Heterogeneity in treatment effects of 'Call to action' using berry-2s method

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Altruistic group with number_referrals as target_variable

```
## Loading required package: randomForest
## randomForest 4.6-12
## Type rfNews() to see new features/changes/bug fixes.
##
## Attaching package: 'randomForest'
## The following object is masked from 'package:ggplot2':
##
## margin
```

	n	yval	p_value	path
135	12	0.5786869	0.0006468	lastday_purchase_all>=73.5,lastday_purchase_all< 110.5,money_spend_all< 46.96,num_purchase_all>=3.5
15	27	0.4301896	0.0000000	lastday_purchase_all< 15.5,num_purchase_all>=2.5,satisfied=1
143	15	0.3063540	0.0000000	$last day_purchase_all>=110.5, money_spend_all>=44.17, money_spend_all<46.98, NPS<4$
14	30	0.1144509	0.0000003	lastday_purchase_all< 15.5,num_purchase_all< 2.5,satisfied=1
5	164	0.0896790	0.0000000	lastday_purchase_all>=15.5,money_spend_all>=591
142	50	0.0673709	0.0000000	lastday_purchase_all>=110.5,money_spend_all< 44.17,NPS< 4
6	116	0.0540847	0.0000000	lastday_purchase_all< 15.5,satisfied=0
70	88	0.0356597	0.0000000	$last day_purchase_all>=110.5, money_spend_all>=46.98, money_spend_all<591, NPS<4$
9	6028	0.0176889	0.0000000	lastday_purchase_all>=15.5,lastday_purchase_all< 73.5,money_spend_all< 591
134	464	0.0135528	0.0000000	$last day_purchase_all >= 73.5, last day_purchase_all < 110.5, money_spend_all < 46.96, num_purchase_all >= 1.5, num_purchase_all < 3.5, num_purchase$
66	3692	0.0101742	0.0000000	$last day_purchase_all>=73.5, last day_purchase_all<110.5, money_spend_all>=46.96, money_spend_all<591, num_purchase_all>=1.5$
32	12650	0.0032370	0.0000000	lastday_purchase_all>=73.5,lastday_purchase_all< 110.5,money_spend_all< 591,num_purchase_all< 1.5
34	26	-0.0352640	0.0002010	lastday_purchase_all>=110.5,money_spend_all< 591,NPS>=4

Altruistic group with covertion_rate as target_variable

	n	yval	p_value	path
103	7	0.1272267	0.0302976	$last day_purchase_all < 103.5, money_spend_all >= 253.9, money_spend_all < 255.6, num_purchase_all < 15.5$
27	9	0.1196626	0.0092952	$last day_purchase_all < 36.5, money_spend_all >= 583.9, num_purchase_all < 15.5$
7	7	0.0911362	0.0323906	lastday_purchase_all< 103.5,num_purchase_all>=15.5
102	33	0.0081803	0.0007203	$last day_purchase_all < 103.5, money_spend_all >= 250, money_spend_all < 253.9, num_purchase_all < 15.5$
26	150	0.0081218	0.0000018	$last day_purchase_all >= 36.5, last day_purchase_all < 103.5, money_spend_all >= 583.9, num_purchase_all < 15.5, last day_purchase_all < 103.5, last day_all < $
50	758	0.0016738	0.0000000	$last day_purchase_all < 103.5, money_spend_all >= 255.6, money_spend_all < 583.9, num_purchase_all < 15.5$
11	1830	0.0000405	0.6650357	lastday_purchase_all>=103.5,NPS< 9.5,survey=0
24	20107	0.0000159	0.1205328	lastday_purchase_all< 103.5,money_spend_all< 250,num_purchase_all< 15.5
19	186	-0.0041558	0.0000000	$lastday_purchase_all>=104.5, money_spend_all>=45.29, NPS>=9.5$
21	96	-0.0082422	0.0000044	lastday_purchase_all>=104.5,NPS< 9.5,survey=1
41	13	-0.0292196	0.0000000	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 100.5, last day_purchase_all < 100.5, money_spend_all >= 50, NPS < 100.5, last day_purchase_all < 100.5, money_spend_all >= 50, NPS < 100.5, last day_purchase_all < 100.5, money_spend_all >= 50, NPS < 100.5, last day_purchase_all < 100.5, money_spend_all >= 50, NPS < 100.5, last day_purchase_all < 100.5, last day_all < 100.5,$
35	64	-0.0467495	0.0000000	lastday_purchase_all>=104.5,money_spend_all< 41.78,NPS>=9.5
18	49	-0.0580171	0.0000000	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all >= 45.29, NPS >= 9.5$
40	10	-0.0955653	0.0000314	$lastday_purchase_all >= 103.5, lastday_purchase_all < 104.5, money_spend_all < 50, NPS < 9.5, survey = 100.5, lastday_purchase_all < 104.5, money_spend_all < 104.5, lastday_purchase_all < 104.5, lastday_all < 104.5, lastday$
34	27	-0.1302758	0.0000000	$last day_purchase_all>=104.5, money_spend_all>=41.78, money_spend_all<45.29, NPS>=9.5$
16	16	-0.2180868	0.0000000	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all < 45.29, NPS >= 9.5$

