

## Appendix A: List of HOV Lanes in our Field Experiment

Here is the list of HOV lanes we consider for selecting the users in our analysis:

- California: SR-57 N, I-880 N, I-805 N, US-101 N, SR-22 E, SR-237 E, and SR-57 S.
- Washington: I-90 W, SR-520 E, Exit 11: I-90 W / Seattle, and SR-520 W.
- Massachusetts: I-93 (North Expressway), and I-93 (Southeast Expressway).
- Georgia: I-75, I-85, and I-20.

## Appendix B: Additional Figures on Time Saving

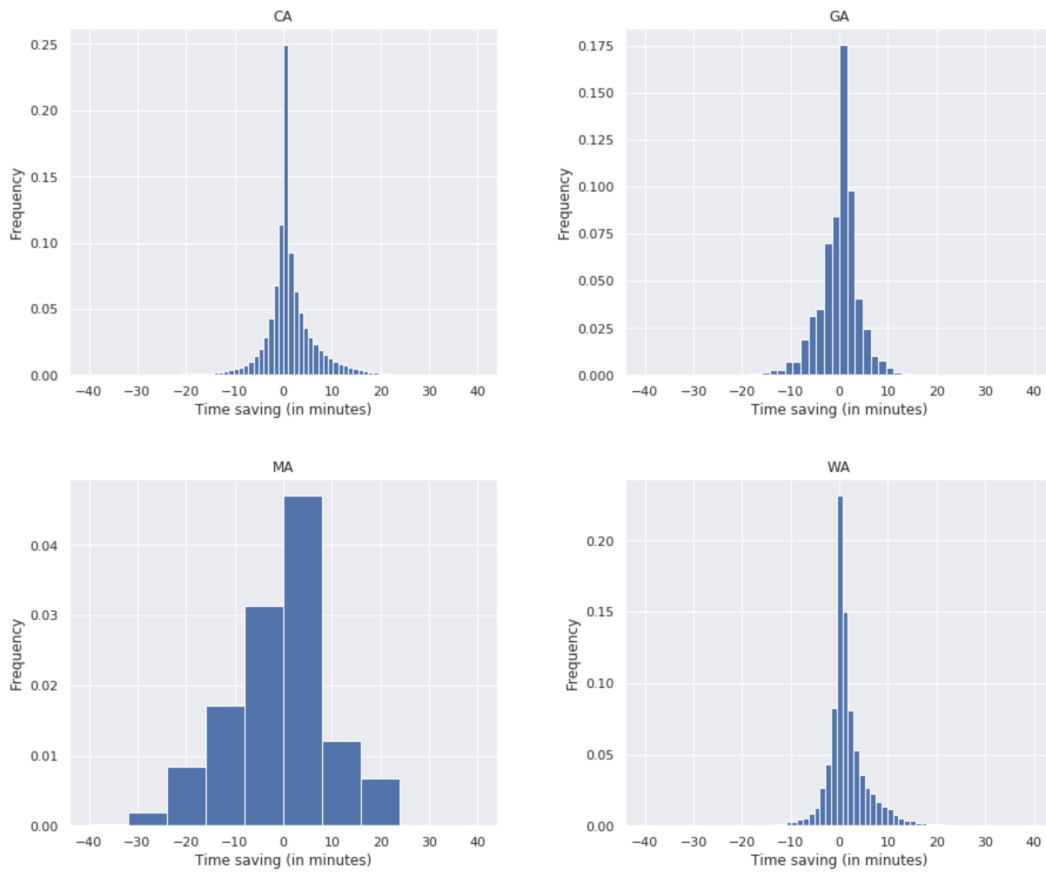


Figure 14 Time saving distribution for each market (CA, GA, MA, WA).

