parameter Group

From the Figure Legend, this figure displays actual (blue line) and average predicted (gold line) 6 year graduation rates. The Target line displays the current target 6 year graduation rate. The grey band displays one possible measure of error for the average 6 year graduation rate prediction (the 95% Confidence Interval around the prediction).

To modify the visualization:

- (1) Select a Breakout Parameter from the list if you want to make a side-by-side comparison between students based on a particular characteristic. Select "No Breakout" if you do not want to make a side-by-side comparision.
- (2) Select a Filter Parameter to filter the data to include only students based a particular characteristic. Select "No Filter" if you do not want to filter the data.
- (3) If you selected a Filter Parameter, next use Filter Parameter Group to select the specific value(s) of the characteristic of the students you want to include in the visualization. The "All" box should be selected if no filter has been applied.

# Dashboard Demo – 6 year grad table

Predicted and Actual 6 Year Graduation Rates for Each Cohort by No Breakout and No Filter - No Filter

Breakout Paran	n.,	Fall 2008	Fall 2009	Fall 2010	Fall 2011	Fall 2012	Fall 2013	Fall 2014	Fall 2015	Fall 2016	Fall 2017	Fall 2018	
No Breakout	Actual Six Year Graduation Rate	63%	66%	66%	64%	66%							
	Predicted Six Year Graduation Rate (Average)	70%	72%	72%	72%	73%	73%	74%	73%	72%	74%	74%	
	6 Year Gap	-6%	-6%	-6%	-7%	-7%							
	Number of Student Records	925	1,128	1,341	1,443	1,495	1,654	1,551	1,790	2,049	2,293	2,217	The Predicted Six Year Graduation Rate (Average) for No Breakout and No Filter students for the Fall 2018 cohort is 74%.
Breakout Param	eter												
No Breakout													₹
Filter Parameter													
No Filter													, T
Filter Parameter	Group												
(AII)													¥

#### Instructions:

This table displayes actual and average predicted 6 year graduation rates. It also computes a gap between the predicted and actual rate (actual rate minus predicted rate). Zero or positive values indicate that we have met or exceeded the predicted rate. Negative values indicate that we have not met the predicted rate. The table also displays the number of records used in the calculation.

#### To modify the visualization:

- (1) Select a Breakout Parameter from the list if you want to make a side-by-side comparison between students based on a particular characteristic. Select "No Breakout" if you do not want to make a side-by-side comparison.
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# Summary

Shared one approach for developing predicted graduation rate models for your campus.

Shared how to use the model results to develop a dashboard. Can be used to engage campus leaders develop a strategic plan for student completion.

### Lessons Learned About Dashboards

- Get feedback from colleagues (not just in IR)
- (Ironically) Increases engagement between campus stakeholders and IR office
  - "How do I find the information I need?" (the firehose problem)
  - Changes questions from "what" to "why"?
  - Demos are important for increasing comfort with self-service
  - Users still want personal connection

### **Future Directions**

- UC system 2030 strategic planning
- Collaborations between system office and campuses can be important

