

# Communication about similarity spaces

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Gärdenfors (2000):

- meanings are arranged in **conceptual spaces**
- conceptual space has geometrical structure
- dimensions are founded in perception/cognition



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## Convexity

A subset  $C$  of a conceptual space is said to be *convex* if, for all points  $x$  and  $y$  in  $C$ , all points between  $x$  and  $y$  are also in  $C$ .



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## Criterion P

A *natural property* is a convex region of a domain in a conceptual space.



- spatial dimensions: *above, below, in front of, behind, left, right, over, under, between ...*
- temporal dimension: *early, late, now, in 2005, after, ...*
- sensual dimensions: *loud, faint, salty, light, dark, ...*
- abstract dimensions: *cheap, expensive, important, ...*



# The naming game

- two players:
  - **S**ender
  - **R**eceiver
- infinite set of **M**eanings, arranged in a finite metrical space  
*distance is measured by function  $d : M^2 \mapsto R$*
- finite set of **F**orms
- sequential game:
  - 1 nature picks out  $m \in M$  according to some probability distribution  $p$  and reveals  $m$  to  $S$
  - 2  $S$  maps  $m$  to a form  $f$  and reveals  $f$  to  $R$
  - 3  $R$  maps  $f$  to a meaning  $m'$



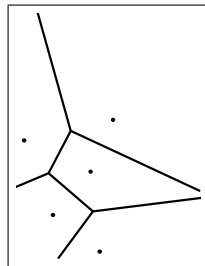
- **Goal:**
  - optimal communication
  - both want to minimize the distance between  $m$  and  $m'$
- **Strategies:**
  - speaker: mapping  $S$  from  $M$  to  $F$
  - hearer: mapping  $R$  from  $F$  to  $M$
- **Average utility:** (identical for both players)

$$u(S, R) = \sum_m p_m \times \exp(-d(m, R(S(m))))^2$$

*vulgo: average similarity between speaker's meaning and hearer's meaning*



- suppose  $R$  is given and known to the speaker: which speaker strategy would be the best response to it?
  - every form  $f$  has a “prototypical” interpretation:  $R(f)$
  - for every meaning  $m$ :  $S$ 's best choice is to choose the  $f$  that minimizes the distance between  $m$  and  $R(f)$
  - optimal  $S$  thus induces a **partition** of the meaning space
  - Voronoi tessellation, induced by the range of  $R$





Okabe et al. (1992) prove the following lemma (quoted from Gärdenfors 2000):

## Lemma

*The Voronoi tessellation based on a Euclidean metric always results in a partitioning of the space into convex regions.*



# ESSs of the naming game

- best response of  $R$  to a given speaker strategy  $S$  not as easy to characterize
- general formula

$$R(f) = \arg \max_m \sum_{m' \in S^{-1}(f)} p_{m'} \times \exp(-d(m, m')^2)$$

- such a hearer strategy always exists
- linguistic interpretation:  $R$  maps every form  $f$  to the **prototype** of the property  $S^{-1}(f)$



## Lemma

*In every ESS  $\langle S, R \rangle$  of the naming game, the partition that is induced by  $S^{-1}$  on  $M$  is the Voronoi tessellation induced by  $R[F]$ .*



## Lemma

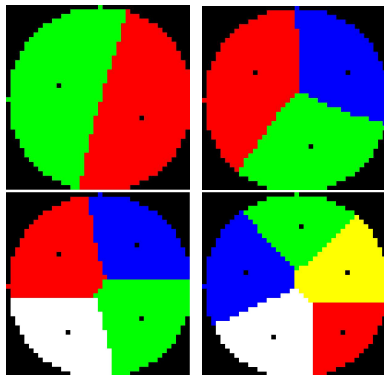
*In every ESS  $\langle S, R \rangle$  of the naming game, the partition that is induced by  $S^{-1}$  on  $M$  is the Voronoi tessellation induced by  $R[F]$ .*

## Theorem

*For every form  $f$ ,  $S^{-1}(f)$  is a convex region of  $M$ .*



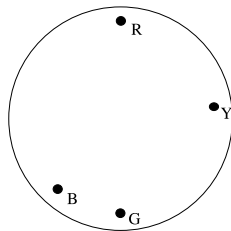
- two-dimensional circular meaning space
- discrete approximation
- uniform distribution over meanings
- initial strategies are randomized
- update rule according to (discrete time version of) replicator dynamics



