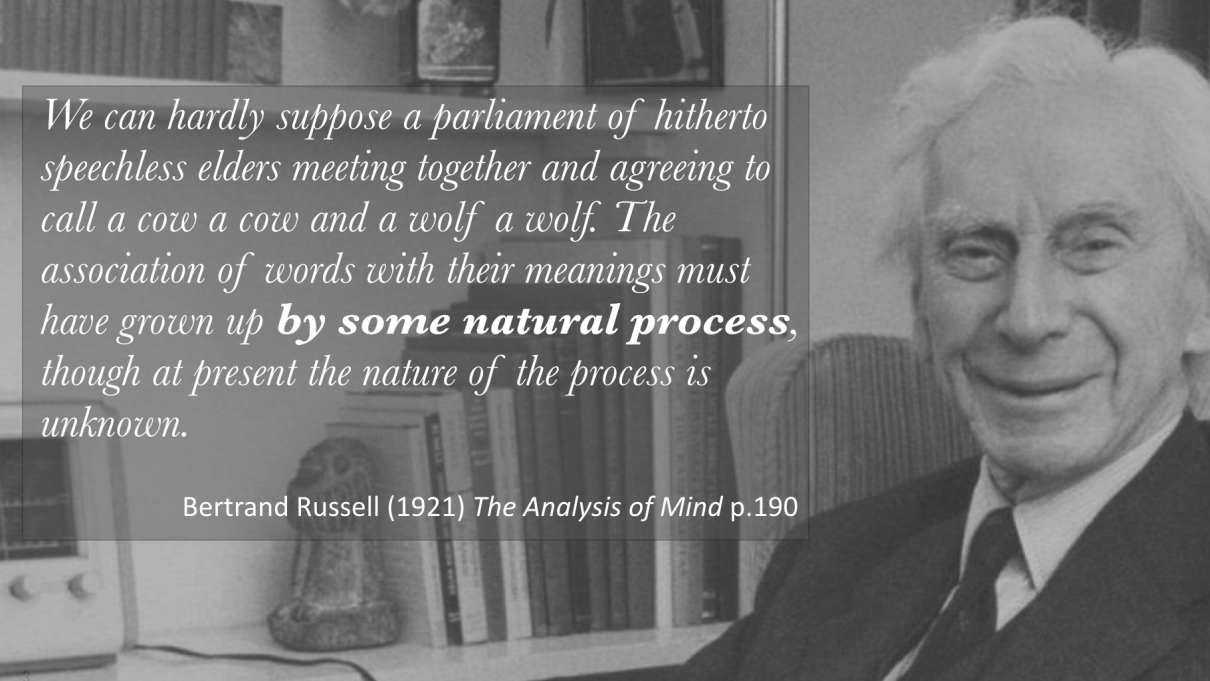


Models of Language Evolution

Evolutionary game theory & signaling games

Michael Franke

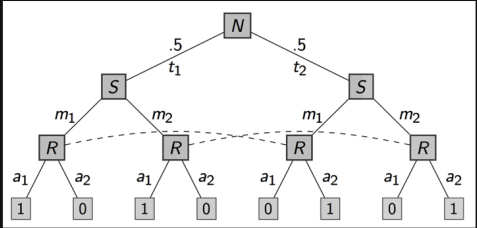
A black and white photograph of Bertrand Russell, an elderly man with white hair, wearing a dark suit and tie, smiling slightly. He is seated in a chair. In the background, there is a bookshelf filled with books and a small statue on a desk.

*We can hardly suppose a parliament of hitherto speechless elders meeting together and agreeing to call a cow a cow and a wolf a wolf. The association of words with their meanings must have grown up **by some natural process**, though at present the nature of the process is unknown.*

Bertrand Russell (1921) *The Analysis of Mind* p.190

MEANING AS CONVENTION

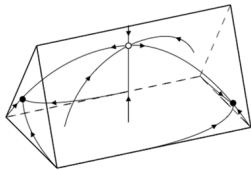
equilibria of signaling games



David Lewis (1969) *Convention*



SIGNALING THEORY



evolutionary dynamics instead of equilibria

fitness-based selection **OR**
agent-level learning

meaning as **information content**



Brian Skyrms (2010) *Signals: Evolution, Learning, and Information*

Topics for today

- 1 (flavors of) game theory
- 2 signaling games (& conversion into symmetric form)
- 3 Nash equilibrium (in symmetric games)
- 4 evolutionary stability
- 5 meaning of signals

