

# Computer Simulation of Grammatical Change

Makoto Nakamura  
School of Information Science  
Japan Advanced Institute of Science and Technology



## Table of Contents

- Introduction
  - What computer simulations tell us?
  - Evolutionary Linguistics
- Computer simulation of the emergence of creoles
- Computer simulation of the change in inflection
- Conclusion

## Introduction

- A computer simulation is a program that attempts to simulate an abstract model of a particular system.
- Computer simulations can be considered as virtual experimental laboratories that allow researchers to run realistic, impossible, and counterfactual experiments.
  - Flight simulators to train pilots
  - Weather forecasting
  - Robot simulation for the design of robots and robot control algorithms
  - Grammatical change(?)

3

## Computer Simulation of the Evolution of Language

- The study of language origins and evolution has widely been studied for more than a decade.
- Computer simulations can help us to overcome some very problematic aspects of the study of language evolution.
- A simulation is the implementation of a theory in a computer.  
e.g. syntax, symbol grounding, grammaticalization, etc

4

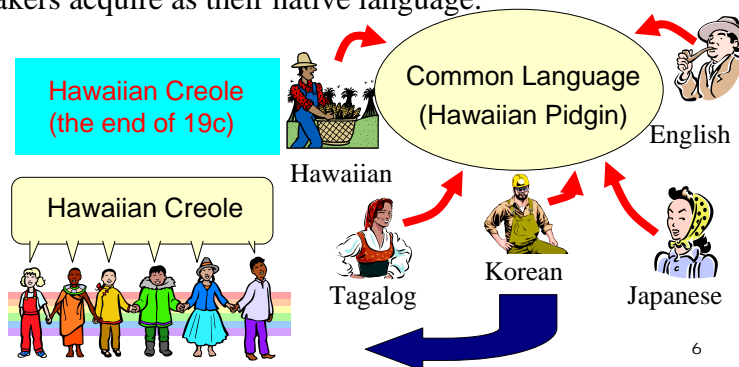
# Table of Contents

- Introduction
- Computer simulation of the emergence of creoles
  - Pidgins and Creoles
  - Language Dynamics Equations for Creolization
  - Conditions for Creolization
- Computer simulation of the change in inflection
- Conclusion

5

# Pidgins and Creoles

- Pidgins are simplified tentative languages spoken in multi-lingual communities.
- Creoles are full-fledged new languages which children of the pidgin speakers acquire as their native language.



6

## Examples of utterance (Bickerton, 1990)

### ■ Hawaiian Pidgin:

Ifu laik meiki, mo beta *make* time, mani no kaen *hapai*.

If like make, more better die time, money no can carry.

If you want to build (a temple), you should do it just before you die -- you can't take it with you!

### ■ Hawaiian Creole:

They wen go up there early in the morning *e* go plant.

They went up there early in the morning in order to plant (crops).

7

## Purpose

### ■ To investigate a process of the emergence of creoles

Population Dynamics (Nowak et al., 2001)

Multi-Agent Models (Briscoe, 2001; Kirby, 2001)

### ■ To obtain some conditions for creolization

Relationship between creoles and other languages

Learning environments for infants

8

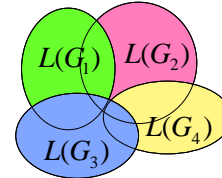
## Language and Population Dynamics

[Nowak 2001]

### ■ Universal Grammar (Chomsky, 81)

- A finite set of grammars  $\{G_1, \dots, G_n\}$
- A plausible grammar for each person is one of them
- The proportion of population  $\{x_1, \dots, x_n\}$

Venn diagram of shared sentences



### ■ Similarity among Languages

The similarity matrix  $S = \{s_{ij}\}$ : the probability that a sentence of  $G_i$  is accepted by  $G_j$ .

### ■ Transitivity of population among grammars

The transition matrix  $Q = \{q_{ij}\}$ : the probability that children of  $G_i$  speakers fail to acquire  $G_i$  but come to speak  $G_j$ .