# A toy example

- suppose
  - circular two-dimensional meaning space
  - four meanings are highly frequent
  - all other meanings are negligibly rare
- let's call the frequent meanings  
Red, Green, Blue and Yellow

$$p_i(\text{Red}) > p_i(\text{Green}) > p_i(\text{Blue}) > p_i(\text{Yellow})$$

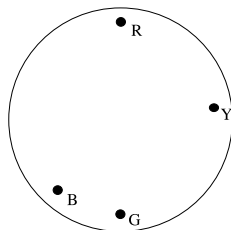


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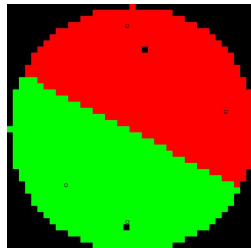
$$p_i(\text{Red}) > p_i(\text{Green}) > p_i(\text{Blue}) > p_i(\text{Yellow})$$

*Yes, I made this up without empirical justification.*



# Two forms

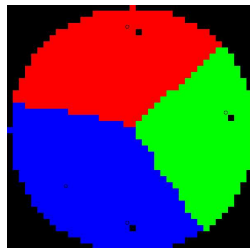
- suppose there are just two forms
- only one Strict Nash equilibrium (up to permutation of the forms)
- induces the partition {**Red, Blue**}/ {**Yellow, Green**}





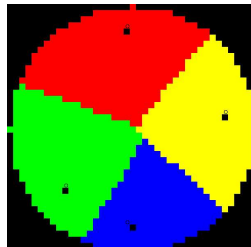
# Three forms

- if there are three forms
- two Strict Nash equilibria (up to permutation of the forms)
- partitions  $\{\text{Red}\}/\{\text{Yellow}\}/\{\text{Green, Blue}\}$  and  $\{\text{Green}\}/\{\text{Blue}\}/\{\text{Red, Yellow}\}$
- only the former is **stochastically stable** (resistent against random noise)



# Four forms

- if there are four forms
- one Strict Nash equilibrium (up to permutation of the forms)
- partitions  
 $\{\text{Red}\}/\{\text{Yellow}\}/\{\text{Green}\}/\{\text{Blue}\}$



## Krifka's observations

- measure terms are vague
- some measure terms are ambiguous between different degrees of vagueness
- usually only simple expressions are ambiguous in this way
- complexifying an expression may reduce ambiguity



## vagueness

95 m: between 94.5 and 95.5 m

## ambiguity

- *The water has a temperature of  $40^\circ$ :  $38^\circ < T < 42^\circ$*
- *His body temperature is  $40^\circ$ :  $39.95^\circ < T < 40.05^\circ$*

## simple and complex expression

*His body temperature is  $39^\circ$ : cannot mean  $37^\circ < T < 41^\circ$*

## complexification

*The water has a temperature of exactly  $40^\circ$ :  $39.9^\circ < T < 40.1^\circ$*



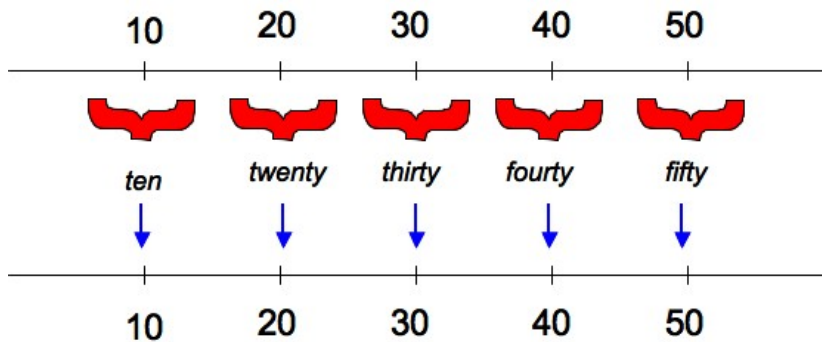
- Suppose the game setup is as before, with arithmetic difference as distance function

## ESS

- Sender:
  - meaning space is partitioned into continuous intervals of equal length
  - each interval is correlated with one signal
- Receiver:
  - each signal is mapped to the center of the corresponding interval



# General considerations



- suppose signals incur a cost for both sender and receiver
- modified utility function

$$u(S, R) = \sum_m p_m \exp(-(m - R(S(m)))^2) - c(S(m))$$

- intuitive idea:

$$c(\text{thirty-nine}) > c(\text{forty})$$

etc.