Game Theory

Signaling games

Population Games

(Rational) Choice Theory

Decision Theory: a **single** agent's solitary decision

Game Theory: **multiple** agents' interactive decision making

Game Theory

- abstract mathematical tools for modeling and analyzing multi-agent interaction
- since 1940: **classical game theory** (von Neumann and Morgenstern)
 - *perfectly rational agents* ::: Nash equilibrium
 - initially promised to be a unifying formal foundation for all social sciences
 - Nobel laureates: Nash, Harsanyi & Selten (1994), Aumann & Schelling (2006)
- since 1970: **evolutionary game theory** (Maynard-Smith, Prize)
 - *boundedly-rational agents* ::: evolutionary stability & replicator dynamics
 - first applications in biology, later also elsewhere (linguistics, philosophy)
- since 1990: **behavioral game theory** (Selten, Camerer)
 - studies interactive decision making in the lab
- since 1990: **epistemic game theory** (Harsanyi, Aumann)
 - studies which (rational) beliefs of agents support which solution concepts

Games vs. Behavior

Game: abstract model of a recurring interactive decision situation

- think: a model of the environment

Strategies: all possible ways of playing the game

- think: a full contingency plan or a (biological) predisposition for how to act in every possible situation in the game

Solution: subset of “good strategies” for a given game

- think: strategies that are in equilibrium, rational, evolutionarily stable, the outcome of some underlying agent-based optimization process etc.

Solution concept: a general mapping from any game to its specific solution

- examples: Nash equilibrium, evolutionary stability, rationalizability etc.

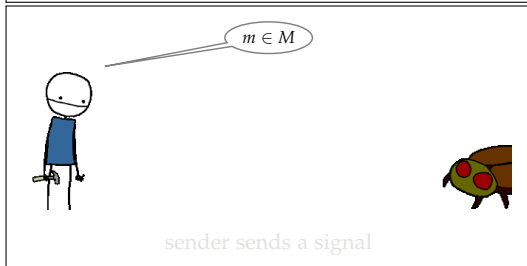
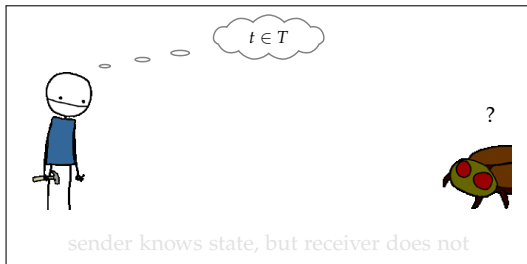
Kinds of Games

uncertainty	choice points	
	simultaneous	in sequence
no	<i>strategic / static</i>	<i>dynamic / sequential</i> with <i>complete</i> info
yes	<i>Bayesian</i>	<i>dynamic / sequential</i> with <i>incomplete</i> info

Game Theory

Signaling games

Population Games



State-Act Payoff Matrix

	a_1	a_2	\dots
t_1	1,1	0,0	
t_2	1,0	0,1	
\vdots			

(Lewis, 1969)

Signaling game

A **signaling game** is a tuple

$$\langle \{S, R\}, T, \text{Pr}, M, A, U_S, U_R \rangle$$

with:

$\{S, R\}$ set of **players**

T set of **states**

Pr **prior beliefs**: $\text{Pr} \in \Delta(T)$

M set of **messages**

A set of receiver **actions**

$U_{S,R}$ **utility functions**:

$$T \times M \times A \rightarrow \mathbb{R}.$$

Talk is **cheap** iff for all t, m, m', a and $X \in \{S, R\}$:

$$U_X(t, m, a) = U_X(t, m', a).$$

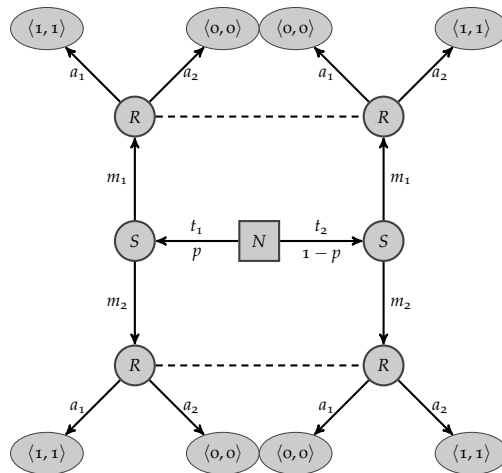
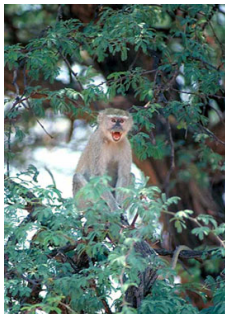
Otherwise we speak of **costly signaling**.

