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## THE TEAM



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## **MOTIVATION**





### **Decision-Making Tools in Personal Settings**

Decision-making analysis is not limited to complex industries, but open to personal settings too. We want to explore that link.

### Making a Tool for Everyone

We want to incorporate technical decision-making tools into everyday non-technical lives.

### **PURPOSE**

We aim to better understand how one's priorities affect the decisions they would make in our posed romantic relationship contexts of various complexities.



What factors drive decision-making in relationships? How does this change as the situation becomes more complex?



Is it possible to illustrate an individual's values in certain romantic contexts using a numerical model and produce an accurate and "effective" predictor of their response in these situations?



To what extent should this model be incorporated into our romantic lives?



## **GOALS**









#### **Moral Value**

Analyze which and how much different priorities factor into an individual's decisions in the posed romantic scenarios.

#### **Performance**

Evaluate how well a mathematical model captures the factors that impact decision-making in the posed romantic scenarios.

### Accuracy

Evaluate the effectiveness of the designed model in predicting the likelihood of an individual choosing certain alternatives within a decision.

## **Application**

Explore whether people should depend on decision-making tools and models when faced with decisions in romantic relationships.

## **METHODOLOGY**

## **CASE STUDY**

Case study of human response and decision-making in situations common in romantic relationships: maintenance of long-distance relationships, communication in those relationships, and decisions regarding marriage.



STEP 1



STEP 2



STEP 3

#### Large-Scale Survey

Understand what decisions an individual will make given a decision context and a set of priorities. The survey collects data on individual rankings of priorities in addition to the decision that one makes in response to that context.

#### **Model Training**

Use a subset of the data as a training set to generate a logit model as our decision-making tool in this project. The ranked priorities in each scenario serve as the independent predictor variables, with strong variables chosen as features in the final model.

#### **Analysis of Results**

Apply the model on the test set and analyze the predictions generated to gain insight into the effectiveness and accuracy of our model in capturing the psychological decision-making process mathematically.

## **SURVEY GENERATION**

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#### **Format**

- **O1.** Provide decision context
- **Q2.** Have the individual assign values to a set of given preferences
- **03.** Provide potential outcomes
- **04.** Have the individual choose a decision from a given list

## Scenario 1: Long Distance

#### **Priorities**

- Commitment to your relationship
- Physical distance to your partner
- Your career
- Partner's career

#### **Decisions**

- Commit
- Break up

## Scenario 2: Communication

Presented 3 scenarios, each building off the previous in complexity

#### **Additional Priorities**

- Communication
- Your time
- Partner's time
- Sense of security in your relationship
- Will to compromise with your partner

#### **Decisions**

- Pause communication
- Break up
- Suggest compromise

## Scenario 3: Marriage

#### **Additional Priorities**

- Your family's/friends' satisfaction
- Your personal desire to get married

#### **Decisions**

- Suggest the idea of marriage
- Don't bring up the idea of marriage
- Subtly hint at the idea of marriage
- Break up

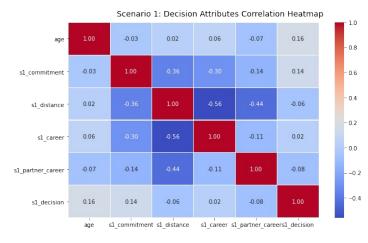
## **SURVEY DATA PROCESSING**

84 responses total, with the majority in the age range of 18-24

- Individuals ranked each priority on a scale from 0 to 10, with 0 being not important and 10 being extremely important
- To effectively compare rankings between individuals, we normalized the data so that the sum of each individual's rankings equals 100
  - Assumes that individual preferences follow the von Neumann–Morgenstern axioms of orderability, transitivity, and independence: individuals can order/rank their priorities that follow the VNM axioms and priorities are assumed to be independent of each other

IEOR 166 Survey: Relationship Hypotheticals											
Please help us better understand the psychological decision process for romantic relationships by answering the following questions as truthfully as possible. This form will be filled out anonymously.											
Please assign	a numb	er 0-10	for each	priorit	y. <b>*</b>						
	0	1	2	3	4	5	6	7	8		
Your commitment to your relationship with your partner				the	alterna	tives b	elow, v	vhat wo	ould yo	his scenario. Given these outcomes and u choose to do? the following):	
Your physical distance to your partner				locat 2. Yo	You both continue to commit to your relationship; your partner continues to stay in their current location with no prospected time of returning; you both are still very happy     You continue to commit to your relationship, but soon experience a gradually increasing drift between the two of you and perhaps a slight decrease in the amount of trust between you two. However, no						
Your career				mention of breaking up by either individual yet.  3. You both break up and move on individually							
Your											
partner's career				Woo		e to con		the relati th your p			