## ESSets

- general pattern as before
- additional constraint: in an ESS  $(S, R)$ , we have

$$\forall m : S(m) = \arg_f \max[\exp(-(m - R(f))^2) - c(f)]$$

- simultaneous
  - minimizing distance between  $m$  and  $R(S(m))$
  - minimizing costs  $c(S(m))$
- in equilibrium (ESSet), distance between  $m$  and  $R(S(m))$  need not be minimal





## Assessment

- this setup
  - predicts the possibility of vague interpretation: **good**
  - fails to predict the ambiguity between precise and vague interpretations (or different degrees of vagueness): **bad**



# Variable standard of precision

## Proposal

- required degree of precision depends on context
- modeling as Bayesian game with different utility function
- both players still have same utility function and know that function

$$u(S, R) = \sum_{m, \sigma} p_{m, \sigma} \exp(-(m - R(S(m)))^2 / \sigma^2) - c(S(m))$$

- high value of  $\sigma$ : precision doesn't matter very much
- low value of  $\sigma$ : precision is more important than economy of expression



# An example

- Suppose:
  - just two meanings: 39, 40
  - just two forms: *thirty-nine*, *forty*

$$c(\textit{thirty-nine}) - c(\textit{forty}) = \mathbf{c} > 0$$

- two standards of precision,  $\sigma_1$  and  $\sigma_2$

$$\begin{aligned}\sigma_1 &< \sigma_2 \\ \exp(-1^2/\sigma_1^2) &= d_1 \\ \exp(-1^2/\sigma_2^2) &= d_2 \\ 1 - d_1 &> \mathbf{c} \\ 1 - d_2 &< \mathbf{c} \\ \forall m, \sigma : p_{m, \sigma} &= .25\end{aligned}$$



# An example





## Intuitive characterization

- two standards of precision
- utility loss under vague interpretation is  $1 - d_i$
- utility loss due to usage of more complex expression is  $c$
- under  $\sigma_1$  precision is more important
- under  $\sigma_2$  economy of expression is more important
- uniform probability distribution over states

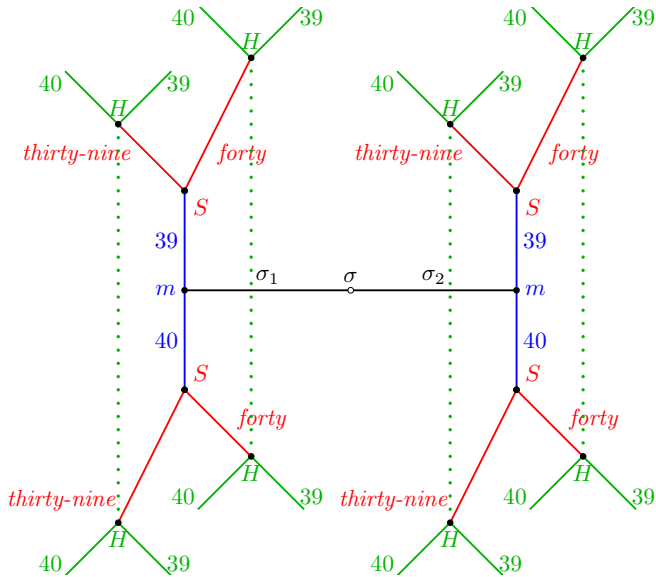
## meanings/signals

	$S$		$R$
	39	<i>thirty-nine</i>	39
	40	<i>forty</i>	40

## strategies

- $S_1/R_1$  : 
- $S_2/R_2$  : 
- $S_3/R_3$  : 
- $S_4/R_4$  : 

# Extensive form



# Utility matrices

$\sigma_1$

	$1 - \frac{c}{2}$	$d_1 - \frac{c}{2}$	$\frac{1+d_1-c}{2}$	$\frac{1+d_1-c}{2}$
	$d_1 - \frac{c}{2}$	$1 - \frac{c}{2}$	$\frac{1+d_1-c}{2}$	$\frac{1+d_1-c}{2}$
	$\frac{1+d_1}{2}$	$\frac{1+d_1}{2}$	$\frac{1+d_1}{2}$	$\frac{1+d_1}{2}$
	$\frac{1+d_1}{2} - c$	$\frac{1+d_1}{2} - c$	$\frac{1+d_1}{2} - c$	$\frac{1+d_1}{2} - c$

$\sigma_2$

	$1 - \frac{c}{2}$	$d_2 - \frac{c}{2}$	$\frac{1+d_2-c}{2}$	$\frac{1+d_2-c}{2}$
	$d_2 - \frac{c}{2}$	$1 - \frac{c}{2}$	$\frac{1+d_2-c}{2}$	$\frac{1+d_2-c}{2}$
	$\frac{1+d_2}{2}$	$\frac{1+d_2}{2}$	$\frac{1+d_2}{2}$	$\frac{1+d_2}{2}$
	$\frac{1+d_2}{2} - c$	$\frac{1+d_2}{2} - c$	$\frac{1+d_2}{2} - c$	$\frac{1+d_2}{2} - c$

