

# **Modeling Social Interactions Between Households For Evacuation Behaviors In The Devasted Areas**

September 22<sup>nd</sup>, 2013

The University of TOKYO

Doctoral course Junji URATA

# What is Social Interactions?

Social Interactions' examples are

## In Daily Lives

- Drop and pick someone up
- Make joint purchase
- Patrol in neighborhood

## In Disasters

- Evacuate with others
- Rescue
- Exchange Information

Social interactions help vulnerable traffic users in their daily lives  
Social interactions help people who can not evacuate on their own

### **Objective:**

**Modeling the mechanism of making social interactions**

**Making to plan to evacuate quickly by group interactions**

# What are problems?

## **Problem1 : Why do people make social interactions?**

people take rational behaviors

→ choice their behaviors by depending on only their gain

**BUT**

choice their behavior for others

→helpers' utilities include helped people's losses

→Other-Regarding Preference

# What are problems?

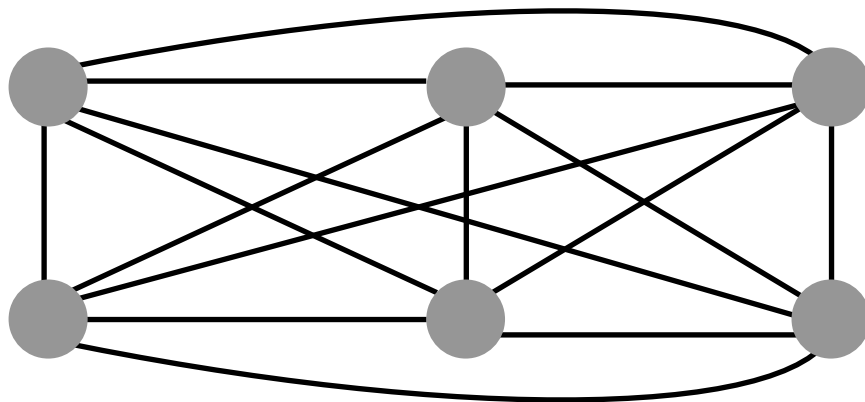
**Problem2 : Who people make social interactions for?**

Social interactions pairs are made by one-to-one pairing

**BUT**

- if there are  $n$  people, the number of pairs is  $n(n-1)/2$
- choice model of pairs have huge choice set
- choice sets composed candidate pairs should be limited

→ Choice set generation



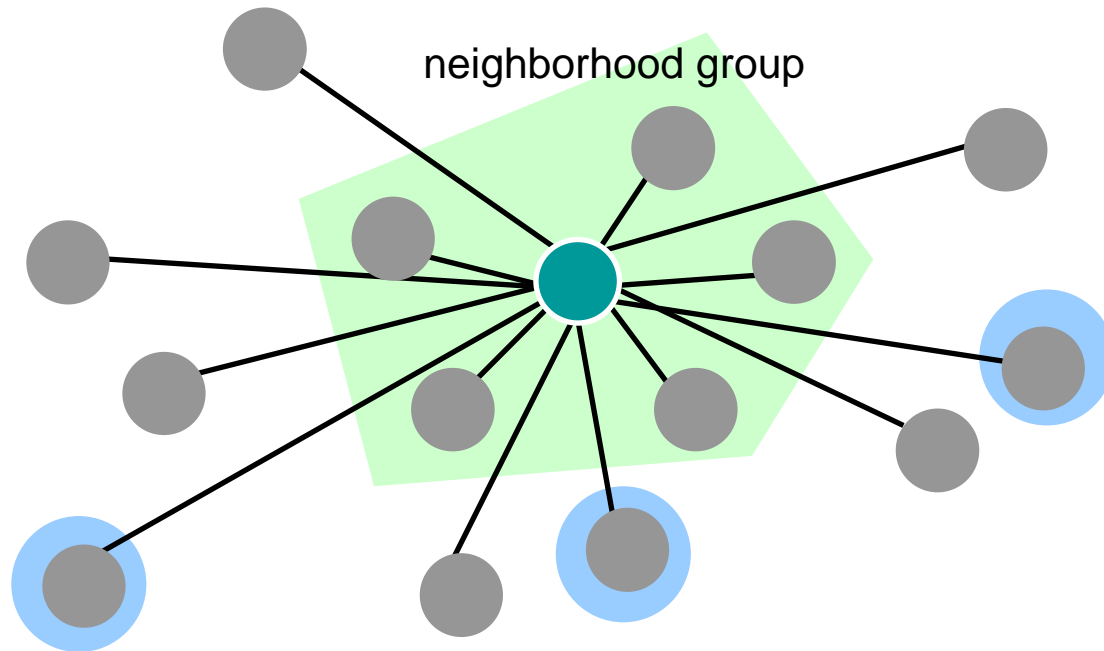
6 people

→ 15 pairs

# Making social interactions in group

## Choice set generation problem

- form a pair of 2 people in all members



### Algorithm of Choice set generation

Target all group members



- Target all **neighborhood** group members (familiarity members)
- Target **easy recognition** member outside neighborhood members