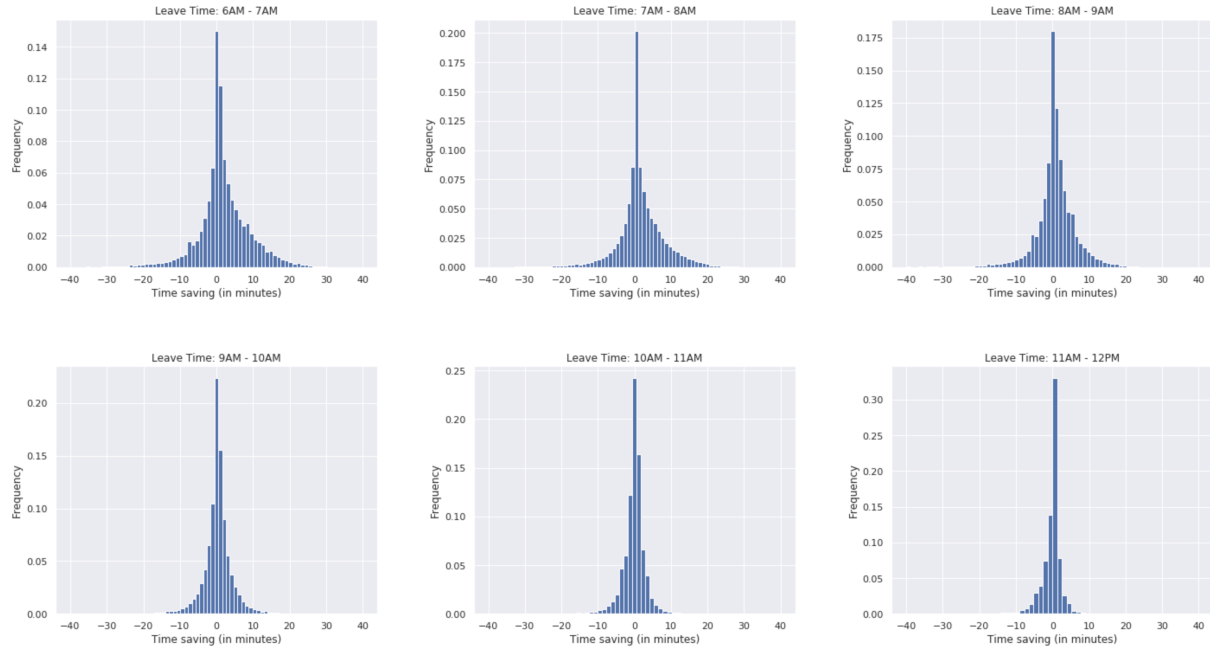


Figure 15 Time saving distribution for different leave times.

## Appendix C: Screenshots of the Encouragements

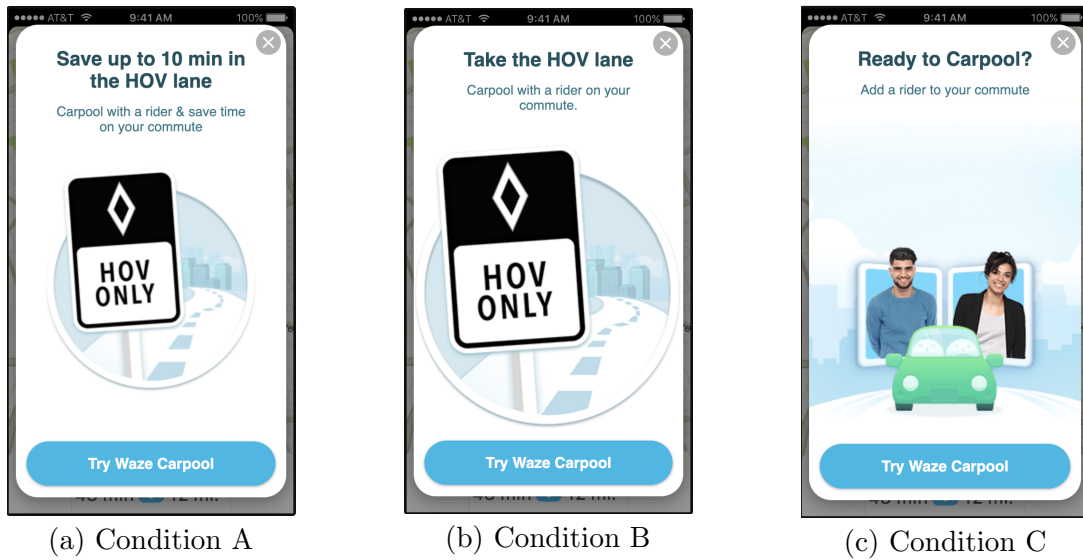


Figure 16 Copy of the messages used in our field experiment for L users.

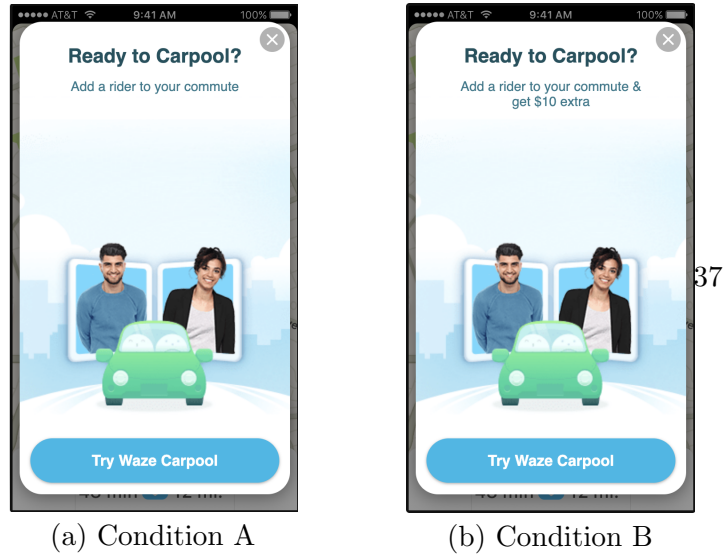


Figure 17 Copy of the messages used in our field experiment for N users.