9

## Modified Language Dynamics Equation

(Nakamura et al., 2004)

$$\frac{dx_i}{dt} = \sum_{j=1}^n x_j \bar{Q}_{ji}(t) - x_i \quad (i = 1, \dots, n),$$

where

$x_i$ : the population proportion of  $G_i$ , where  $\sum_j x_j = 1$ ,

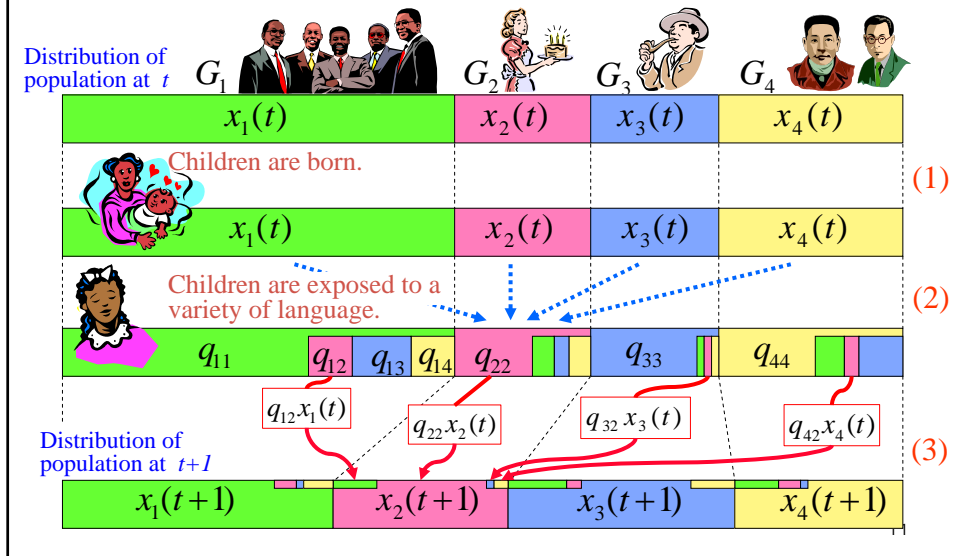
$\bar{Q}(t) = \{\bar{Q}_{ij}(t)\}$ : the transition probability between grammars that a child of  $G_i$  speakers come to acquire  $G_j$ .

Modification from the previous work (Nowak, 2001)

- (1) to exclude a fitness term concerned with the biological evolution
- (2) to expand its domain into cultural transmission
- (3) to change the transition matrix  $Q$  to a function

10

# Illustration of Our Model

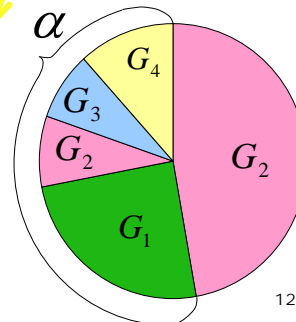


# Exposure Ratio $\alpha$

Distribution of population for each grammar



- $\alpha$  represents a pidgin community.
- Children are exposed to languages other than their mother tongue in proportion to the distribution of population and the exposure ratio  $\alpha$ .



# Learning Algorithm

Exposure ratio  $\alpha$

Similarity of language

Input sentences ( $w=9$ ):

1	2	3	4	5
6	7	8	9	

- 1) The child has a set of counters.
- 2) The child knows whether an input sentence is acceptable or not for each grammar.
- 3) The child acquires a grammar of the highest score.

13

# Definition of Creoles in LDE

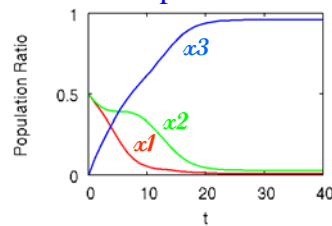
- Creoles are also included in the set of predefined languages UG:

$$\{G_1, \dots, G_c, \dots, G_n\}$$

- A creole is defined as a grammar  $G_c$  in LDE as follows.