non-compensatory choice set generation  
**using influence of familiarity and recognition**

# One-to-One pairs' utility

## Other-Regarding Preference problem

### **Definition of Other-Regarding Preference**

by experimental economics (Fehr and Schmidt(1999))

Disutility as the difference of the gain of the opponent and gain their own

$$u_i = x_i - \alpha_i \cdot \max\{x_j - x_i, 0\} - \beta_i \cdot \max\{x_i - x_j, 0\} \quad (1)$$

$u_i$ : the utility of player i    $x_i$ : the gain of player i

$\alpha$ : a parameter if player i is helped    $\beta$ : a parameter if player i help player j

### **Inequality avoidance preference**

Making social interactions utility derive from Inequality avoidance

- Making One-to-One pairs' utility is composed by the difference of their gains.
- The gains is defined by behavioral constraints

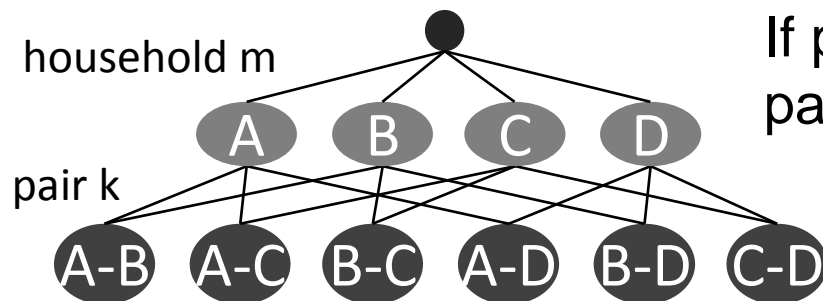
# Occurrence Probability of Social Interactions

The utility is composed by the difference of their gains  
The gains is defined by behavioral constraints

Utilities( $OR_{ij}$ ) from Other-Regarding Preference

$$OR_{ij} = \sum_n \beta_n [a_i^n - a_j^n] \quad (2) \quad \begin{array}{l} a_i : \text{Behavioral constraint gain} \\ n : \text{Explanatory factor} \quad \beta : \text{a parameter} \end{array}$$

## Occurrence Probability of Social Interaction pairs



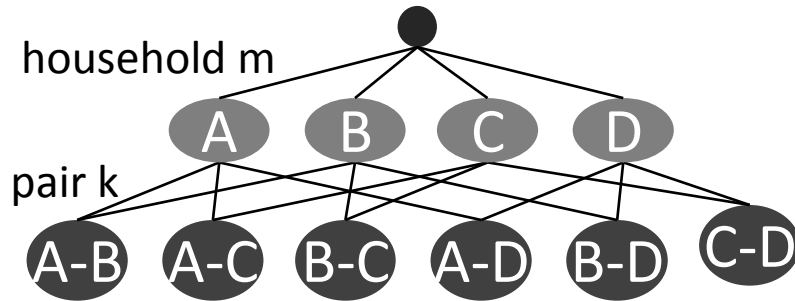
If pairs have common households,  
pairs' observation errors are correlation

→ **Cross Nested Logit model**

# Occurrence Probability of Social Interactions

Abbe et al.(2007)

upper nest: household, lower : pair



C : choice set

M : the number of household

$V_k$  : the value of choice k

$\mu_m$  : scale parameter of household m

$\mu$  : scale parameter of pair k

(  $0 < \mu < \mu_m$  )

G function

$$G(y_1, \dots, y_n) = \sum_{m=1}^M \left( \sum_{j \in C} (\alpha_{jm}^{1/\mu} y_j)^{\mu_m} \right)^{\frac{\mu}{\mu_m}} \quad (3)$$