Appendix D: Additional Balancedness Checks

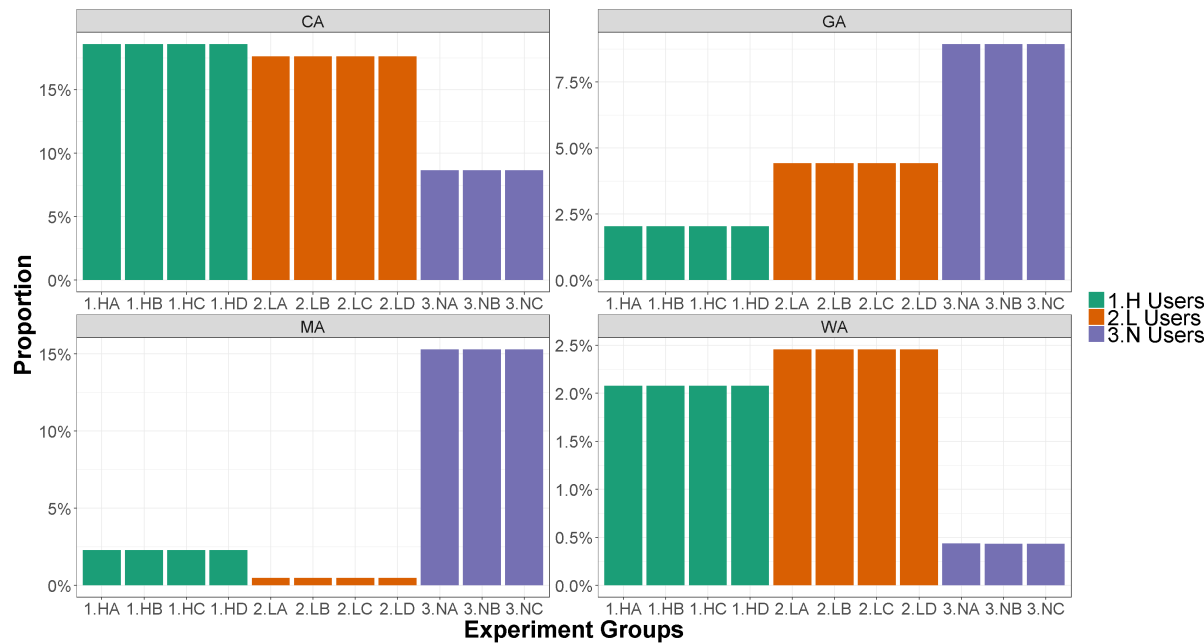


Figure 18 Proportion in the four markets across the different conditions for each user type.

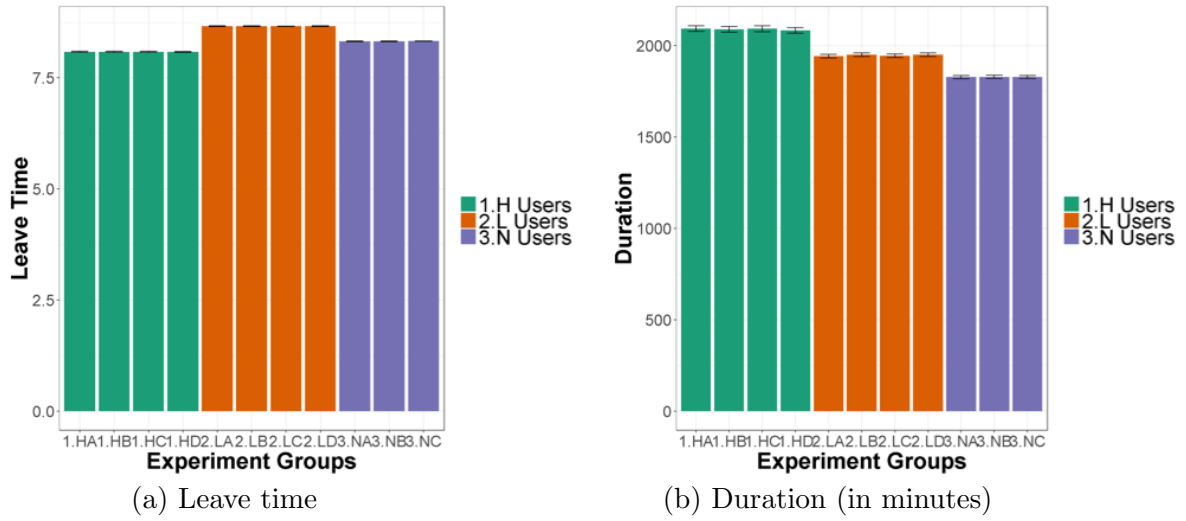


Figure 19 Average leave time and duration (in minutes) in the last 30 days.

