## Relax Inc. User Adoption Predictors

<u>Background</u>: Relax Inc. wants to increase its ROI by understanding its user adoption rate and finding factors that might predict future adoption. This analysis is based on user logins for a two-year period (May 31, 2012 to June 6, 2014) and information on the 8,823 users corresponding to those logins.

Question 1: User adoption rate. The user adoption rate (defined as three or more logins in any 7-day period) was 18.8% (1,656 out of 8.823).

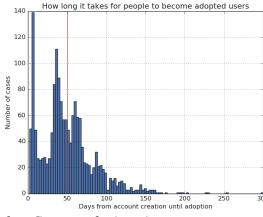
## Question 2: Predictors of user adoption.

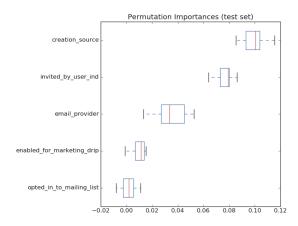
We considered five possible predictors or future user adoption: creation source, email provider (a proxy for geographic location?), mailing list opt-in, whether the user was invited by another user, and marketing drip. A random forest algorithm was used, with cross-validation.

Finding 1: Test accuracy was reasonable but not stellar (64%), given this relatively small set of predictors, with 40% of the adopted users recalled by these predictors. Finding 2: The <u>strongest predictors</u> were <u>creation source</u> (hobby users and by invitation), having an invitation from another user, and email provider (hotmail users most likely).

<u>Conclusion</u>: We found some moderate predictors of user status but they are of questionable actionable status. More predictors are needed to refine the model.

<u>Future work</u>: Future work might investigate cyclical effects and also the factors influencing early vs late adoption (the average adoption period is 50 days but there is some variation, see below).





## Other finer analytic points:

- 1. Censored data (n = 932) were removed, leaving final sample of 7.891 users.
- 2. Date-based variables were excluded to avoid data leakage.
- 3. 5-fold cross-validation was used, final hyper parameters (estimators = 5, features = 3)
- 4. Permutation test used for feature importance as less biased
- 5. Overfitting was avoided (typical of random forests)