Equitable group with number_referrals as $target_variable$

	n	yval	p_value	path
3	8	1.3502938	0.0024857	money_spend_all>=2211
287	11	0.5221587	0.0001732	$last day_purchase_all>=87.5, last day_purchase_all<90.5, money_spend_all>=29.46, money_spend_all<29.98, NPS>=7.5, last day_purchase_all<90.5, money_spend_all>=29.46, money_spend_all<29.98, NPS>=7.5, last day_purchase_all<90.5, money_spend_all>=29.46, money_spend_all<29.98, NPS>=7.5, last day_purchase_all<90.5, money_spend_all>=29.46, money_spend_all<90.5, money_spend_al$
23	7	0.4732582	0.0601850	lastday_purchase_all< 56.5,money_spend_all>=260.9,money_spend_all< 265.9
1135	15	0.4342112	0.0004301	$last day_purchase_all>=9.5, last day_purchase_all<44.5, money_spend_all>=37.98, money_spend_all<38.99, NPS>=7.5$
21	11	0.2641946	0.0000379	lastday_purchase_all>=56.5,money_spend_all>=260.9,money_spend_all< 262.8
2269	53	0.1697203	0.0000000	$last day_purchase_all>=40.5, last day_purchase_all<44.5, money_spend_all>=1.865, money_spend_all<37.98, NPS>=7.5$
22	132	0.1353779	0.0000000	lastday_purchase_all< 56.5,money_spend_all>=265.9,money_spend_all< 2211
286	41	0.0836441	0.0000011	$lastday_purchase_all>=87.5, lastday_purchase_all<90.5, money_spend_all<29.46, NPS>=7.5$
9	79	0.0826085	0.0000052	lastday_purchase_all< 9.5,money_spend_all< 260.9
142	289	0.0438322	0.0000000	$last day_purchase_all >= 87.5, last day_purchase_all < 90.5, money_spend_all >= 29.98, money_spend_all < 260.9, NPS >= 7.5, last day_purchase_all < 90.5, money_spend_all >= 29.98, money_spend_all < 260.9, NPS >= 7.5, last day_purchase_all < 90.5, money_spend_all >= 29.98, money_spend_all < 260.9, NPS >= 7.5, last day_purchase_all < 90.5, money_spend_all >= 29.98, money_spend_all < 260.9, NPS >= 7.5, last day_purchase_all < 90.5, money_spend_all >= 29.98, money_spend_all < 260.9, NPS >= 7.5, last day_purchase_all < 90.5, money_spend_all >= 29.98, money_spend_all < 260.9, NPS >= 7.5, last day_purchase_all < 90.5, money_spend_all < 90.5, money_spe$
2268	104	0.0355864	0.0000000	$last day_purchase_all>=9.5, last day_purchase_all<40.5, money_spend_all>=1.865, money_spend_all<37.98, NPS>=7.5$
566	407	0.0142505	0.0000000	$last day_purchase_all>=44.5, last day_purchase_all<87.5, money_spend_all>=1.865, money_spend_all<38.99, NPS>=7.5$
20	780	0.0138010	0.0000000	lastday_purchase_all>=56.5,money_spend_all>=262.8,money_spend_all< 2211
282	1329	0.0137495	0.0000000	$last day_purchase_all>=9.5, last day_purchase_all<87.5, money_spend_all>=38.99, money_spend_all<260.9, NPS>=7.5$
16	17831	0.0031665	0.0000000	lastday_purchase_all>=9.5,money_spend_all< 260.9,NPS< 7.5
34	2231	-0.0019472	0.0004099	$lastday_purchase_all>=90.5, money_spend_all<260.9, NPS>=7.5$
140	34	-0.0733906	0.0000001	$lastday_purchase_all >= 9.5, lastday_purchase_all <~87.5, money_spend_all <~1.865, NPS >= 7.5$