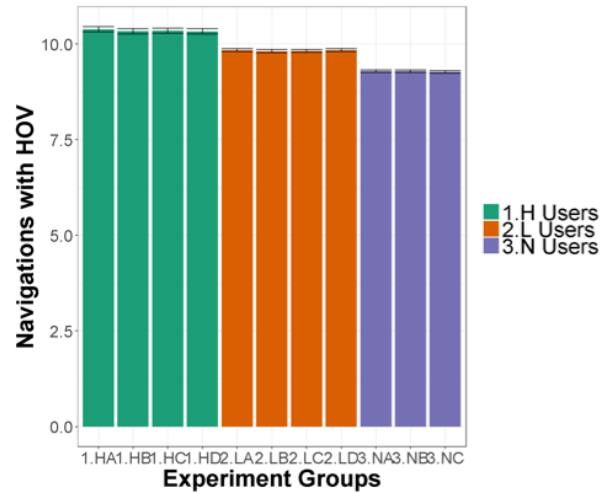


Figure 20 Average number of navigations with a HOV lane in the last 30 days.

## Appendix E: Additional Regression Results

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)1.HA	0.884*** (0.018)	0.866*** (0.019)	1.778*** (0.446)	1.766*** (0.448)
factor(experiment_group)1.HB	1.142*** (0.018)	1.128*** (0.018)	2.109*** (0.441)	2.099*** (0.443)
log(avg_distance_km)		-0.430*** (0.015)		-0.630** (0.267)
log(avg_leave_time)		-2.814*** (0.056)		-4.138*** (1.019)
log(days_since_waze_ob)		0.090*** (0.007)		0.124 (0.120)
log(sessions_30d)		0.178*** (0.010)		0.262 (0.184)
factor(market)GA		-0.556*** (0.026)		-1.116* (0.603)
factor(market)MA		0.327*** (0.025)		0.382 (0.398)
factor(market)WA		0.816*** (0.028)		0.973** (0.419)
Constant	0.658*** (0.016)	6.750*** (0.143)	-7.222*** (0.414)	1.710 (2.587)
Observations	1,483	1,483	1,483	1,483
R <sup>2</sup>	0.004	0.010		
Adjusted R <sup>2</sup>	0.003	0.004		
Log Likelihood			-335.745	-331.147
Akaike Inf. Crit.			677.490	682.295
Residual Std. Error	0.239 (df = 1480)	0.238 (df = 1473)		
F Statistic	3.090** (df = 2; 1480)	1.684* (df = 9; 1473)		
<i>Note:</i>		* p<0.1; ** p<0.05; *** p<0.01		

Figure 21 Regression estimates using OBR1 for H users.

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)2.LA	0.204*** (0.009)	0.194*** (0.009)	0.521* (0.284)	0.504* (0.284)
factor(experiment_group)2.LB	0.255*** (0.009)	0.245*** (0.009)	0.634** (0.283)	0.614** (0.284)
log(avg_distance_km)		-0.004 (0.007)		-0.014 (0.195)
log(avg_leave_time)		-1.227*** (0.025)		-2.790*** (0.723)
log(days_since_waze_ob)		0.083*** (0.004)		0.194* (0.107)
log(sessions_30d)		0.007 (0.005)		0.020 (0.150)
factor(market)GA		0.119*** (0.009)		0.266 (0.253)
factor(market)MA		-0.286*** (0.023)		-0.700 (0.730)
factor(market)WA		-0.027** (0.012)		-0.070 (0.358)
Constant	0.712*** (0.008)	2.816*** (0.067)	-7.060*** (0.246)	-2.345 (1.924)
Observations	3,386	3,386	3,386	3,386
R <sup>2</sup>	0.0004	0.002		
Adjusted R <sup>2</sup>	-0.0002	-0.001		
Log Likelihood			-524.557	-522.117
Akaike Inf. Crit.			1,055.114	1,064.234
Residual Std. Error	0.186 (df = 3383)	0.186 (df = 3376)		
F Statistic	0.637 (df = 2; 3383)	0.684 (df = 9; 3376)		
<i>Note:</i>		*p<0.1; **p<0.05; ***p<0.01		

Figure 22 Regression estimates using OBR1 for L users.