Probability of pair k

$$P(k|C) = \sum_{m=1}^M P_m P_{k|m} \quad (4)$$

Probability of household m

$$P_m = \frac{\left( \sum_{j \in C} \alpha_{jm}^{\mu_m/\mu} e^{\mu_m V_j} \right)^{\frac{\mu}{\mu_m}}}{\sum_{m'=1}^M \left( \sum_{j \in C} \alpha_{jn}^{\mu_{m'}/\mu} e^{\mu_{m'} V_j} \right)^{\frac{\mu}{\mu_{m'}}}} \quad (5)$$

Probability of pair k in household m

$$P_{k|m} = \frac{\alpha_{km}^{\mu_m/\mu} e^{\mu_m V_k}}{\sum_{j \in C} \alpha_{jm}^{\mu_m/\mu} e^{\mu_m V_j}} \quad (6)$$

condition of allocation parameter  $\alpha$

$$0 \leq \alpha_{km} \leq 1, \sum_m \alpha_{km} = 1, \forall k \quad (7)$$

## About scale parameters

Conditions :  $0 < \mu < \mu_m$

If the upper nests' scale parameters are larger, probability of pair k is larger in eq.6 if the value of  $V_k$  is large

## About allocation parameters

$\alpha_{km}$  : allocation parameter of pair k to household m

Hypothesis : Degree of allocation is different from helper and helped

$$\alpha_{(k=ij)(m=i)} = \frac{1}{1 + \exp(\beta_\omega \omega_{ij}^i)} \quad (8)$$

$\omega_{(ij)(i)} + \omega_{(ij)(j)} = 0$   $\omega$  : dummy of helped



# **CASE STUDY**

**-Social Interactions under disasters-**

# The 2004 mudslide disasters in Niihama



- Two disasters were caused by typhoons on August 18 and September 29 in 2004

## The August typhoon

- a maximum rainfall of 55mm per hour
- Mudslides left 3 people dead

## The September typhoon

- 281mm of rainfall
- Mudslides left 5 people dead



# The Survey in Niihama

## Survey (2004.9-10)

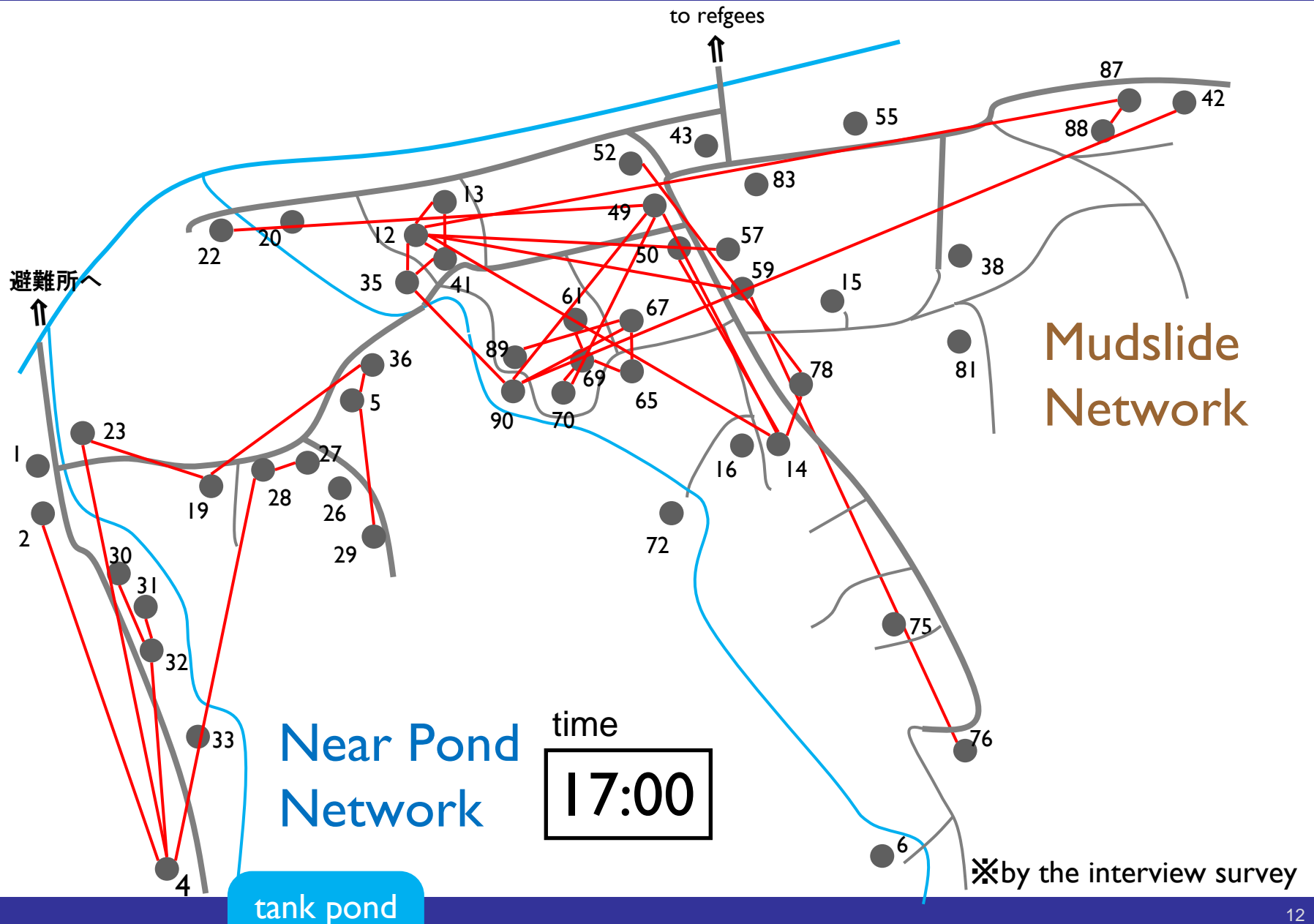
- Surveyed residents' behaviors during these disasters by **interviews (Oral communication)**
- Interviewed them about their awareness of the danger, risk management behaviors, and cooperation behaviors
- Cooperative behaviors include **rescuing** others, **evacuating with others**, **accommodating** evacuees, **meeting** and **exchanging** information.



