# Predicting Love at First Sight

Lisa VanderVoort

### Pop culture is saturated with the idea of love at first sight.





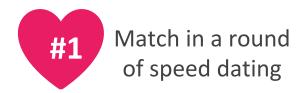


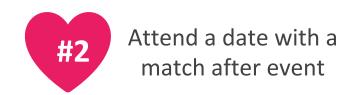
### **Love at First 4 Minutes**

<u>Data</u>: Speed Dating Experiment dataset from Kaggle

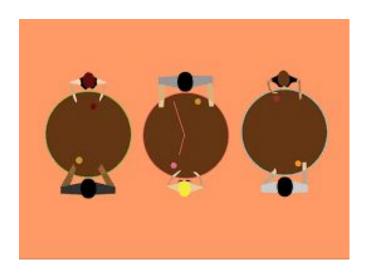
<u>Participant Information</u>: 551 Heterosexual men and women who attended 21 different speed dating events from 2002-2004

#### **Targets:**

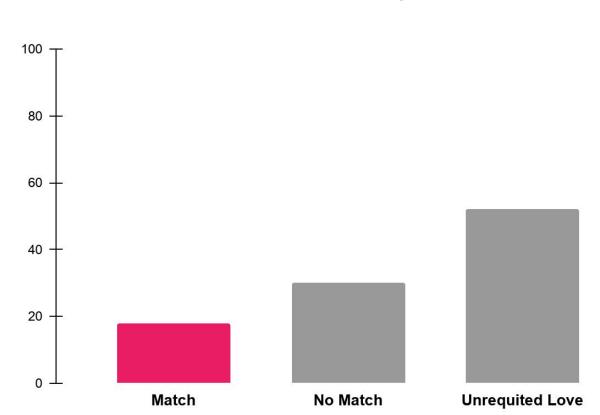




# Match in a Round of Speed Dating



### Of the 5,456 four-minute rounds, only 18% ended in a match.



# **Optimized Logistic Regression for ROC AUC (0.79)**

	4		2	
	1	2	3	4
Decision	yes	yes	yes	yes
Decision	no	no	no	no
	Attributes			
Attractive				
Sincere				
Intelligent				
Fun				
Ambitious				
Shared Interests/Hobbies				
Overall, how much do you like this				
person? (1=don't like at all, 10=like				
a lot)				
How probable do you think it is				
that this person will say 'yes' for				

you? (1=not probable, 10=extremely probable)

Feature
Engineering:
Sum of absolute
value of ratings
differences between
you and your
partner in a round

# Impact of the Features on a Match

Feature	Increase in score by	Change in Odds of Matching
Attractive	1.95 points	35% Increase
Fun	1.95 points	25% Increase
Shared Interests/Hobbies	2.15 points	28% Increase
Like	1.84 points	91% Increase
Sum of absolute values of ratings differences	7.52 points	47% Decrease

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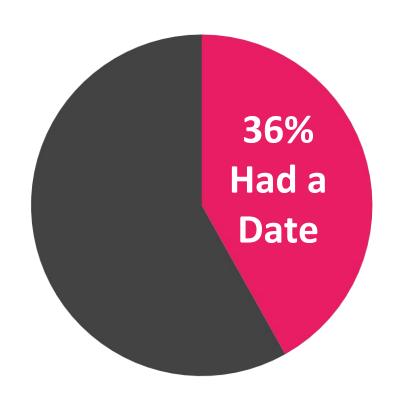
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1.84 points 91% Increase	
7.52 points	47% Decrease
	1.95 points 1.95 points 2.15 points 1.84 points

# Predicting a Date After Speed Dating



# **Much Smaller Sample Size**

223 out of the original
551 participants
completed a follow-up
survey about the speed
dating event.



#### Interests

- Sports
- Watching sports
- Exercise
- Dining out
- Museums/galleries
- **→** Art
- ☐ Hiking/camping
- ☐ Gaming
- Dancing/clubbing
- ☐ Reading
- Watching TV
- Theater
- Movies
- ☐ Going to concerts
- Music
- Shopping
- ☐ Yoga/meditation

li	nterests	Beliefs
Exer Dinin Mus Art Hikir Gam Danc Reac Wat Mov Goin Mus Shop	ching sports cise ng out eums/galleries ng/camping ning cing/clubbing ding ching TV ater vies ng to concerts	How important is it to you that a person you date be of the same racial/ethnic background? How important is it to you that a person you date be of the same religious background?