Table 7 Regression estimates for OBR1 when comparing the differences.

	OLS HA - HC vs. LA - LC	OLS HB - HC vs. LB - LC	OLS HA - HC vs. NB - NA	OLS HB - HC vs. NB - NA	OLS LA - LC vs. NB - NA	OLS LB - LC vs. NB - NA
H	0.0002 (0.0004)	0.0002 (0.0004)	0.0001 (0.0004)	0.0001 (0.0004)		
L					-0.0002 (0.0003)	-0.0002 (0.0003)
A	0.001*** (0.0003)		-0.0003 (0.0002)		-0.0003 (0.0002)	
H × A	0.001** (0.001)		0.003*** (0.001)			
B		0.001*** (0.0003)		-0.0003 (0.0002)		-0.0003 (0.0002)
H × B		0.001* (0.001)		0.003*** (0.001)		
L × A					0.001*** (0.0004)	
L × B						0.002*** (0.0004)
Constant	0.001*** (0.0002)	0.001*** (0.0002)	0.002*** (0.0002)	0.002*** (0.0002)	0.002*** (0.0002)	0.002*** (0.0002)
Observations	121,297	121,011	153,122	153,103	208,217	207,950
R <sup>2</sup>	0.0003	0.0004	0.0004	0.0004	0.0001	0.0002
Residual Std. Error	0.046 (df = 121293)	0.048 (df = 121007)	0.042 (df = 153118)	0.042 (df = 153099)	0.041 (df = 208213)	0.041 (df = 207946)
F Statistic	13.730*** (df = 3; 121293)	14.307*** (df = 3; 121007)	18.928*** (df = 3; 153118)	18.974*** (df = 3; 153099)	5.951*** (df = 3; 208213)	10.399*** (df = 3; 207946)

\* p &lt; 0.1, \*\* p &lt; 0.05, \*\*\* p &lt; 0.01.

	<i>Dependent variable:</i>			
	OBR1			
	<i>OLS</i>		<i>logistic</i>	
	(1)	(2)	(3)	(4)
factor(experiment_group)3.NA	0.007 (0.009)	0.006 (0.009)	0.215 (0.273)	0.208 (0.275)
log(avg_distance_km)		0.006 (0.008)		0.191 (0.247)
log(avg_leave_time)		-0.009 (0.037)		-0.255 (1.102)
log(days_since_waze_ob)		0.003 (0.005)		0.102 (0.165)
log(sessions_30d)		0.013* (0.007)		0.415* (0.219)
factor(market)GA		0.006 (0.013)		0.122 (0.356)
factor(market)MA		-0.022* (0.012)		-0.721* (0.371)
factor(market)WA		-0.038 (0.045)		-13.332 (577.622)
Constant	0.030*** (0.006)	-0.036 (0.095)	-3.468*** (0.203)	-5.684** (2.868)
Observations	1,660	1,660	1,660	1,660
R <sup>2</sup>	0.0004	0.007		
Adjusted R <sup>2</sup>	-0.0002	0.003		
Log Likelihood			-244.530	-238.384
Akaike Inf. Crit.			493.060	494.767
Residual Std. Error	0.181 (df = 1658)	0.180 (df = 1651)		
F Statistic	0.621 (df = 1; 1658)	1.533 (df = 8; 1651)		
<i>Note:</i>		* p<0.1; ** p<0.05; *** p<0.01		

**Figure 23** Regression estimates using OBR1 for N users.

**Table 8** Regression estimates for CTR including interaction terms with average time saving.

	OLS	Logistic
HA	0.0002 (0.008)	0.498* (0.276)
HB	-0.007 (0.008)	0.338 (0.273)
HC	0.005 (0.008)	0.277 (0.437)
LA	0.02*** (0.002)	0.982*** (0.113)
LB	0.016*** (0.002)	0.867*** (0.114)
log(avg_time_saving + 1)	0.002 (0.002)	0.115 (0.09)
log(avg_distance)	0.005*** (0.001)	0.183*** (0.033)
log(avg_leave_time)	0.015*** (0.003)	0.564*** (0.123)
log(days_since_joined)	-0.002*** (0.0004)	-0.068*** (0.0316)
log(sessions_30d)	0.001* (0.001)	0.049* (0.026)
GA	-0.008*** (0.001)	-0.6312*** (0.045)
MA	-0.006*** (0.002)	-0.22*** (0.081)
WA	-0.008*** (0.001)	-0.342*** (0.057)
HA $\times$ log(avg_time_saving + 1)	0.009** (0.004)	0.166 (0.143)
HB $\times$ log(avg_time_saving + 1)	0.013*** (0.004)	0.253* (0.141)
HC $\times$ log(avg_time_saving + 1)	-0.003 (0.004)	-0.191 (0.207)
LA $\times$ log(avg_time_saving + 1)	-0.001 (0.002)	-0.093 (0.107)
LB $\times$ log(avg_time_saving + 1)	0.002 (0.002)	-0.0003 (0.108)
Constant	-0.021** (0.009)	-5.716*** (0.15)
Observations	181,282	181,282
$R^2$	0.005	0.006
Log Likelihood		-21,912.35
Residual Std. Error	0.1161 (df = 181262)	
F Statistic	49.383*** (df = 19;181282)	