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#### Scenario 2: Decision Attributes Correlation Heatman

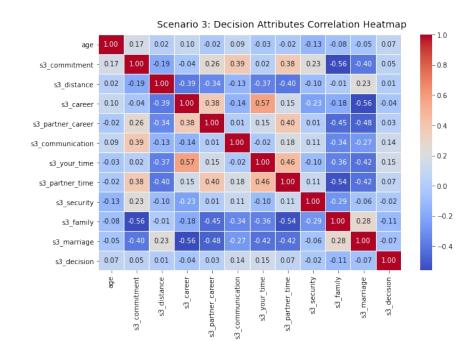
-04

- 0.2

-0.2

	Scenario 2: Decision Attributes Correlation Heatr						eatma				
age ·	1.00	0.18	-0.01	0.08	-0.10	0.10	-0.04	-0:08	-0.10	-0.10	
s2_commitment	0.18	1.00		-0.32		0.20	-0.31	-0.03	-0.02	0.00	
s2_distance	-0.01	-0.20	1.00	-0.28	-0.20	-0.06	-0.13	-0.33	-0.09	-0.36	0.12
s2_career	0.08	-0.32	-0.28	1.00	0.03	-0.35	0.48	-0.19	-0.26	-0.23	-0.07
s2_partner_career	-0.10		-0.20	0.03	1.00	-0.30	-0.23	0.24	-0.26	0.02	
s2_communication	0.10	0.20	-0.06	-0.35	-0.30	1.00	-0.37	-0.19	0.06	-0.10	0.17
s2_your_time	-0.04	-0.31	-0.13	0.48	-0.23	-0.37	1.00	-0.00	-0.27	-0.15	-0.07
s2_partner_time	-0.08	-0.03	-0.33	-0.19	0.24		-0.00	1.00	-0.12	0.16	
s2_security	-0.10	-0.02	-0.09	-0.26	-0.26	0.06	-0.27	-0.12	1.00	0.12	0.07
s2_compromise	-0.10	0.00	-0.36	-0.23	0.02	-0.10		0.16	0.12	1.00	-0.10
s2_decision	-0.10		0.12	-0.07		0.17	-0.07	-0.08	0.07	-0.10	1.00
	age -	2_commitment -	s2_distance	s2_career -	partner_career -	communication -	s2_your_time -	2_partner_time -	s2_security -	s2_compromise -	s2_decision

# **EXPLORATORY DATA ANALYSIS**



## LOGIT MODEL TRAINING

- → Linear combination of individual's value for each priority resembles one's subjective utility function
- → Predictions of likelihood are nicely interpretable

#### For each scenario:



#### Train / Test Split

- Split 80% of the data for training, 20% for testing
- Randomly split the data while keeping the proportion of each class the same in both sets



#### **Data Balancing**

- Heavy class imbalance
- Tried several methods of data balancing, including adjusting weights and oversampling



#### **Cross-Validation**

- Prevent overfitting to the training data
- Used 5-fold cross-validation to select best features

# FINAL MODELS

## Scenario 1: Long Distance

#### **Data Balancing**

Random OverSampler

#### **Features**

- Age
- Commitment to your relationship
- Physical distance to your partner
- Your career
- Partner's career

## Scenario 2: Communication

#### **Data Balancing**

SMOTE

#### **Features**

- Age
- Commitment to your relationship
- Physical distance to your partner
- Communication
- Partner's time
- Sense of security in your relationship
- Will to compromise with your partner

## Scenario 3: Marriage

#### **Data Balancing**

SMOTE

#### **Features**

- Age
- Communication
- Your time
- Partner's time
- Your family's/friends' satisfaction
- Your personal desire to get married

## **RESULTS**

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## **SCENARIO 1**

92% **Continue to** commit to the relationship VS

8%
Suggest to
break-up with
your partner

For every 1 unit increase in value of a feature/priority, the odds of...

Features / Priorities	Continuing to Commit to the Relationship vs. Breaking Up
Age	1.16
Commitment to the Relationship	1.03
Physical proximity / distance to partner	0.92
Your career	1.07
Your partner's career	0.86

## **SCENARIO 2**

temporarily 29%
pause
communication
with each other

58%

suggest communicating less than before

**VS** 

VS
13%
Suggest to break-up
with your partner

For every 1 unit increase in value of a feature/priority, the odds of...

