## ECO 310: Problem Set #9

Due: April 26, 2016

Kevin Liu

## Problem 1

		Overview	of Regression			
	$\mathbf{Regr}$	ession Ty	$ ho e$ $r^2$	RMSE		
_	Ordinar	y Least Squ	iares 0.76	4005.25		
	K Nea	rest Neighb	ors $0.42$	6251.03		
		Ridge	0.61	5087.40		
		Lasso	0.67	4716.40		
	$\mathbf{E}$	lastic Net	0.37	6514.98		
	De	cision Tree	0.04	8042.44		
	Rar	dom Forest	0.35	6628.65		
	Rank			tion Name		Residual
	1		~	iversity-Newark		-12387.28
	2	Pennsylvania State University-Penn State Lehigh				-11728.43
	3	Pennsylvania State University-Penn State York			York	-11050.88
	4	Rutgers University-Camden				-9411.65
Ordinary Least Squares (NEG)	5			College of Health Sci		-8643.17
	6	Florid		niversity-Main Cam	pus	-8355.56
	7			ollege of Flint		-8024.05
	8			urchase College		-7550.39
	9	South		e Art Institute of D	allas	-7488.18
	10			City University		-7364.77
	_R	ank		tion Name	Resi	
				ollege-Los Angeles	1225	
		2	*		1190	
		3	Savannah State University		1105	
	,	9		8524		
Ordinary Least Squares (F	POS)	5	·		6719	
		6		Oaks College	6449	
				stitute of Technology		
				ge of the Holy Famil		
		9		en College	4529	
	ъ.	10		Colorado Boulder	4446	
	Rank		Institution		Residua	
	1			State University	-30900.0	
	2	Southern		nd A & M College	-26800.0	
	3	Auburn University -26000.0				
D · · · · · · (NEC)	4	Sa	vannah State	*	-23600.0	
Decision Trees (NEG)	5	Touro College -20116.6				
	6	Hendrix College -18692.3				
	7	California College of the Arts -15392.31				
	8	Northwestern University -15100.0				
	9	Valley Forge Christian College -13338.78				
	10		Naropa Uni	versity	-12325.0	U