$$\begin{cases} x_c(0) = 0 \\ x_c(t) \geq \theta_c (= 0.9) \end{cases}$$

Example of Creole



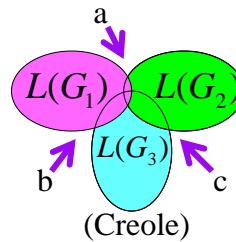
14

# Experiments

- 3 grammars
    - G1, G2: preexisting grammars
    - G3: creole grammar
- $$\begin{cases} x_1(0) = x_2(0) = 0.5 \\ x_3(0) = 0 \end{cases}$$

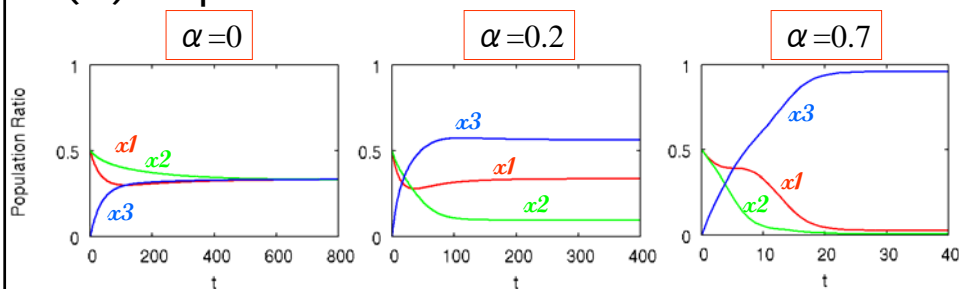
- Similarity among languages

$$S = \begin{bmatrix} 1 & a & b \\ a & 1 & c \\ b & c & 1 \end{bmatrix}$$

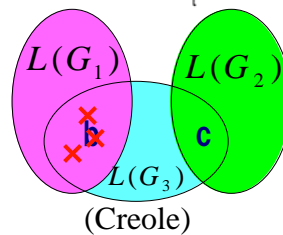


- (1) The Exposure Ratio  $\alpha$  and creolization
- (2) Similarity among languages and creolization

## (1) Exposure Ratio $\alpha$ and Creole

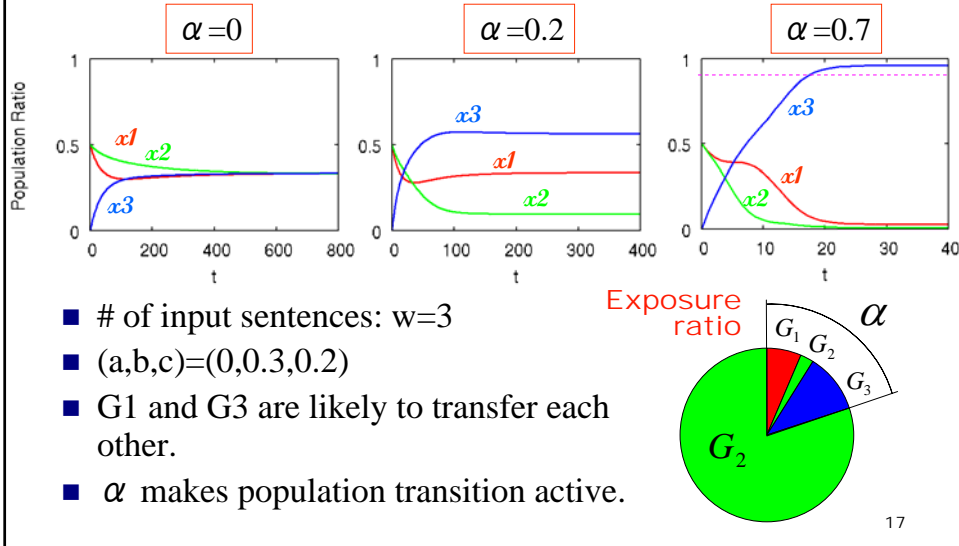


- # of input sentences:  $w=3$
- $(a,b,c)=(0,0.3,0.2)$
- G1 and G3 are likely to transfer each other.
- $\alpha$  makes population transition active.