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$ .

Note. OLS corresponds to Equation (3), whereas Logistic corresponds to Equation (4).



## Appendix F: Carpool Adoption Results

For H users

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)1.HA	-0.069 (0.071)	-0.068 (0.071)	-1.993 (2.833)	-0.587 (3.361)
factor(experiment_group)1.HB	-0.110 (0.071)	-0.107 (0.071)	-36.282 (6,286.937)	-36.649 (8,668.560)
log(avg_distance_km)		0.046 (0.058)		1.011 (4.046)
log(avg_leave_time)		-0.418* (0.216)		-23.323 (15.468)
log(days_since_waze_ob)		0.037 (0.026)		2.548 (2.326)
log(sessions_30d)		-0.023 (0.040)		-2.941 (3.277)
factor(market)GA		0.260*** (0.099)		5.873* (3.401)
factor(market)MA		-0.022 (0.097)		-34.117 (21,996.050)
factor(market)WA		-0.023 (0.107)		-35.110 (22,801.640)
Constant	0.110* (0.061)	0.659 (0.549)	-10.850*** (2.004)	25.747 (46.293)
Observations	1,483	1,483	1,483	1,483
R <sup>2</sup>	0.002	0.010		
Adjusted R <sup>2</sup>	0.0003	0.004		
Log Likelihood			-13.850	-9.509
Akaike Inf. Crit.			33.699	39.018
Residual Std. Error	0.037 (df = 1480)	0.037 (df = 1473)		
F Statistic	1.229 (df = 2; 1480)	1.672* (df = 9; 1473)		
<i>Note:</i>			*p<0.1; **p<0.05; ***p<0.01	

Figure 24 Regression estimates using TSO30 for H users.

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)1.HA	-0.207 (0.142)	-0.217 (0.142)	-2.005 (1.640)	-2.006 (1.688)
factor(experiment_group)1.HB	-0.251* (0.141)	-0.262* (0.141)	-2.892 (1.832)	-3.004 (1.881)
log(avg_distance_km)		0.099 (0.115)		1.267 (1.897)
log(avg_leave_time)		-0.956** (0.431)		-13.361** (6.543)
log(days_since_waze_ob)		0.096* (0.051)		1.816* (1.019)
log(sessions_30d)		-0.048 (0.080)		-1.049 (1.363)
factor(market)GA		0.156 (0.197)		1.310 (2.296)
factor(market)MA		-0.146 (0.193)		-30.434 (3,277.346)
factor(market)WA		-0.148 (0.214)		-30.602 (3,696.379)
Constant	0.329*** (0.121)	1.576 (1.097)	-8.635*** (1.162)	6.562 (18.128)
Observations	1,483	1,483	1,483	1,483
R <sup>2</sup>	0.002	0.009		
Adjusted R <sup>2</sup>	0.001	0.003		
Log Likelihood			-48.469	-42.775
Akaike Inf. Crit.			102.939	105.551
Residual Std. Error	0.073 (df = 1480)	0.073 (df = 1473)		
F Statistic	1.602 (df = 2; 1480)	1.508 (df = 9; 1473)		
<i>Note:</i>		* p<0.1; ** p<0.05; *** p<0.01		

