Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Dartmouth Mathematics REU

Sissi Chen 1 Ru Yin Hing 2 Chi Zhang 3

¹Department of Mathematics, Applied Mathematics and Statistics Case Western Reserve University

> ²Department of Mathematics The University of Texas at Arlington

³Department of Mathematics and Computer Science University of Wisconsin-Madison

> Dartmouth College August 8th, 2018

> > ▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

Outline

◆□▶ ◆□▶ ◆□▶ ◆□▶ ●□

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

1 Project Overview

2 Insurance Fraud Model

Methods and Results Discussion Summary

3 Trading Model Methods

> Results and Discussion Summary

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Do you know how much money insurance fraud steals from the insurance industry every year?



Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Over 80 Billion Dollars!

(That's worth 50,031,269.54 MacBooks)



Objectives

Models Sissi Chen, Ru Yin Hing, Chi Zhang

Investigating the Impact of

Honesty in Insurance and Trading Using Game Theory

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

We would like to build a mathematical system to better enforce honesty in the society

- Insurance fraud model: to investigate the fraudulent or honest behavior of policy holders regarding the change of the policy holders' claim amount or profit amount
- Trading model: to observe the behavior of investees with the enforcement of investment rules regarding honesty

Outline

イロト 不得 トイヨト イヨト

3

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Project Overview

Insurance Fraud Model Methods and Results

Discussion Summary

3 Trading Model Methods

Results and Discussion

Payoff Matrix

(日)、

э

Models Sissi Chen, Ru Yin Hing, Chi Zhang

Investigating the Impact of

Honesty in Insurance and Trading Using Game Theory

Project Overview

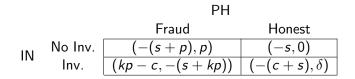
Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited



(IN: Insurance Company, PH: Policyholder)

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

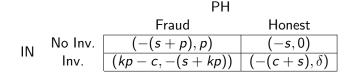
Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Model and Notations



- S: honest claim amount of PH
- P: potential profit of PH if PH commits fraud
- C: cost of each secondary investigation of IN
- K: percentage on potential net fraud profit (P), which represents fine on fraudulence PH if IN realizes the fraud
- $\delta:$ benefit for PH, if IN carries out deep investigation and realizes PH is honest

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Nash Equilibrium Point

From replicator equations:

$$\dot{x}_i = x_i((Ay)_i - x \cdot Ay), i = 0, ..., n$$

 $\dot{y}_j = y_j((Bx)_j - y \cdot Bx), j = 0, ..., m$

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Nash Equilibrium Point

From replicator equations:

$$\dot{x}_i = x_i((Ay)_i - x \cdot Ay), i = 0, ..., n$$

 $\dot{y}_j = y_j((Bx)_j - y \cdot Bx), j = 0, ..., m$

x1 represents the probability that IN does not investigate

y1 represents the probability that PH tends to fraud

We obtain the equilibrium point by setting change in speed to 0:

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Nash Equilibrium Point

$$x_1 = \frac{kp + s + \delta s}{p + kp + s + \delta s}$$
$$y_1 = \frac{c}{p + kp + s}$$

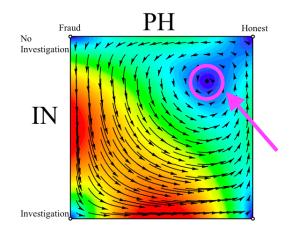
x1 represents the probability that IN does not investigate

y1 represents the probability that PH tends to fraud

Dynamo 2x2

・ロト ・ 理 ト ・ ヨ ト ・ ヨ ト

э



Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

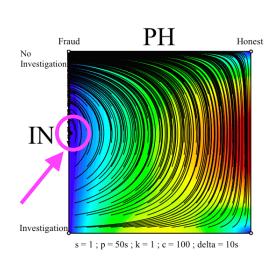
Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited



Dynamo 2x2 Nonideal

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ ─臣 ─ のへで

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

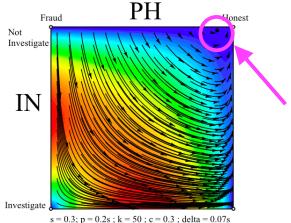
Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Dynamo 2x2 Ideal



◆□▶ ◆□▶ ◆臣▶ ◆臣▶ ─臣 ─のへで

Outline

イロト 不得 トイヨト イヨト

3

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion

Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Project Overview

Insurance Fraud Model Methods and Results Discussion

Summary

3 Trading Model Methods

> Results and Discussion Summary

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results

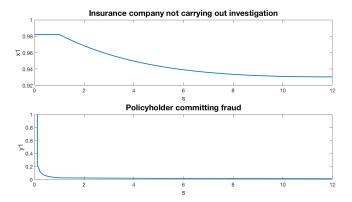
Discussion

Trading Model

Methods Results and Discussion Summary

Works Cited

Nash Equilibrium with Change in S



(日)、

э

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results

Discussion

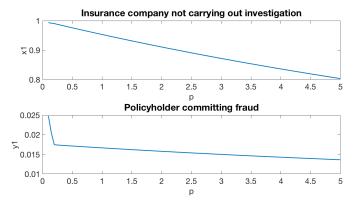
Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Nash Equilibrium with Change in P



(日)、

э

Outline

イロト 不得 トイヨト イヨト

3

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Project Overview

2 Insurance Fraud Model Methods and Results

Discussion

Summary

3 Trading Model

Results and Discussion Summary

Summary

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

Models Sissi Chen, Ru Yin Hing, Chi Zhang

Investigating the Impact of

Honesty in Insurance and Trading Using Game Theory

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

- Dishonesty tend to happen when the claim amount is small
- With the model, insurance companies can change the relevant parameters to minimize loss from insurance fraud

Outline

イロト 不得 トイヨト イヨト

3

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Project Overview

Insurance Fraud Model

Discussion

Summary

3 Trading Model Methods

Results and Discussion Summary

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods

Results and Discussion Summary

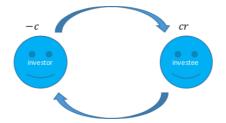
Works Cited

Basic Trust Game

・ロト ・ 理 ト ・ ヨ ト ・ ヨ ト

3

Investor decides whether or not invest



Investee decides whether or not pay back any amount to the investor

🔋 Fu, Feng

Overview and Introduction to Behavioral Analytics. MATH 76 Lecture, 2018.

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods

Results and Discussion Summary

Works Cited

Model and Game Rules Players

Investor decides whether or not to invest and the amount to invest in each investee



・ロト ・ 理 ト ・ ヨ ト ・ ヨ ト

3

Each investee decides the percentage of revenue generated that they want to return

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods

Results and Discussion Summary

Works Cited

Model and Game Rules Notations

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

- Wealth generating ability: fixed for each investee
- Flexibility: fixed for each investee
- Honesty: adjusted after every round based on investee behavior in the previous round
- Investor bank account: result
- Investee bank account: result

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods

Results and Discussion Summary

Works Cited

Model and Game Rules

Rules for Assigning Honesty Scores

- Each investee starts with a perfect honesty score
- If an investee chooses to be honest and returns promised percentage, their honesty score is not affected
- If an investee chooses to be dishonest and returns less than promised percentage, their honesty score decreases based on amount of dishonesty

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods

Results and Discussion Summary

Works Cited

Model and Game Rules

Investor's Rules for Investment

- After every round, the investor ranks investees based on the amount investees return
- The higher ranked investees, who return more to the investor, receive more investment from the investor in the next round
- If an investee has low honesty score, the investor can choose to decrease the investment amount or not invest, based on how low the honesty score is

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods

Results and Discussion Summary

Works Cited

Model and Game Rules

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

Investees' Rules for Changing Strategies

- After every round, each investee decides whether they want to copy the winning strategy from the last round
- Investees with higher flexibility scores copy the winning strategy more often than those with lower flexibility scores