Example (2-2-2 Lewis game)

2 states, 2 messages, 2 acts

	$\Pr(t)$	a_1	a_2
t_1	p	1, 1	0, 0
t_2	$1 - p$	0, 0	1, 1

Example (Alarm calls)



Strategies

Pure

$$s \in M^T$$

$$r \in A^M$$

fixed contingency plan

Mixed

$$\tilde{s} \in \Delta(M^T)$$

$$\tilde{r} \in \Delta(A^M)$$

uncertainty about plan

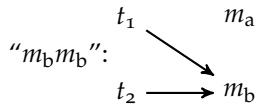
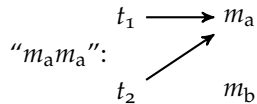
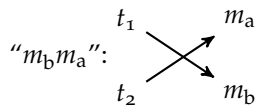
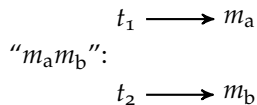
Behavioral

$$\sigma \in (\Delta(M))^T$$

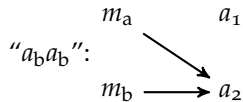
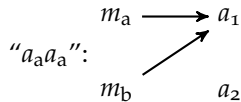
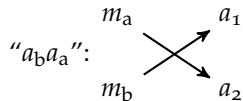
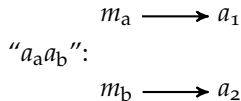
$$\rho \in (\Delta(A))^M$$

probabilistic plan

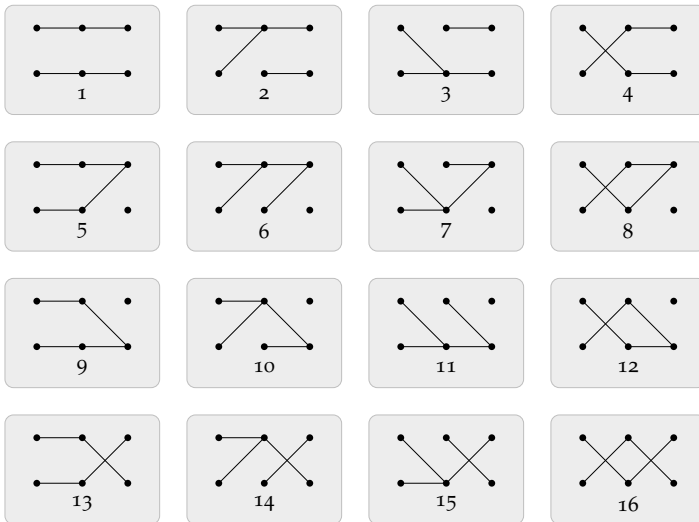
Pure sender strategies in the 2-2-2 Lewis game



Pure receiver strategies in the 2-2-2 Lewis game



All pairs of sender-receiver pure strategies for the 2-2-2 Lewis game



Game Theory

Signaling games

Population Games

(One-Population) Symmetric Game

A (one-population) symmetric game is a pair $\langle A, U \rangle$, where:

- A is a set of acts, and
- $U : A \times A \rightarrow \mathbb{R}$ is a utility function (matrix).

Example (Prisoner's dilemma)

$$U = \begin{matrix} & \begin{matrix} a_c & a_d \end{matrix} \\ \begin{matrix} a_c \\ a_d \end{matrix} & \begin{pmatrix} 2 & 0 \\ 3 & 1 \end{pmatrix} \end{matrix}$$

Example (Hawk & Dove)

$$U = \begin{matrix} & \begin{matrix} a_h & a_d \end{matrix} \\ \begin{matrix} a_h \\ a_d \end{matrix} & \begin{pmatrix} 1 & 7 \\ 2 & 3 \end{pmatrix} \end{matrix}$$

Mixed strategies in symmetric games

A **mixed strategy** in a symmetric game is a probability distribution $\sigma \in \Delta(A)$.

Utility of mixed strategies defined as usual:

$$U(\sigma, \sigma') = \sum_{a, a' \in A} \sigma(a) \times \sigma'(a') \times U(a, a')$$

Nash Equilibrium in Symmetric Games

A mixed strategy $\sigma \in \Delta(A)$ is a **symmetric Nash equilibrium** iff for all other possible strategies σ' :

$$U(\sigma, \sigma) \geq U(\sigma', \sigma).$$

It is **strict** if the inequality is strict for all $\sigma' \neq \sigma$.