## Network

- Nodes show households
- Links show cooperative behaviors between the households

# The result of Social Interactions



# The Value Function

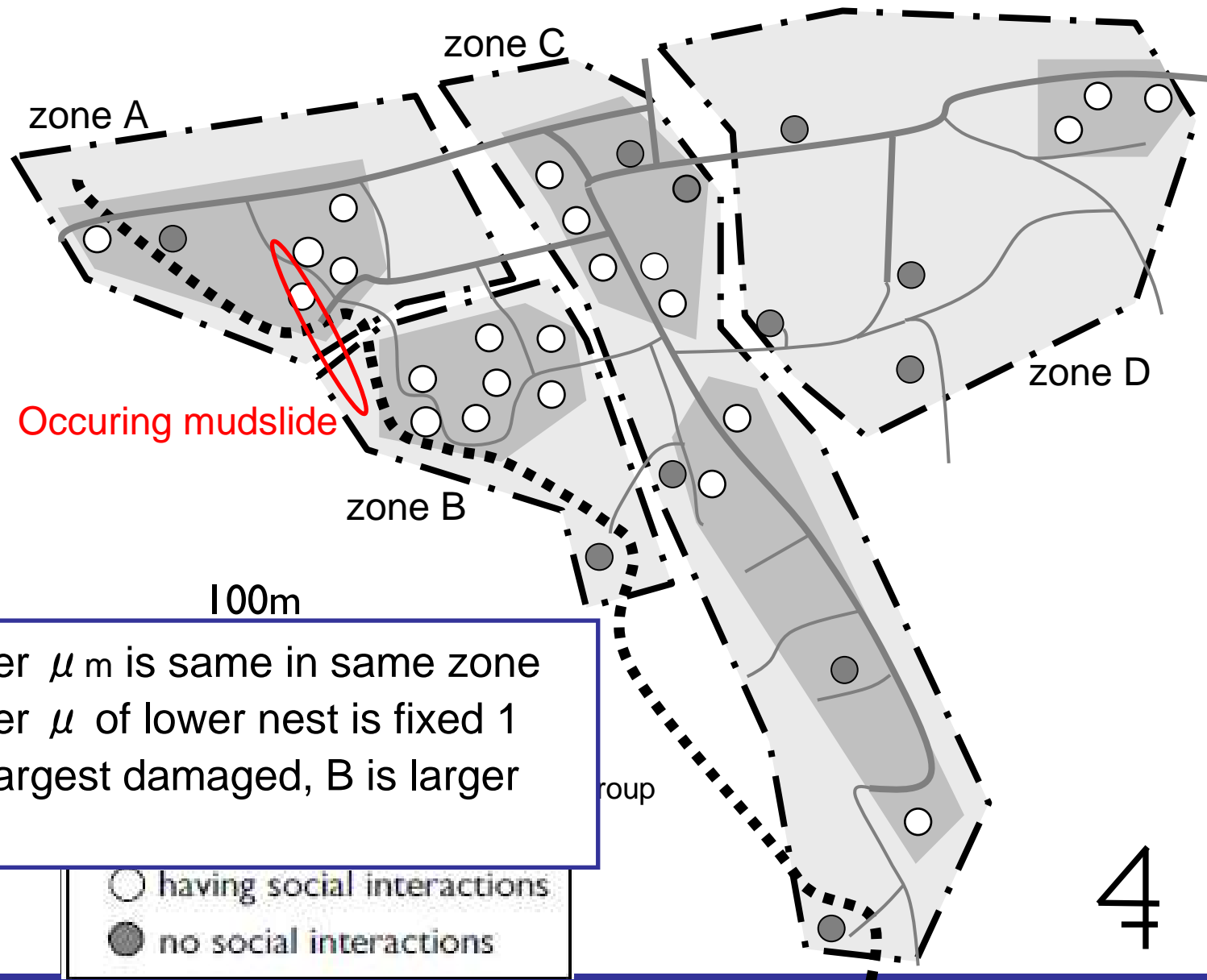
the value function of pair ij

$$\begin{aligned}
 V_{ij,t} = & \beta_{dam} \overset{\text{Other-Regarding}}{|dam_{i,t} - dam_{j,t}|} + \beta_{old} \overset{\text{Other-Regarding}}{|old_{i,t} - old_{j,t}|} + \beta_d d_{ij} \\
 & + \beta_{belo} (belo_i + belo_j) + \beta_{ab} abzone_{ij} + \beta_{res} Rs_{ij}
 \end{aligned}
 \tag{9}$$

Table 1 The list of variables

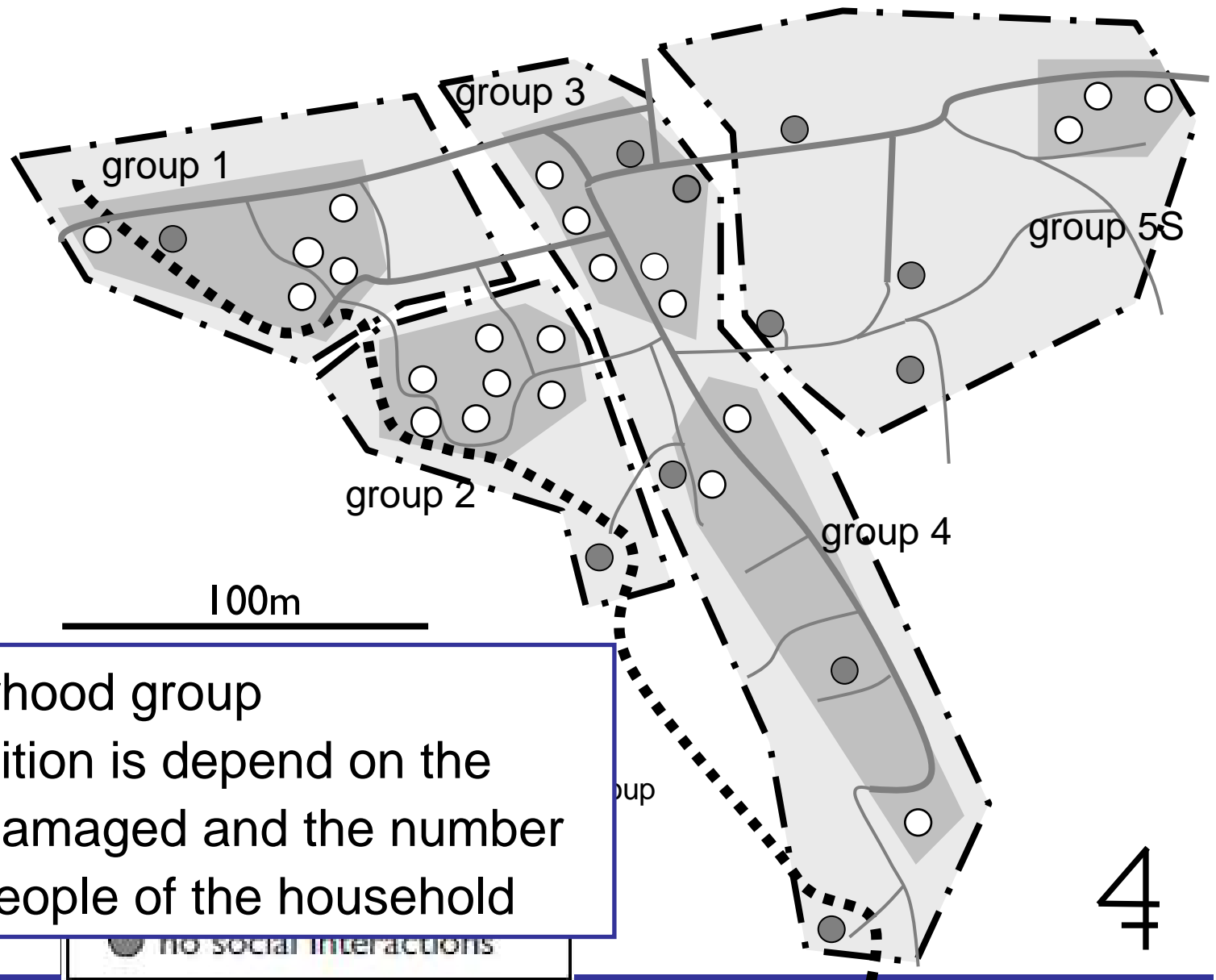
variables	contents
$dam_{i,t}$	The degree of the house damage of household $i$ at time $t$
$old_{i,t}$	The number of elderly people of household $i$ at time $t$
$d_{ij}$	The distance from household $i$ to household $j$
$belo_i$	The belongingness for this area of household $i$
$abzone_{ij}$	1 if the pair $ij$ are from zone a and zone b (Fig. 4 show zones)
$Rs_{ij}$	1 if household $i$ or $j$ were rescued by others
$\omega_{ij}^i$	1 if $dam_{i,t} > dam_{j,t}$ , -1 if $dam_{i,t} < dam_{j,t}$ . When $dam_{i,t} = dam_{j,t}$ , 1 if $old_{i,t} > old_{j,t}$ , -1 if $old_{i,t} < old_{j,t}$ . The others is 0.
$\mu_i^{zone}$	The scale parameter of household $i$ in a zone.