Outline

イロト 不得 トイヨト イヨト

3

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Project Overview

Insurance Fraud Model Methods and Results

Discussion

Summary

3 Trading Model Methods Results and Discussion Summary

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

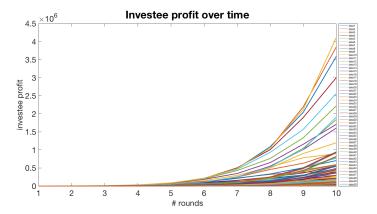
Trading Model

Methods Results and Discussion Summary

Works Cited

When every investee is at least slightly flexible...

After 9 rounds, every investee decides to be dishonest



◆□▶ ◆□▶ ◆臣▶ ◆臣▶ ○臣 - の々ぐ

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

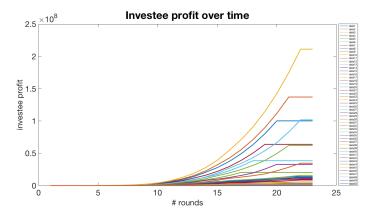
Trading Model

Methods Results and Discussion Summary

Works Cited

When every investee is at least slightly flexible...

After 22 rounds, the game cannot go on anymore



◆□> ◆□> ◆目> ◆目> ◆目 ● のへで

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

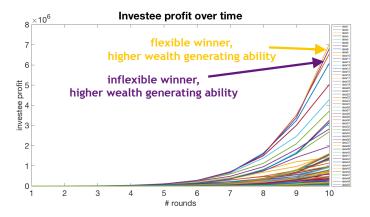
Works Cited

When inflexible investees are

present...

(日)、

After 9 rounds, every flexible investee decides to be dishonest



Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

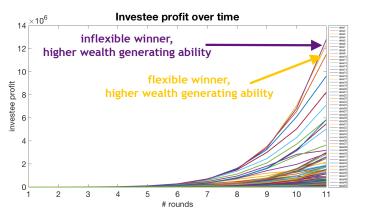
Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

When inflexible investees are present... After 11 rounds, flexible investees start to be honest again



(日)、

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

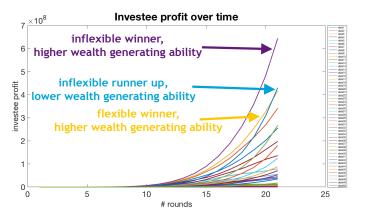
When inflexible investees are

present...

・ロト ・ 雪 ト ・ ヨ ト

э

After 20 rounds, all investees go back to being honest and stay honest



Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

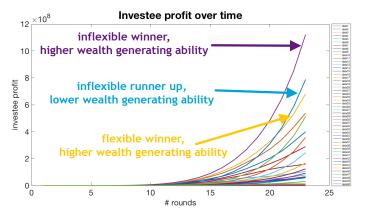
Trading Model

Methods Results and Discussion Summary

Works Cited

When inflexible investees are present...

After 22 rounds, the game is still going on



◆□ > ◆□ > ◆豆 > ◆豆 > ̄豆 = のへで

Outline

イロト 不得 トイヨト イヨト

э.

Investigating the Impact of Honesty in Insurance and Trading Using Game Theory Models

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Project Overview

Insurance Fraud Model Methods and Results

Discussion

Summary

3 Trading Model

Results and Discussion

Summary

Summary

Models Sissi Chen, Ru Yin Hing, Chi Zhang

Investigating the Impact of

Honesty in Insurance and Trading Using Game Theory

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

- Honesty is essential for the success of a society
- In the short term, dishonesty may result in more profit
- However, in the long term, honesty is important, sometimes more important than wealth generating ability, to stay successful in the competition