Examples

Prisoner's Dilemma

$$U = \begin{pmatrix} 2 & 0 \\ 3 & 1 \end{pmatrix}$$

symmetric NE: $\langle 0, 1 \rangle$

Hawk & Dove

$$U = \begin{pmatrix} 1 & 7 \\ 2 & 3 \end{pmatrix}$$

symmetric NE: $\langle .8, .2 \rangle$

Symmetrizing asymmetric games

Example: signaling game

- big population of agents
- every agent might be sender or receiver
- an agent's strategy is a pair $\langle s, r \rangle$ of pure sender and receiver strategies
- utilities are defined as the average of sender and receiver role:

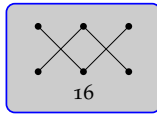
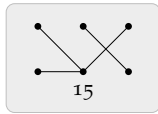
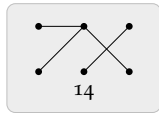
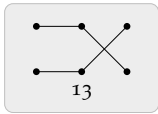
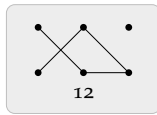
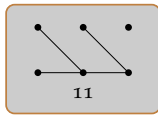
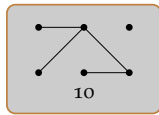
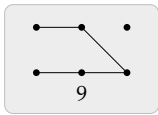
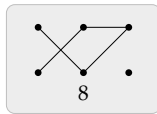
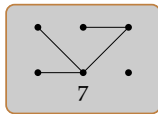
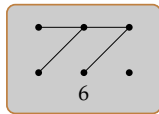
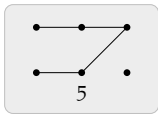
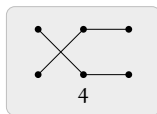
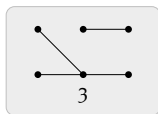
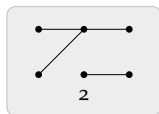
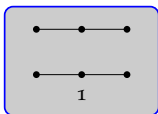
$$U(\langle s, r \rangle, \langle s', r' \rangle) = 1/2(U_S(s, r') + U_R(s', r))$$

Example (Symmetrized 2-2-2 Lewis game)

		s_1	s_2	s_3	s_4	s_5	s_6	s_7	s_8	s_9	s_{10}	s_{11}	s_{12}	s_{13}	s_{14}	s_{15}	s_{16}
s_1	$\langle m_1, m_1, a_1, a_1 \rangle$.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5
s_2	$\langle m_1, m_1, a_1, a_2 \rangle$.5	.5	.5	.5	.75	.75	.75	.75	.25	.25	.25	.25	.5	.5	.5	.5
s_3	$\langle m_1, m_1, a_2, a_1 \rangle$.5	.5	.5	.5	.25	.25	.25	.25	.75	.75	.75	.75	.5	.5	.5	.5
s_4	$\langle m_1, m_1, a_2, a_2 \rangle$.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5
s_5	$\langle m_1, m_2, a_1, a_1 \rangle$.5	.75	.25	.5	.5	.75	.25	.5	.5	.75	.25	.5	.5	.75	.25	.5
s_6	$\langle m_1, m_2, a_1, a_2 \rangle$.5	.75	.25	.5	.75	1	.5	.75	.25	.5	0	.25	.5	.75	.25	.5
s_7	$\langle m_1, m_2, a_2, a_1 \rangle$.5	.75	.25	.5	.25	.5	0	.25	.75	1	.5	.75	.5	.75	.25	.5
s_8	$\langle m_1, m_2, a_2, a_2 \rangle$.5	.75	.25	.5	.5	.75	.25	.5	.5	.75	.25	.5	.5	.75	.25	.5
s_9	$\langle m_2, m_1, a_1, a_1 \rangle$.5	.25	.75	.5	.5	.25	.75	.5	.5	.25	.75	.5	.5	.25	.75	.5
s_{10}	$\langle m_2, m_1, a_1, a_2 \rangle$.5	.25	.75	.5	.75	.5	1	.75	.25	0	.5	.25	.5	.25	.75	.5
s_{11}	$\langle m_2, m_1, a_2, a_1 \rangle$.5	.25	.75	.5	.25	0	.5	.25	.75	.5	1	.75	.5	.25	.75	.5
s_{12}	$\langle m_2, m_1, a_2, a_2 \rangle$.5	.25	.75	.5	.5	.25	.75	.5	.5	.25	.75	.5	.5	.25	.75	.5
s_{13}	$\langle m_2, m_2, a_1, a_1 \rangle$.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5
s_{14}	$\langle m_2, m_2, a_1, a_2 \rangle$.5	.5	.5	.5	.75	.75	.75	.75	.25	.25	.25	.5	.5	.5	.5	.5
s_{15}	$\langle m_2, m_2, a_2, a_1 \rangle$.5	.5	.5	.5	.25	.25	.25	.25	.75	.75	.75	.75	.5	.5	.5	.5
s_{16}	$\langle m_2, m_2, a_2, a_2 \rangle$.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5	.5

non-strict symmetric NE, strict symmetric NE

All pairs of sender-receiver pure strategies for the 2-2-2 Lewis game



Reading for Next Class

Brian Skyrms (2010) "Information" Chapter 3 of "Signals" OUP.

References

Lewis, David (1969). *Convention. A Philosophical Study*. Cambridge, MA: Harvard University Press.