Interests	Beliefs	Lifestyle
□ Sports □ Watching sports □ Exercise □ Dining out □ Museums/galleries □ Art □ Hiking/camping □ Gaming □ Dancing/clubbing □ Reading □ Watching TV □ Theater □ Movies □ Going to concerts □ Music □ Shopping □ Yoga/meditation	<ul> <li>□ How important is it to you that a person you date be of the same racial/ethnic background?</li> <li>□ How important is it to you that a person you date be of the same religious background?</li> </ul>	<ul> <li>□ How frequently do you go on dates?</li> <li>□ How often do you go out (not necessarily on dates)?</li> </ul>

Interests	Beliefs	Lifestyle	Self Perception
□ Sports □ Watching sports □ Exercise □ Dining out □ Museums/galleries □ Art □ Hiking/camping □ Gaming □ Dancing/clubbing □ Reading □ Watching TV □ Theater □ Movies □ Going to concerts □ Music □ Shopping □ Yoga/meditation	<ul> <li>□ How important is it to you that a person you date be of the same racial/ethnic background?</li> <li>□ How important is it to you that a person you date be of the same religious background?</li> </ul>	<ul> <li>□ How frequently do you go on dates?</li> <li>□ How often do you go out (not necessarily on dates)?</li> </ul>	□ Sincere □ Intelligent □ Fun □ Attractive □ Ambitious □ # of matches expected to receive

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□ Sports □ Watching sports □ Exercise □ Dining out □ Museums/galleries □ Art □ Hiking/camping □ Gaming □ Dancing/clubbing □ Reading □ Watching TV □ Theater □ Movies □ Going to concerts □ Music □ Shopping □ Yoga/meditation	<ul> <li>□ How important is it to you that a person you date be of the same racial/ethnic background?</li> <li>□ How important is it to you that a person you date be of the same religious background?</li> </ul>	<ul> <li>□ How frequently do you go on dates?</li> <li>□ How often do you go out (not necessarily on dates)?</li> </ul>	☐ Sincere ☐ Intelligent ☐ Fun ☐ Attractive ☐ Ambitious ☐ # of matches expected to receive

# Feature engineering provided improved optimization of ROC AUC (0.65) for Random Forest Model.

#### **Original Questions**

- Race Importance
- Religious
  Importance
- Match Estimates
- Self Sincere
- ☐ Self Intelligent



TV Oriented Activities	Culture Activities	Social Activities	Active Activities
TV + TV Sports + Gaming	Museums + Art + Reading + Theater + Music	Clubbing + Dining + Concerts	Sports + Exercise + Hiking + Yoga

Sociableness Confidence		Race Squared
Date Frequency + Going Out Frequency	Self Intelligent + Self Attractive + Self Fun	(Race Importance) <sup>2</sup>

# **Most Impactful Features**

Rated Lower	Rated Higher
TV Oriented Activities Culture Activities Race Importance	Active Activities Confidence

# Let's see if Ruth will have a date!



#### **Conclusions**

- Predicting human behavior around love and attraction is complex
- First impressions make a difference!
  - The more similar yours and a date's perception of each other, the greater the odds of matching
  - The more you initially like a person, the greater the odds of matching are
- Confidence and physical activity can have a positive impact on getting a follow-up date after a speed dating event

# Questions?

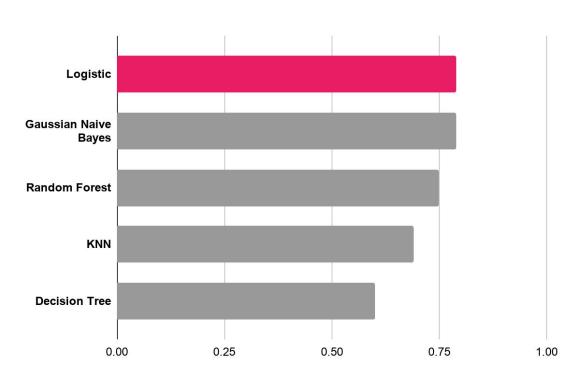
# Appendix

# **Participant Scorecard**

	1	2	3	4
Decision	yes	yes	yes	yes
Decision	no	no	no	no
	Attributes	•		
Attractive				
Sincere				
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Overall, how much do you like this				
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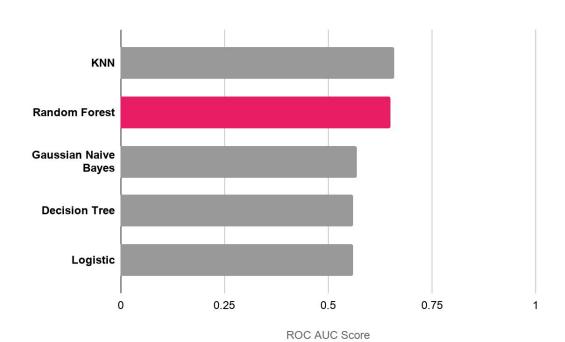
Participants rated each date on the following attributes on a scale of 1 (awful) to 10 (great).