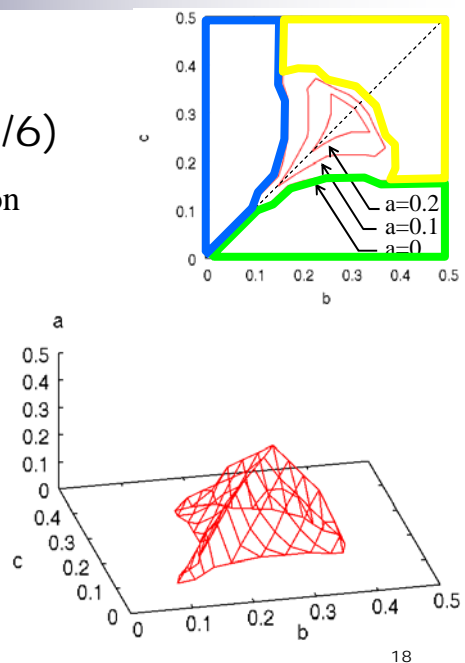
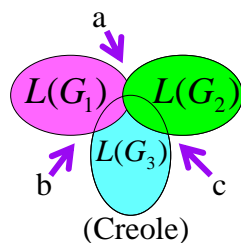


## (1) Exposure Ratio $\alpha$ and Creole



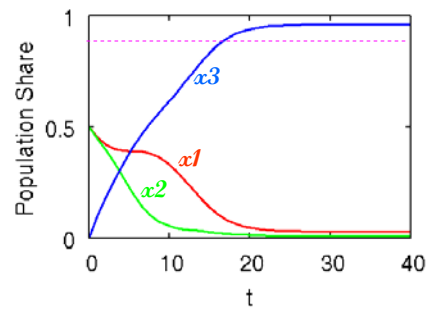
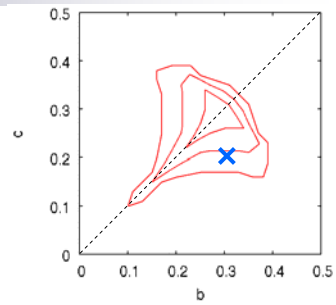
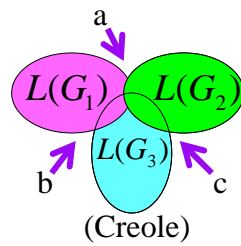
## (2) Conditions for Creolization (1/6)

- Conditions for creolization on similarity among languages
- #input sentences:  $w=3$
- Exposure Ratio:  $\alpha=0.7$
- Symmetric along with  $b=c$



## (2) Conditions for Creolization (2/6)

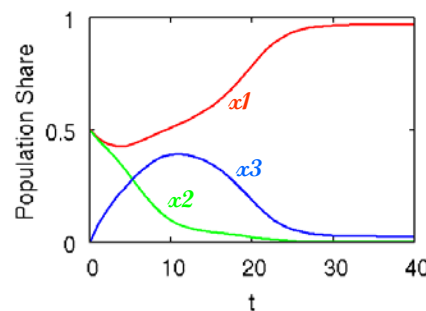
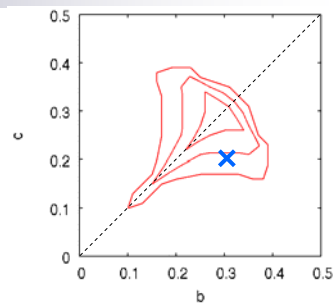
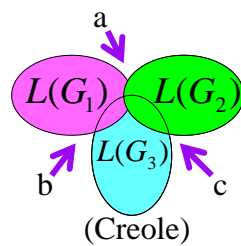
- $w=3, \alpha=0.7$
- $(a,b,c)=(0,0.3,0.2)$
- Active transition between  $G_1$  and  $G_3$