**Figure 25** Regression estimates using TSO180 for H users.

	<i>Dependent variable:</i>			
	formula1 <i>OLS</i> (1)	formula2 <i>OLS</i> (2)	formula1 <i>logistic</i> (3)	formula2 <i>logistic</i> (4)
factor(experiment_group)1.HA	0.000 (0.000)	0.000 (0.000)	0.000 (55,213.420)	0.000 (55,361.150)
factor(experiment_group)1.HB	0.000 (0.000)	0.000 (0.000)	-0.000 (54,944.340)	0.000 (55,095.030)
log(avg_distance_km)		0.000 (0.000)		-0.000 (44,899.540)
log(avg_leave_time)		0.000 (0.000)		-0.000 (167,672.500)
log(days_since_waze_ob)		0.000 (0.000)		0.000 (19,972.960)
log(sessions_30d)		0.000 (0.000)		-0.000 (31,103.190)
factor(market)GA		0.000 (0.000)		-0.000 (76,670.480)
factor(market)MA		0.000 (0.000)		-0.000 (75,298.660)
factor(market)WA		0.000 (0.000)		-0.000 (83,411.820)
Constant	0.000 (0.000)	0.000 (0.000)	-53.132 (47,169.780)	-53.132 (427,190.300)
Observations	1,483	1,483	1,483	1,483
Log Likelihood			-0.000	-0.000
Akaike Inf. Crit.			6.000	20.000
Residual Std. Error	0.000 (df = 1480) 0.000 (df = 1473)			

*Note:* \* p<0.1; \*\* p<0.05; \*\*\* p<0.01

**Figure 26** Regression estimates using TCR30 for H users.

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)1.HA	-0.110 (0.101)	-0.121 (0.101)	-34.282 (3,883.756)	-36.166 (5,602.931)
factor(experiment_group)1.HB	0.008 (0.100)	-0.004 (0.100)	0.137 (2.315)	-0.331 (2.384)
log(avg_distance_km)		0.167** (0.082)		6.470** (3.157)
log(avg_leave_time)		-0.179 (0.305)		-6.323 (9.074)
log(days_since_waze_ob)		0.049 (0.036)		2.124 (1.458)
log(sessions_30d)		-0.030 (0.057)		-1.319 (1.786)
factor(market)GA		-0.058 (0.140)		-35.033 (13,153.660)
factor(market)MA		-0.035 (0.137)		-33.795 (12,657.230)
factor(market)WA		-0.080 (0.152)		-34.436 (15,482.000)
Constant	0.110 (0.086)	-0.294 (0.778)	-10.850*** (2.004)	-30.950 (25.335)
Observations	1,483	1,483	1,483	1,483
R <sup>2</sup>	0.002	0.007		
Adjusted R <sup>2</sup>	0.001	0.001		
Log Likelihood			-25.504	-20.683
Akaike Inf. Crit.			57.008	61.365
Residual Std. Error	0.052 (df = 1480)	0.052 (df = 1473)		
F Statistic	1.428 (df = 2; 1480)	1.140 (df = 9; 1473)		

*Note:* \* p<0.1; \*\* p<0.05; \*\*\* p<0.01

**Figure 27** Regression estimates using TCR180 for H users.

## For L users

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)2.LA	-0.066 (0.047)	-0.067 (0.047)	-3.123 (2.451)	-3.123 (2.458)
factor(experiment_group)2.LB	-0.047 (0.047)	-0.048 (0.047)	-1.665 (2.002)	-1.673 (2.013)
log(avg_distance_km)		0.013 (0.035)		0.598 (1.916)
log(avg_leave_time)		-0.133 (0.131)		-6.553 (6.737)
log(days_since_waze_ob)		0.005 (0.019)		0.261 (1.061)
log(sessions_30d)		-0.006 (0.027)		-0.378 (1.478)
factor(market)GA		0.009 (0.047)		0.319 (2.257)
factor(market)MA		-0.055 (0.116)		-30.827 (6,681.456)
factor(market)WA		-0.037 (0.062)		-30.002 (3,490.333)
Constant	0.084** (0.039)	0.323 (0.347)	-11.391*** (1.417)	0.587 (18.694)
Observations	3,386	3,386	3,386	3,386
R <sup>2</sup>	0.001	0.001		
Adjusted R <sup>2</sup>	-0.00000	-0.002		
Log Likelihood			-36.709	-35.590
Akaike Inf. Crit.			79.418	91.180
Residual Std. Error	0.038 (df = 3383)	0.038 (df = 3376)		
F Statistic	0.997 (df = 2; 3383)	0.426 (df = 9; 3376)		
<i>Note:</i>			* p<0.1; ** p<0.05; *** p<0.01	

Figure 28 Regression estimates using TSO30 for L users.