Features / Priorities	Temporarily Pause Communication	Suggest Communicating Less	Suggest to Break-up
Age	1.37	1.47	0.49
Commitment to the Relationship	1.02	1.15	0.85
Physical proximity / distance to partner	0.95	0.89	1.18
Communication	0.66	0.74	2.06
Your partner's time	1.67	1.76	0.34
Your sense of security in the relationship	0.94	0.91	1.17
Your will to compromise with your partner	1	0.83	1.21



Suggest 24%
marriage to
your
partner

Dismiss 28% family's/ friends' concerns

VS

Hint at Marriage to Partner

Suggest to break-up with your partner

### For every 1 unit increase in value of a feature/priority, the odds of...

Features / Priorities	Suggest marriage to your partner	Dismiss family/friend suggestions of marriage	Hint at Marriage to Your Partner	Suggest to Break-up & Move on
Age	1.07	0.91	1.11	0.92
Communication	0.95	0.82	0.86	1.48
Your time	0.48	0.92	0.77	2.93
Your partner's time	1.76	1.39	1.41	0.29
Your family's/friends' satisfaction	1.13	1.33	1.11	0.60
Your desire to get married	1.1	0.71	0.96	1.33

# HOW "ACCURATE" IS THE MODEL IN MAKING PREDICTIONS?

## SCENARIO 1: STAY VS BREAKUP

5 PRIORITIES: Age, Commitment, Distance, Your Career, Your Partner's Career

67%

## SCENARIO 2: PAUSE CONTACT, TALK LESS, OR BREAKUP

10 → 7 PRIORITIES: Communication, Security, Compromise...

**55%** 

## SCENARIO 3: MARRIAGE? NO MARRIAGE? BREAKUP?

11 → 6 PRIORITIES: Family & Friends Concern, Desire to Marry...

44%

# IMPLICATIONS AND LIMITATIONS

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## **IMPLICATIONS**

Contextualizing the final model



#### Effectiveness

Is the model an effective predictor?

- Accurate
   identification of
   relationship
   priorities and
   correlation with
   decision.
- Generally accurate decision results



## Usability

Should this model be used for rational decision-making in relationships like those posed?

- Utilized as a reference for decision-making, rather than an ultimatum
- Mechanizes the human-human relationship aspect in romance



#### **Qualitative Analysis**

As a whole, how does societal decision trend change as the complexity of the situation increases?

 In our findings, society tends to choose alternatives that allow them to maintain their relationship rather than splitting despite additional concerns.

## **LIMITATIONS**

External Factors: additional factors or priorities not encompassed by the survey (such as time and intimacy levels) could have acted as confounders in decision-making

- Small Sample Size: not enough data points sampled and unbalanced across classes, which impacted model accuracy
- Generalization: scenarios may not be representative of all common relationship scenarios or have the capacity to test all individual values
- Age Range Restrictions: due to time constraints and nature of data collection, we were only able to sample from a population of individuals aged 18-24









**Implications & Limitations** 

•	Is it possible to create
	a simple and effective
	mathematical model
	based on individual
	values as utilities to
	predict psychological
	decision-making in
	certain romantic

scenarios?

Objective

Surveyed 84 people

Methodology

- Analyzed how the rankings of priorities affect the decision individuals make in 3 increasingly complex scenarios
- Used rankings as a utility measure and assumed individuals followed VNM axioms.

As the complexity of our scenarios increases, the accuracy decreases

Results

- However, we do see that the model captures many psychological intuitions.
- Analysis shows that modeling romantic decisions in this form generally yield accurate results and may be a good tool to aid romantic decision-making
- Limitations include small sample size, inaccurate generalizations, lack of diversity in age ranges, and additional external factors unaccounted for in the data.





#### **Relationship Decision-Making Cannot be Standardized**

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Rational relationship decision models need personalized prediction, rather than standardized prediction



#### **Dynamic Situations Affect Individual Priorities**

Relationship priorities are not constant, but rather change depending on the situation, and algorithms need to account for that



#### **Visible Correlation Between Decisions and Priorities**

As complexities grow among relationship decisions, more factors come into consideration that affect decisions



#### **Algorithms Can Integrate Personalized Rationality**

Models can be built based on an individual's priorities to give personalized predictions and direction towards rational decision-making

# FUTURE APPLICATIONS



#### **Data Collection**

- Larger, More Diverse
   Sample Size
- 2. Core Features For Each Decision
- 3. More Scenarios Included



### Model

- 1. Decision Trees
- 2. Probit Model
- 3. Hyperparameters



## **Hybrid Approach**

- Perspective of Relationship Experts/Therapists
- 2. Hybrid Tech Potential

# Thank you!