# Zoning for scale parameter



- scale parameter  $\mu_m$  is same in same zone
- scale parameter  $\mu$  of lower nest is fixed 1
- zone A is the largest damaged, B is larger than C, D.

# Setting the neighborhood group



- 5 neighborhood group
- the recognition is depend on the degree of damaged and the number of elderly people of the household

# the estimation result

Table 2 The estimation result

		No Choice set generation		Choice set generation	
		Coeff. B	t-Stat	Coeff. B	t-Stat
Other-regarding	$\beta_{dam}$	0.515	2.05*	0.485	2.30*
	$\beta_{old}$	0.539	2.09*	0.392	1.91 <sup>+</sup>
Cost	$\beta_d$	-0.759	-2.31*	-0.827	-2.42*
	$\beta_{belo}$	0.997	1.22	0.941	1.38
	$\beta_{ab}$	-1.308	-0.79	-1.199	-0.61
	$\beta_{res}$	0.690	1.98*	0.789	1.57
allocation parameter	$\beta_w$	-0.740	-1.21	-0.651	-1.80 <sup>+</sup>
	$\mu^A$	1.654	1.39	1.357	0.95
	$\mu^B$	5.331	0.61	5.292	1.53
	$\mu^C$	1.683	2.05*	1.098	3.19*
	$\mu^D$	2.000	-	2.000	-
	Observations		30		30
	Likelihood at 0		-155.0		-135.7
	Final likelihood		-121.8		-115.7
	Adjusted $\rho^2$		0.150		0.073

\* : significant at 0.05, <sup>+</sup> : significant at 0.10



# Conclusions

## Future works

- Formulated the occurrence of social interactions by other-regarding preferences and estimated using the behavior data of the mudslide and heavy rain disaster.
- The utilities of other-regarding preferences defined as the difference of their own gain and the gains of others.
- The occurrence probabilities of social interactions are shown by a cross nested logit model.
- The utilities of the other-regarding preferences are composed by the behavioral constraints of the households and there are the correlations of the error term among the pairs including the same households.

## Future works

- Introduce the behavioral choice models the time transitions. Many people will be acting in anticipation of the future disasters.
- Choice set generation algorithm need improvement by compensatory method.



Thank you for your listening.