## Evolutionary stability

- first subgame ( $\sigma_1$ ; precision is important): two ESS
  - $S_1/R_1$
  - $S_2/R_2$
- in either case, both expressions have a precise meaning and are interpreted exactly as intended
- second subgame ( $\sigma_2$ ; economy of expression is important): one ESSet
  - consists of  $S_3$  and all mixed strategies of  $R$
- Bayesian game:
  - two ESSets
  - any combination of ESSets of the two sub-games



## Assessment

- this setup
- predicts that
  - all number words receive a precise interpretation if precision is important
  - only short number words are used and receive a vague interpretation if economy is important
- **good**
- with larger dictionary prediction that there is no correlation between the interpretation of words between the different subgames
- for instance:
  - *forty* could mean 40 for  $\sigma_1$  and  $\{28...32\}$  for  $\sigma_2$
- **bad**





## Modified information sets

- idea
  - $S$  knows  $\sigma$ , but
  - $R$  doesn't
- then  $R$ 's interpretation of a word cannot depend on  $\sigma$

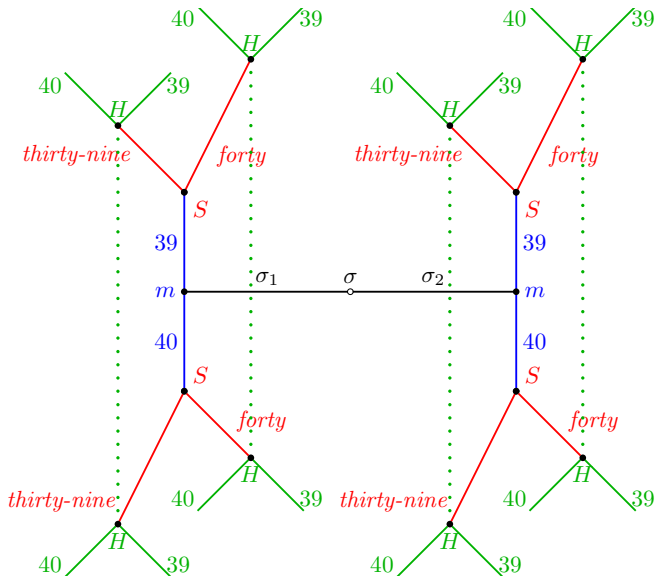
## Strategy space

- Sender strategies:
  - functions from pairs  $(m, \sigma)$  to signals
  - in the example:  $4 \times 4 = 16$  strategies, as before
- Receiver's strategies
  - functions from signals to meanings
  - in the example: only four such functions (as in the first version of the example)



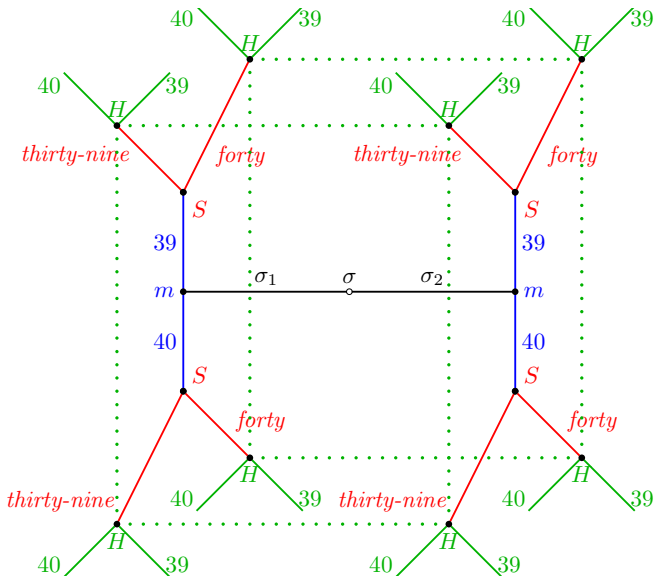
# Extensive form

old game:

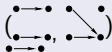

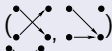



# Extensive form

new game:



## ESS

- resulting game has only two ESSs
  - ESS 1:
    - S: 
    - R: 
  - ESS 2:
    - S: 
    - R: 
- in either case
  - R always assumes precise interpretation
  - S always chooses correct word if  $\sigma$  is low
  - S always chooses short word if  $\sigma$  is high



## Open questions

- notion of ESS/ESSet only make sense for finite strategy space
- can results be maintained if meaning space is really continuous?
- S's signal gives information about value of  $\sigma$
- perhaps R's guess about value of  $\sigma$  should enter the utility function
- would explain why
  - it can be rational for S to use excessively complex phrases like *exactly forty* and short phrases like *forty* synonymously
  - *exactly forty* can only be interpreted precisely, while *forty* is ambiguous