Future Studies

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

Trading Using Game Theory Models Sissi Chen, Ru Yin Hing, Chi

Zhang

Investigating the Impact of

Honesty in Insurance and

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

- Build honesty bots that stays perfectly honest all the time to enforce honesty in the society
- Combine the trading model with the insurance fraud model to find out how a credit system may affect the dynamics of the insurance fraud model

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

Acknowledgements

イロト 不得 トイヨト イヨト

3

We would like to thank those who helped us

- Dr. Feng Fu
- Dr. Anne Gelb
- Matt Jones
- Tracy Moloney
- Fellow REU students
 - Aaron Alphonsus
 - Adam Baldoni
 - Mariah Boudreau
 - Javier Salazar
 - Carley Walker

Sissi Chen, Ru Yin Hing, Chi Zhang

Methods and

Works Cited

Manapata, Michael L.; Nowaka, Martin A.; Rand, David G.

Bibliography I

Information, irrationality, and the evolution of trust. Journal of Economic Behavior and Organization, 2012.

Morah. Chizoba

Do You Need Casualty Insurance?. Investopedia, 2018.

Myerson, Roger B. Game Theory: Analysis of Conflict. Harvard University Press, 1991.



📎 Nowak, M. A; Coakley, Sarah Evolution, games, and God : the principle of cooperation. Harvard University Press, 2013.

Bibliography II

Staff Writer

Models Sissi Chen, Ru Yin Hing, Chi Zhang

Investigating the Impact of

Honesty in Insurance and Trading Using Game Theory

Methods and

Works Cited

Background on: Insurance fraud. Insurance Information Institute, November 6, 2017.

Staff Writer

By the numbers: fraud statistics. Coalition Against Insurance Fraud, 2018.

Staff Writer

What is 'Insurance'. Investopedia, 2018.

Staff Writer

10 Most Common Types of Insurance Fraud. Business Insurance Quotes, 2011.

Unknown

Bimatrix Games.

Assumptions

Honesty in Insurance and Trading Using Game Theory Models

Investigating the Impact of

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

- Single shot game for two players, the insurance company (IN) and the policyholder (PH)
- Construct the payoff matrix from PH perspective
- IN carries out basic investigations for every claim with negligible cost before secondary investigations
- IN will and only will realize fraud of PH by carrying out secondary deep investigations
- PH profit is 0 if they only receive honest claim amount
- All profits and costs can be converted to the same unit (USD)

Game Theory

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

Honesty in Insurance and Trading Using Game Theory Models

Investigating the Impact of

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion Summary

Trading Model

Methods Results and Discussion Summary

Works Cited

The study of Mathematical models of conflict and cooperation between intelligent rational decision-makers.

Myerson, Roger B.

Game Theory: Analysis of Conflict. Harvard University Press, 1991.

Sissi Chen, Ru Yin Hing, Chi Zhang

Project Overview

Insurance Fraud Mode

Methods and Results Discussion

Trading Model

Methods Results and Discussion Summary

Works Cited

Bimatrix Game

Player 2

The values of payoff functions can be described by a bimatrix:

	Strategy	t_1	t_2	 t_n
	s_1	(a_{11}, b_{11})	(a_{12}, b_{12})	 (a_{1n}, b_{1n})
Player 1	s_2	(a_{21}, b_{21})	(a_{22}, b_{22})	 (a_{2n}, b_{2n})
	:			
	s_m	(a_{m1}, b_{m1})	(a_{m2}, b_{m2})	 (a_{mn}, b_{mn})

The values of payoff functions can be given separately for particular players:

$$A = \begin{pmatrix} a_{11} & a_{12} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2n} \\ \dots & \dots & \dots & \dots \\ a_{m1} & a_{m2} & \dots & a_{mn} \end{pmatrix}, \qquad B = \begin{pmatrix} b_{11} & b_{12} & \dots & b_{1n} \\ b_{21} & b_{22} & \dots & b_{2n} \\ \dots & \dots & \dots & \dots \\ b_{m1} & b_{m2} & \dots & b_{mn} \end{pmatrix}$$