### Resources

### Logistic Regression

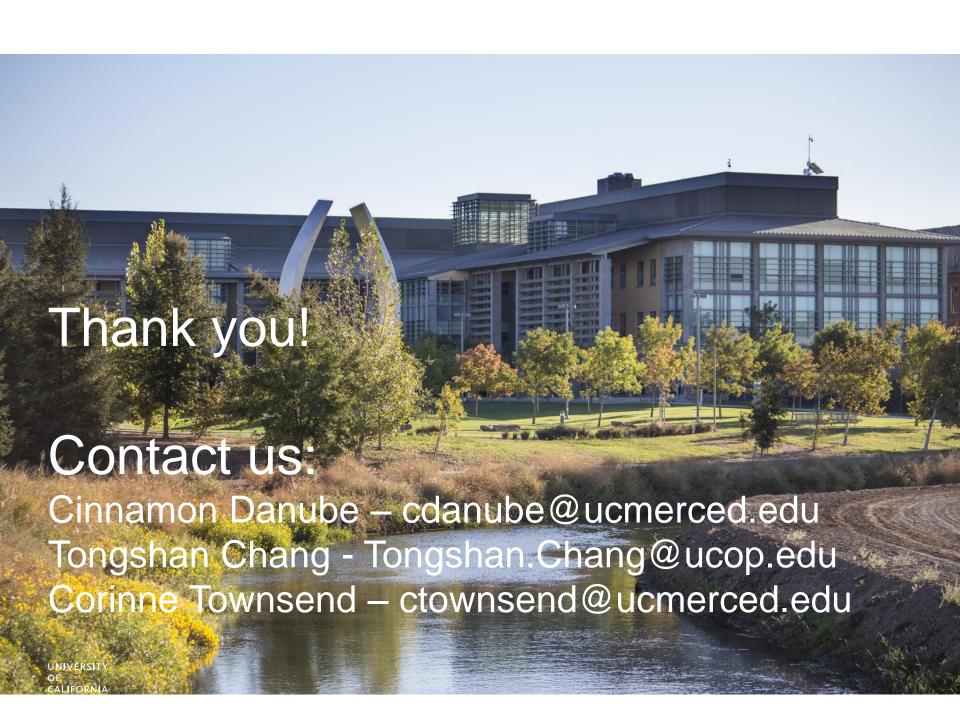
- Percontor workshop Exploring the power of predictive analytics: A step-by-step introduction to building a student-at-risk prediction model
- The Analysis Factor workshop Logistic Regression for Binary, Ordinal, and Multinomial Outcomes

#### **Tableau**

- Free training webinars
- Community resources and forums









## Statistics of Logistic Regression Models (see the notes and broad fields tabs for detailed information about the methodology)

Predictor_Type	Predictor	Estimate	Prob	Std En
Intercept	Intercept	-0.639	0.000	0.023
Gender	Female (male as reference)	0.519	0.000	0.013
Ethnicity	African American (White as reference)	-0.322	0.000	0.034
	American Indian (White as reference)	-0.336	0.000	0.079
	Asian/Pacific Islander (White as reference)	0.076	0.000	0.016
	Hispanic/Latino(a) (White as reference)	-0.330	0.000	0.020
	Other/Unknown (White as reference)	-0.132	0.000	0.03
First-Generation	Unknown (not first-generation as reference)	-0.067	0.060	0.034
	Yes (not first-generation as reference)	-0.056	0.000	0.01
Pell Status	Yes (not Pell as reference)	-0.215	0.000	0.015
Residency	International (CA resident as reference)	-0.256	0.000	0.02
	Nonresident domestic (CA resident as reference)	0.186	0.000	0,040
High School GPA	>0 < 3.25 (3.40 < 3.68 as reference)	-0.328	0.000	0.02
	3.25 - <3.40 (3.40 - < 3.68 as reference)	-0.228	0.000	0.025
	3.68 - < 3.95 (3.40 - < 3.68 as reference)	0.222	0.000	0.01
	3.55 -<4.16 (3.40 -< 3.68 as reference)	0.407	0.000	0.01
	4.16 - < 4.25 (3.40 - < 3.68 as reference)	0.604	0.000	0.02
	4.29 - < 4.33 (3.40 - < 3.68 as reference)	0.744	0.000	0.04
	4.33 or above (3.40 - < 3.68 as reference)	0.864	0.000	0.04
	Unknown (3.40 - < 3.68 as reference)	0.263	0.000	0.05
Test Score	400-< 2000 (1000 - <1200 as reference)	-0.338	0.000	0.02
	1200 - < 1400 (1000 - <1200 as reference)	0.095	0.000	0.01
	1400 pr above (1000 - <1200 as reference)	0.014	0.571	0.02
	Unknown (1000 - <1200 as reference)	-0.889	0.000	0.21
Pre UC Units	Pre UC Units (numerical)	0.019	0.000	0.00
Discipline	Arts (Engineering/Computer Science as reference)	0.658	0.000	0.03
	Health Sciences (Engineering/Computer Science as reference)	1.041	0.000	0.07
	Humanities (Engineering/Computer Science as reference)	0.734	0.000	0.03
	Life Sciences (Engineering/Computer Science as reference)	0.395	0.000	0.03
	Math/Physical Sciences (Engineering/Computer Science as reference)	0.255	0.000	0.02
	Professional Fields (Engineering/Computer Science as reference)	0.990	0.000	0.03
	Social Sciences (Engineering/Computer Science as reference)	0.839	0.000	0.02
	Undeclared (Engineering/Computer Science as reference)	0.476	0.000	0.025