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)2.LA	-0.055 (0.069)	-0.058 (0.070)	-1.161 (1.531)	-1.239 (1.534)
factor(experiment_group)2.LB	-0.053 (0.070)	-0.055 (0.070)	-1.090 (1.531)	-1.147 (1.535)
log(avg_distance_km)		-0.035 (0.052)		-0.839 (1.254)
log(avg_leave_time)		-0.135 (0.194)		-3.316 (4.777)
log(days_since_waze_ob)		-0.004 (0.028)		-0.095 (0.680)
log(sessions_30d)		0.006 (0.039)		0.135 (0.974)
factor(market)GA		-0.051 (0.070)		-1.397 (2.105)
factor(market)MA		-0.124 (0.172)		-30.643 (4,144.059)
factor(market)WA		-0.102 (0.093)		-30.105 (2,164.773)
Constant	0.126** (0.058)	0.559 (0.514)	-10.577*** (1.158)	-0.087 (12.515)
Observations	3,386	3,386	3,386	3,386
R <sup>2</sup>	0.0002	0.001		
Adjusted R <sup>2</sup>	-0.0004	-0.002		
Log Likelihood			-73.692	-71.769
Akaike Inf. Crit.			153.383	163.538
Residual Std. Error	0.057 (df = 3383)	0.057 (df = 3376)		
F Statistic	0.354 (df = 2; 3383)	0.384 (df = 9; 3376)		
<i>Note:</i>			* p<0.1; ** p<0.05; *** p<0.01	

**Figure 29** Regression estimates using TSO180 for L users.

	<i>Dependent variable:</i>			
	formula1 <i>OLS</i> (1)	formula2 <i>OLS</i> (2)	formula1 <i>logistic</i> (3)	formula2 <i>logistic</i> (4)
factor(experiment_group)2.LA	-0.042 (0.030)	-0.043 (0.030)	-34.352 (4,218.892)	-35.579 (6,042.965)
factor(experiment_group)2.LB	-0.024 (0.030)	-0.025 (0.030)	-1.663 (2.830)	-1.740 (2.861)
log(avg_distance_km)		0.021 (0.022)		2.852 (3.428)
log(avg_leave_time)		-0.149* (0.083)		-18.369 (11.374)
log(days_since_waze_ob)		0.0005 (0.012)		-0.438 (1.572)
log(sessions_30d)		0.012 (0.017)		1.777 (2.297)
factor(market)GA		-0.022 (0.030)		-35.147 (9,338.689)
factor(market)MA		-0.039 (0.073)		-35.544 (27,210.510)
factor(market)WA		-0.016 (0.039)		-33.996 (13,138.460)
Constant	0.042* (0.025)	0.241 (0.219)	-12.780*** (2.002)	10.493 (30.353)
Observations	3,386	3,386	3,386	3,386
R <sup>2</sup>	0.001	0.002		
Adjusted R <sup>2</sup>	0.00002	-0.0005		
Log Likelihood			-15.613	-12.813
Akaike Inf. Crit.			37.227	45.626
Residual Std. Error	0.024 (df = 3383)	0.024 (df = 3376)		
F Statistic	1.036 (df = 2; 3383)	0.830 (df = 9; 3376)		
<i>Note:</i>			* p<0.1; ** p<0.05; *** p<0.01	

**Figure 30** Regression estimates using TCR30 for L users.

	<i>Dependent variable:</i>			
	formula1	formula2	formula1	formula2
	<i>OLS</i> (1)	<i>OLS</i> (2)	<i>logistic</i> (3)	<i>logistic</i> (4)
factor(experiment_group)2.LA	-0.049 (0.051)	-0.049 (0.051)	-1.735 (2.002)	-1.779 (2.010)
factor(experiment_group)2.LB	-0.047 (0.052)	-0.048 (0.052)	-1.665 (2.002)	-1.771 (2.009)
log(avg_distance_km)		0.006 (0.038)		0.418 (1.772)
log(avg_leave_time)		-0.152 (0.144)		-6.995 (6.343)
log(days_since_waze_ob)		-0.013 (0.020)		-0.608 (0.850)
log(sessions_30d)		0.029 (0.029)		1.263 (1.206)
factor(market)GA		-0.064 (0.051)		-33.231 (4,122.958)
factor(market)MA		-0.088 (0.127)		-34.106 (11,061.380)
factor(market)WA		-0.058 (0.068)		-32.932 (5,708.430)
Constant	0.084* (0.043)	0.364 (0.379)	-11.391*** (1.417)	0.925 (16.542)
Observations	3,386	3,386	3,386	3,386
R <sup>2</sup>	0.0003	0.002		
Adjusted R <sup>2</sup>	-0.0003	-0.001		
Log Likelihood			-43.579	-40.488
Akaike Inf. Crit.			93.159	100.975
Residual Std. Error	0.042 (df = 3383)	0.042 (df = 3376)		
F Statistic	0.510 (df = 2; 3383)	0.635 (df = 9; 3376)		
<i>Note:</i>			*p<0.1; **p<0.05; ***p<0.01	

**Figure 31** Regression estimates using TCR180 for L users.