19

## (2) Conditions for Creolization (3/6)

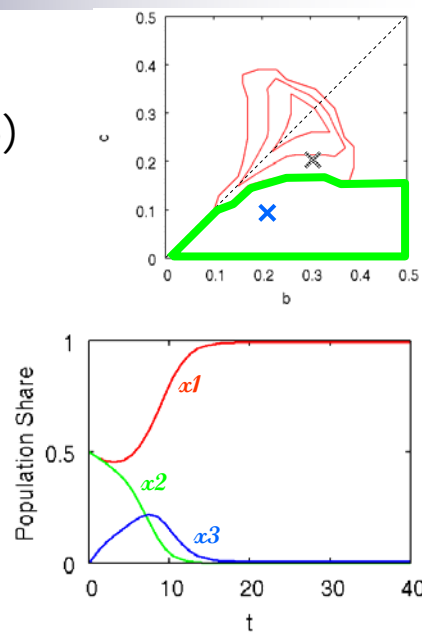
- $w=3, \alpha=0.7$
- $(a,b,c)=(0.1,0.3,0.2)$
- Active transition between  $G_1$  and  $G_2$



20

## (2) Conditions for Creolization (4/6)

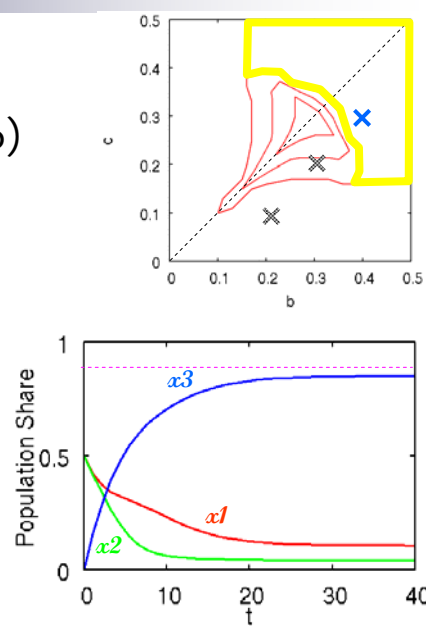
- $w=3, \alpha=0.7$
- $(a,b,c)=(0,0.2,0.1)$
- Inactive transition because of low similarity
- G1 becomes dominant since the initial population.



21

## (2) Conditions for Creolization (5/6)

- $w=3, \alpha=0.7$
- $(a,b,c)=(0,0.4,0.3)$
- G1 and G3 coexist because of high similarity.
- G3 is the most populous language, but it is not a dominant creole. ( $\theta_c = 0.9$ )

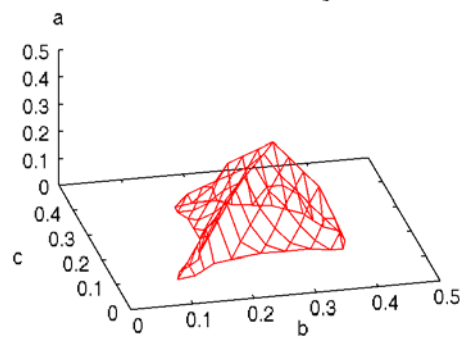
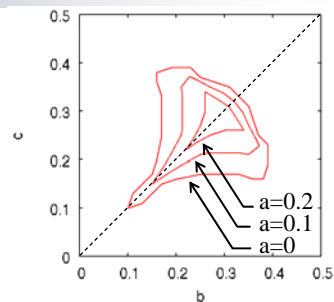
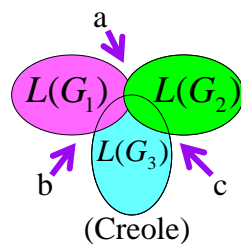


22

## (2) Conditions for Creolization (6/6)

Pre-existing languages are:

- Dissimilar with each other
- equally similar with the creole
- Not too similar with the creole.



23

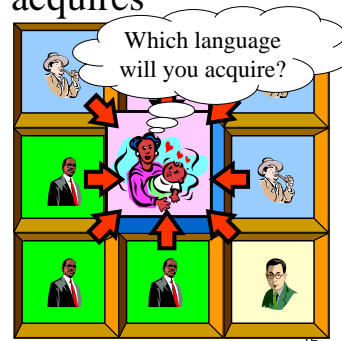
## Summary of Creole Simulation

- Creole viewed from population dynamics
  - Since languages are extremely abstracted, similarity can be parameterized.
  - Parameters: Learning environment, Similarity among languages
- Conditions for creolization
  - The exposure ratio: the greater, the easier
  - Pre-existing languages: dissimilar with each other
  - Creoles are not too similar to pre-existing languages
  - Creoles are equally similar to pre-existing languages