Equitable group with covertion_rate as target_variable

	n	yval	p_value	path
11	1830	0.0000346	0.0010981	lastday_purchase_all>=103.5,NPS< 9.5,survey=0
3	21071	-0.0000590	0.0000000	lastday_purchase_all< 103.5
21	96	-0.0059501	0.0000187	lastday_purchase_all>=104.5,NPS< 9.5,survey=1
19	186	-0.0060465	0.0000000	$lastday_purchase_all>=104.5, money_spend_all>=45.29, NPS>=9.5$
41	13	-0.0264653	0.0000001	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, money_spend_all >= 50, NPS < 9.5, survey = 100.5, last day_purchase_all < 104.5, last day_all < 104.5, last day_purchase_all < 104.5, last day_all < 104.5, last day_all < 104.5, last day_all < 104.5, last day_all < 10$
37	64	-0.0374326	0.0000000	lastday_purchase_all>=104.5,money_spend_all< 41.78,NPS>=9.5
17	49	-0.0694039	0.0000000	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all >= 45.49, NPS >= 9.5$
40	10	-0.0851231	0.0000370	$lastday_purchase_all >= 103.5, lastday_purchase_all < 104.5, money_spend_all < 50, NPS < 9.5, survey = 100.5, lastday_purchase_all < 104.5, money_spend_all < 104.5, lastday_purchase_all < 104.5, money_spend_all < 104.5, lastday_purchase_all < 104.5, lastday_all < 104.5, $
36	27	-0.1315647	0.0000000	$last day_purchase_all>=104.5, money_spend_all>=41.78, money_spend_all<45.29, NPS>=9.5$
16	16	-0.2356933	0.0000000	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all < 45.49, NPS >= 9.5$

Egoistic group with number_referrals as target_variable

	n	yval	p_value	path
359	12	0.1479160	0.1002175	$last day_purchase_all < 32, money_spend_all >= 38.37, money_spend_all < 348.6, NPS >= 8.5, NPS < 9.5$
355	17	0.1085988	0.0209563	lastday_purchase_all< 32.5,money_spend_all>=38.37,money_spend_all< 47.77,NPS>=9.5
47	63	0.0482755	0.0000047	lastday_purchase_all< 80.5,money_spend_all>=348.6,satisfied=1
7	8580	0.0022170	0.0000000	lastday_purchase_all>=82.5,money_spend_all>=57.95
358	111	-0.0010459	0.5569338	$last day_purchase_all >= 32, last day_purchase_all < 80.5, money_spend_all >= 38.37, money_spend_all < 348.6, NPS >= 8.5, NPS < 9.5, NPS < 9.$
45	2724	-0.0013030	0.0000008	lastday_purchase_all< 80.5,money_spend_all>=4.685,money_spend_all< 38.37
13	6135	-0.0014672	0.0000000	lastday_purchase_all>=82.5,money_spend_all< 57.95,NPS< 9.5
21	215	-0.0033594	0.0000000	lastday_purchase_all>=81.5,lastday_purchase_all< 82.5,money_spend_all>=4.685
178	3369	-0.0055734	0.0000000	lastday_purchase_all< 80.5,money_spend_all>=38.37,money_spend_all< 348.6,NPS< 8.5
25	781	-0.0070112	0.0000000	lastday_purchase_all>=82.5,lastday_purchase_all< 103.5,money_spend_all< 57.95,NPS>=9.5
46	85	-0.0084529	0.0305889	lastday_purchase_all< 80.5,money_spend_all>=348.6,satisfied=0
353	568	-0.0090480	0.0000000	$last day_purchase_all>=39.5, last day_purchase_all<80.5, money_spend_all>=38.37, money_spend_all<348.6, NPS>=9.5$
354	134	-0.0112755	0.0069562	lastday_purchase_all< 32.5,money_spend_all>=47.77,money_spend_all< 348.6,NPS>=9.5
9	63	-0.0169202	0.0000000	lastday_purchase_all< 82.5,money_spend_all< 4.685,NPS< 0.5
705	54	-0.0182804	0.0033715	$last day_purchase_all>=32.5, last day_purchase_all<39.5, money_spend_all>=38.37, money_spend_all<69.5, NPS>=9.5$

	n	yval	p_value	path
20	221	-0.0369137	0.0000000	lastday_purchase_all>=80.5,lastday_purchase_all< 81.5,money_spend_all>=4.685
49	121	-0.0391257	0.0000000	$lastday_purchase_all>=104.5, money_spend_all<57.95, NPS>=9.5$
8	37	-0.0939577	0.0000000	lastday_purchase_all< 82.5,money_spend_all< 4.685,NPS>=0.5
704	45	-0.0971686	0.0000000	$last day_purchase_all>=32.5, last day_purchase_all<39.5, money_spend_all>=69.5, money_spend_all<348.6, NPS>=9.5$
48	27	-0.1294338	0.0000000	$last day_purchase_all >= 103.5, last day_purchase_all < 104.5, money_spend_all < 57.95, NPS >= 9.5$

Egoistic group with covertion_rate as target_variable