	Rank	Institution Name	Residual
	1	Rose-Hulman Institute of Technology	31900.00
	2	Butler University	21200.00
	3	Bryan College of Health Sciences	18541.90
	4	University of Oklahoma-Health Sciences Ce	enter 17803.13
Decision Trees (POS)	5) 5	Washington Adventist University	10862.69
	6	Pace University-New York	10403.13
	7	CUNY Bernard M Baruch College	9521.54
	8	The University of Texas at Dallas	8821.54
	9	Silver Lake College of the Holy Family	8820.00
	10	Stony Brook University	8721.54
	Rank	Institution Name	Residual
	1	Naropa University	-20060
	2	Florida National University-Main Campus	-16760
	3	California College of the Arts	-16720
KNN (NEG)	4	Metropolitan State University of Denver	-15960
	5	Eastern Connecticut State University	-14940
	6	Hendrix College	-14400
	7	Prescott College	-13000
	8	Thomas University	-10320
	9	Westmont College	-9480
	10	New York College of Health Professions	-9300
R	ank	Institution Name	Residual
R	1	Rose-Hulman Institute of Technology	Residual 24200
_R	1 2 U1	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center	24200 21940
R	1	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design	24200
	1 2 U1 3 4	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences	24200 21940 15020 14800
KNN(POS)	1 2 Un 3 4 5	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University	24200 21940 15020
	1 2 U1 3 4	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College	24200 21940 15020 14800
	1 U1 3 4 5 6 7	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University	24200 21940 15020 14800 11240
	1 2 U1 3 4 5 6	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York	24200 21940 15020 14800 11240 11240
	1 U1 3 4 5 6 7	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas	24200 21940 15020 14800 11240 11240 10020
	1 2 U1 3 4 5 6 7 8	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140
	1 2 U1 3 4 5 6 7 8 9	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College Institution Name	24200 21940 15020 14800 11240 11240 10020 8340 8220
	1 2 U1 3 4 5 6 7 8 9 10	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140
	1 2 U1 3 4 5 6 6 7 8 9 10 Rar 1 2	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College Institution Name	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 Residual
	1 2 U1 3 4 5 6 7 8 9 10 Rar 1	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College  Institution Name Naropa University	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 Residual -19025.82
	1 2 U1 3 4 5 6 6 7 8 9 10 Rar 1 2	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College  Institution Name  Naropa University-Ponce	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 <b>Residual</b> -19025.82 -15868.10
	1 2 U1 3 4 5 6 7 8 9 10 Rar 1 2 3 4 4 5 5 5 5 5	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College  Institution Name  Naropa University Caribbean University-Ponce Caribbean University-Vega Baja Universidad Metropolitana Hendrix College	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 <b>Residual</b> -19025.82 -15868.10 -15846.24 -15624.29 -14336.91
KNN(POS)	1 2 Un 3 4 5 6 6 7 8 9 10 Rar 1 2 3 4 4 5 6 6 6 6 6 6 6	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College Institution Name  Naropa University Caribbean University-Ponce Caribbean University-Vega Baja Universidad Metropolitana Hendrix College American University of Puerto Rico	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 <b>Residual</b> -19025.82 -15868.10 -15846.24 -15624.29 -14336.91 -11460.36
KNN(POS)	1 2 U1 3 4 5 6 7 8 9 10 Rar 2 3 4 4 5 6 6 7 6 7 6 6 7	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College  Institution Name  Naropa University Caribbean University-Ponce Caribbean University-Vega Baja Universidad Metropolitana Hendrix College American University of Puerto Rico Baker College of Flint	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 <b>Residual</b> -19025.82 -15868.10 -15846.24 -15624.29 -14336.91 -11460.36 -9918.07
KNN(POS)	1 2 U1 3 4 5 6 7 8 9 10 Ran 4 5 6 6 7 8 6 7 8 8 9 10 8 8 6 7 8 8 6 7 8 8	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College  Institution Name  Naropa University Caribbean University-Ponce Caribbean University-Vega Baja Universidad Metropolitana Hendrix College American University of Puerto Rico Baker College of Flint Grace College and Theological Seminary	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 <b>Residual</b> -19025.82 -15868.10 -15846.24 -15624.29 -14336.91 -11460.36 -9918.07 -9868.67
KNN(POS)	1 2 U1 3 4 5 6 7 8 9 10 Rar 2 3 4 4 5 6 6 7 6 7 6 6 7	Rose-Hulman Institute of Technology niversity of Oklahoma-Health Sciences Center New York School of Interior Design Bryan College of Health Sciences Butler University CUNY Bernard M Baruch College Michigan Technological University Pace University-New York The University of Texas at Dallas Daemen College  Institution Name  Naropa University Caribbean University-Ponce Caribbean University-Vega Baja Universidad Metropolitana Hendrix College American University of Puerto Rico Baker College of Flint Grace College and Theological Seminary University of Alaska Southeast	24200 21940 15020 14800 11240 11240 10020 8340 8220 7140 <b>Residual</b> -19025.82 -15868.10 -15846.24 -15624.29 -14336.91 -11460.36 -9918.07

	Rank	Institution Name	Residual
	1	University of Oklahoma-Health Sciences Cer	nter 20867.00
	2	Rose-Hulman Institute of Technology	19831.42
	3	Bryan College of Health Sciences	16874.28
	4	New York School of Interior Design	16860.56
Elastic Net (POS)	5	Washington and Lee University	13324.51
	6	Washington Adventist University	10727.73
	7	Michigan Technological University	10599.53
	8	Butler University	10319.31
	9	Fairfield University	8142.88
	10	CUNY Bernard M Baruch College	7997.13
		Feature Importance	
Variable		Meaning	Feature Importance Coefficient
UGDS_AIAN	Prop	o. of UGs with American Indian Heritage	$3.66 \cdot 10^9$
UGDS_ASIAN		Prop. of UGs with Asian Heritage	$3.60 \cdot 10^9$
UGDS_2MOR		Prop. of UGs with Mixed Heritage	$3.52 \cdot 10^9$
UGDS_BLACK		Prop. of UGs with Black Heritage	$3.49 \cdot 10^9$
$\mathtt{UGDS}\_\mathtt{UNKN}$	F	Prop. of UGs with Unknown Heritage	$3.47 \cdot 10^9$
$\mathtt{UGDS\_NHPI}$	Pro	p. of UGs with Pacific Islander Heritage	$3.47 \cdot 10^9$
UGDS_HISP	]	Prop. of UGs with Hispanic Heritage	$3.42 \cdot 10^9$
$\mathtt{UGDS\_NRA}$	Pro	pp. of UGs who are NonResident Aliens	$3.41 \cdot 10^9$
UGDS_WHITE	P	rop. of UGs with Caucasian Heritage	$3.39 \cdot 10^9$
PCIP29	% of 1	Degrees in Military Tech/Applied Sciences	$1.22 \cdot 10^9$
NOPELL_ENRL_ORIG_YR6_RT	% v	vithout Pell Still Enrolled After 6 Years	$8.08 \cdot 10^{8}$
PCIP41		% of Degrees in Science Technologies	$5.37 \cdot 10^{8}$