24

## Introducing a Spatial Structure to Language Dynamics

- How do language learners organize a creole community?
- Each individual independently acquires a language, applying the transition probability.
- Deterministic vs. stochastic

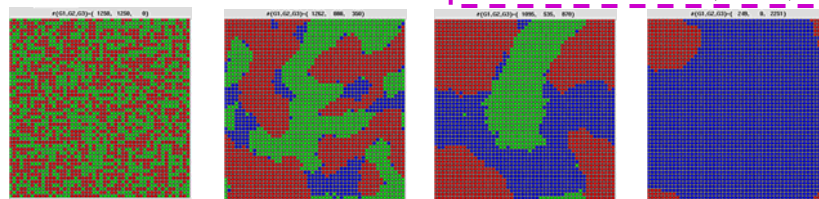


25

## Example of Creolization

$$S = \begin{pmatrix} 1 & 0 & 0.3 \\ 0 & 1 & 0.4 \\ 0.3 & 0.4 & 1 \end{pmatrix}, \alpha = 0.7, w = 10$$

Change of Language Distribution



Generation: 0                      50                      500                      1552

- Agents surrounded by both  $G1$  and  $G2$  neighbors are likely to acquire the creole.
- The creole is the most efficient for accepting input utterances from both languages.
- Some colonies of creole are organized at the early stage.
- Colonies are unlikely to vanish.

26

## Table of Contents

- Introduction
- Computer simulation of the emergence of creoles
- Computer simulation of the change in inflection
  - Word order and Inflection
  - Acquisition of a rational grammar
  - Experiments with two corpora
- Conclusion

27

## Computer Simulation of the change in Inflection

- Inflection is the way language handles grammatical relations and relational categories such as tense, mood, aspect, person, number, gender, case and so on.
- Under multi language communication, a common language tends to lose [Sebba, 1997]
  - Case marker
  - Agreement of number, gender
  - Tense

28

## Word order and Inflection

- The language with rich inflectional system  
⇒ more flexible in word order
- The language with poor inflectional system  
⇒ strict word order

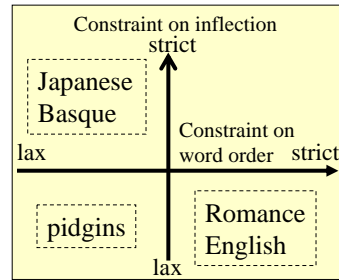
English Word order is fixed: S-V-O

A dog bites a man.

S: a dog  
O: a man

Japanese Basic word order is S-O-V

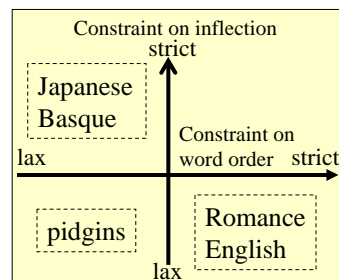
Inu-ga otoko-wo kamu  
(dog) (man) (bite)



29

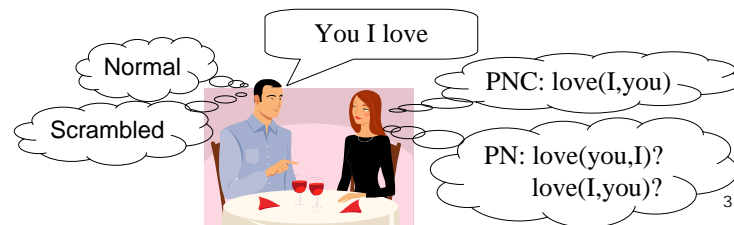
## Purpose and Method

- Purpose
  - To acquire grammars adapting for environment
  - To investigate efficiency of inflection and word order
- Method
  1. To make scrambled English sentences from corpora
  2. To construct grammars w/ and w/o the process of inflection
  3. To measure efficiency of grammars using a utility function
  4. To examine the change in inflection with a population dynamics