# Match in a Round of Speed Dating



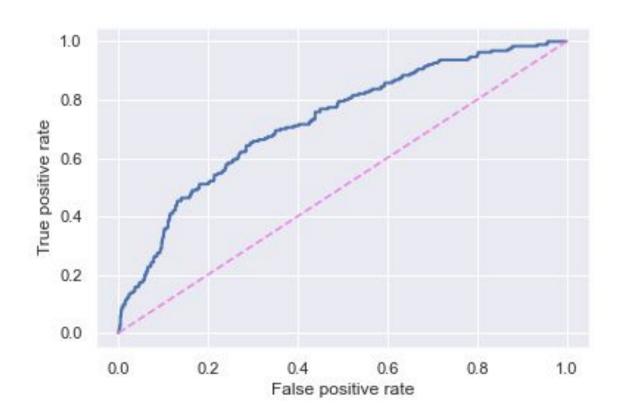
Logistic Regression was chosen for optimizing ROC AUC score (pictured) and still maintaining accuracy (84%) compared to Gaussian Naive Bayes.

#### **Attend a Date with a Match After Event**



Random Forest was chosen for nearly optimizing ROC AUC score (0.01 less than KNN), maintained higher accuracy (56%) as compared to KNN.

# **Optimized Logistic Regression for ROC AUC (0.79)**

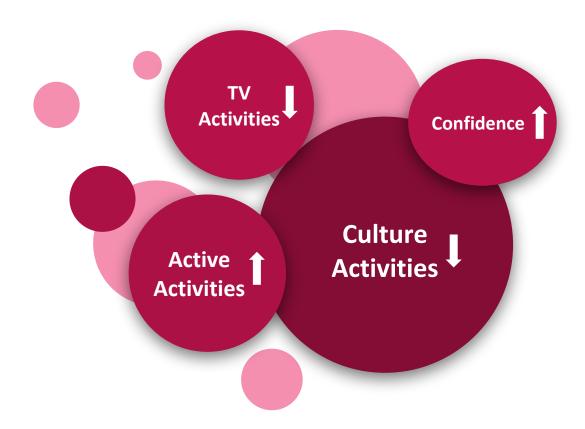


# Higher interest/importance/frequency mean...

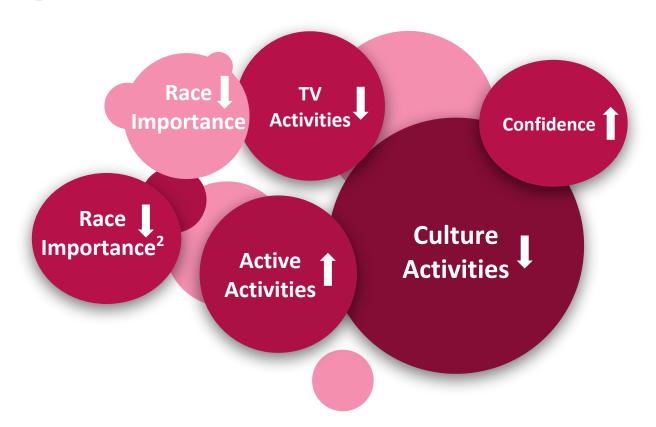
Less likely to match	More likely to match
TV Oriented Activities Culture Activities Social Activities Religious Importance Race Importance Race Importance	Active Activities Match Estimate Confidence Self Sincere Self Intelligent Sociableness**

<sup>\*\*</sup>The scale for Date Frequency and Going Out Frequency was out of 7 and a higher score indicated less frequency.

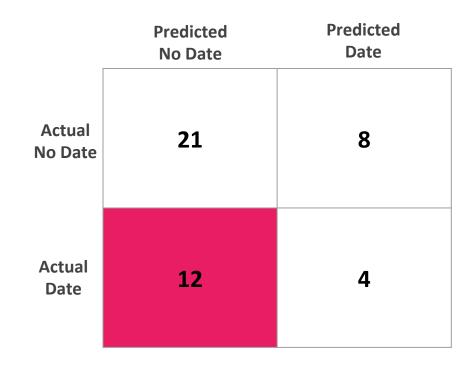
# **Most Impactful Features**



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## **Confusion Matrix Shows Limitations of Small Sample Size**



# **Most Impactful Features**

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Less likely to match	More likely to match
TV Oriented Activities  Culture Activities	Active Activities Confidence