## Strategy

- **Speakers' strategy: to avoid ambiguous expression**
  - Normal: Normal English sentences (from corpora)
  - Scrambled: Scrambled sentences
- **Hearers' strategy: to avoid paying attention to inflection**
  - PNC: consideration of person, number, case(pronoun)
  - PN : neglect of inflection for case



## Corpora

- **Wall Street Journal: WSJ**
  - Includes many long, complicated sentences

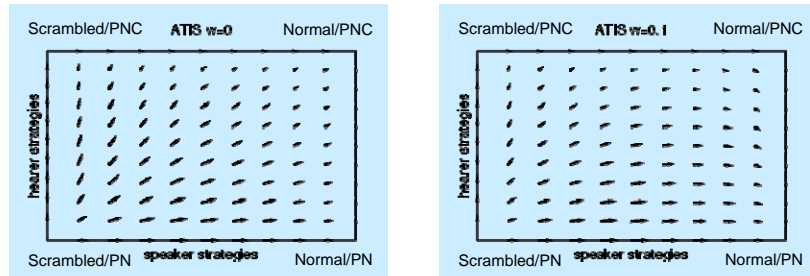
Zenith Data Systems Corp., a subsidiary of Zenith Electronics Corp., received a \$534 million Navy contract for software and services of microcomputers over an 84-month period.

- **Air Travel Information System: ATIS**
  - Includes many simple sentences

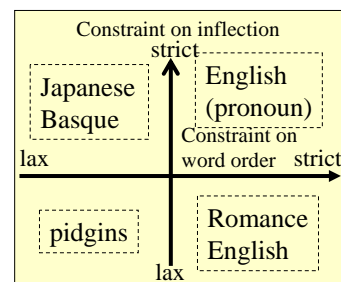
I need to have dinner served.  
Show me the flights form Tampa to Baltimore.



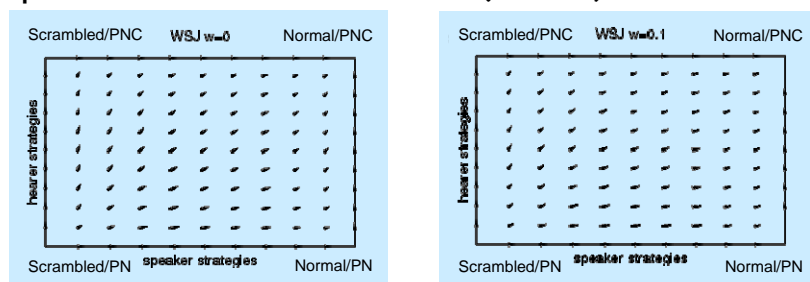
## Experimental Results (ATIS)



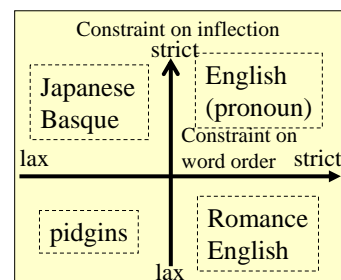
- Phase diagrams represent the grammatical change, corresponding to the distribution map of languages.
- ATIS corpus includes short and simple sentences.
- Hearers as pidgin speakers prefer the grammar in which they do not take the case feature into consideration.



## Experimental Results (WSJ)



- WSJ corpus includes long and complicated sentences.
- Case features help them to avoid ambiguous expressions.
- Hearers prefer the grammar in which they take the case feature into consideration, even if it is a burden on the hearers.



## Summary of the Change in Inflection

- Rational grammars change depending on environment.
- As long as speakers speak simple sentences, the rational grammar is likely to be simplified.
- Need to reconsider both speakers' and hearers' strategies
- Use Corpora other than English

35

## Conclusion

- Simulations of grammatical change
  - Emergence of creoles: conditions for creolization in terms of concerning languages, exposure ratio
  - Learning of inflection: The utility of inflection changes depending on the situation.
- Computer simulations can show how interactions among individuals affect languages spoken throughout the community.
- Thus, hypothesizing about the abilities of individuals or about the learning environment, we can consider what causes a grammar to change.

36