# Mathematical and computational models of language evolution 

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## Evolutionary Game Theory

- populations of players
- individuals are (genetically) programmed for certain strategy
- individuals replicate and thereby pass on their strategy



## Utility and fitness

- number of offspring is monotonically related to average utility of a player
- high utility in a competition means the outcome improves reproductive chances (and vice versa)
- number of expected offspring (Darwinian "fitness") corresponds to expected utility against a population of other players
- genes of individuals with high utility will spread


## Extinction of non-rationalizable strategies

- strictly dominated strategies always have less-than-average reproduction rate
- their proportion thus converges towards zero
- once a strictly dominated strategies dies out (or almost dies out), it can be ignored in the utility matrix
- corresponds to elimination of a strictly dominated strategy
- process gets iterated in evolutionary dynamics
- long-term effect:


## Theorem

If a strategy $a_{i}$ is iteratively strictly dominated, then

$$
\lim _{t \rightarrow \infty} p_{t}\left(a_{i}\right)=0
$$

## Evolutionary stability (cont.)

- replication sometimes unfaithful (mutation)
- population is evolutionarily stable $\leadsto$ resistant against small amounts of mutation
- Maynard Smith (1982): static characterization of

Evolutionarily Stable Strategies
(ESS) in terms of utilities only

- related to Nash equilibria, but slightly different


## Evolutionary stability (cont.)

## Rock-Paper-Scissor

|  | R | P | S |
| ---: | ---: | ---: | ---: |
| R | 0 | -1 | 1 |
| P | 1 | 0 | -1 |
| S | -1 | 1 | 0 |

- one symmetric Nash equilibrium: $\left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}\right)$
- not evolutionarily stable though


## Evolutionary stability (cont.)

## Pigeon orientation game

- "players" are pigeons that go together on a journey
- $A$-pigeons can find their way back, $B$-pigeons cannot

|  | $A$ | $B$ |
| :---: | :---: | :---: |
| $A$ | 1 | 1 |
| $B$ | 1 | 0 |

## Evolutionary stability (cont.)

- $A$ is a non-strict Nash equilibrium, but nevertheless evolutionarily stable
- to be evolutionarily stable, a population must be able either
- to fight off invaders directly (strict Nash equilibrium)
- to successfully invade the invaders (non-strict Nash equilibrium)


## Evolutionary Stable Strategy

## Definition

The mixed strategy $\alpha$ is an Evolutionarily Stable Strategy in a symmetric two-person game iff

- $u(\alpha, \alpha) \geq u\left(\alpha^{\prime}, \alpha\right)$ for all $\alpha$, and
- if $u(\alpha, \alpha)=u\left(\alpha^{\prime}, \alpha\right)$ for some $\alpha^{\prime} \neq \alpha$, then $u\left(\alpha, \alpha^{\prime}\right)>u\left(\alpha^{\prime}, \alpha^{\prime}\right)$.

Strict Nash Equilibria
Evolutionarily Stable Strategies


Nash Equilibria

## Related stability notions

## Definition

The mixed strategy $\alpha$ is a Neutrally Stable Strategy in a symmetric two-person game iff

- $u(\alpha, \alpha) \geq u\left(\alpha^{\prime}, \alpha\right)$ for all $\alpha$, and
- if $u(\alpha, \alpha)=u\left(\alpha^{\prime}, \alpha\right)$ for some $\alpha^{\prime} \neq \alpha$, then $u\left(\alpha, \alpha^{\prime}\right) \geq u\left(\alpha^{\prime}, \alpha^{\prime}\right)$.


## Definition

The set of mixed strategies $A$ is an Evolutionarily Stable Set in a symmetric two-person game iff

- $u(\alpha, \alpha) \geq u\left(\alpha^{\prime}, \alpha\right)$ for all $\alpha$, and
- if $u(\alpha, \alpha)=u\left(\alpha^{\prime}, \alpha\right)$ for some $\alpha \notin A$, then $u\left(\alpha, \alpha^{\prime}\right)>u\left(\alpha^{\prime}, \alpha^{\prime}\right)$


## Related stability notions

## Some facts

- Every ESS is neutrally stable.
- Every element of an ESSet is neutrally stable.
- Every ESS forms a singleton ESSet.


## The Replicator Dynamics

- implicit assumption behind notion of ESS
- Populations are (practically) infinite.
- Each pair of individuals is equally likely to interact.
- The expected number of offspring of an individual (i.e., its fitness in the Darwinian sense) is monotonically related to its average utility.
- can be made explicit in a dynamic model


## Replicator Dynamics (cont.)

## easiest correlation between utility and fitness

$$
\begin{aligned}
& \text { expected number of offspring } \\
u(i, j)= & \text { of an individual of type } i \\
& \text { in a } j \text {-population }
\end{aligned}
$$

## Replicator Dynamics (cont.)

## Suppose

- time is discrete
- in each round, each pair of players is equally likely to interact


## Replicator Dynamics (cont.)

## Discrete time dynamics:

$$
N_{i}(t+1)=N_{i}(t)+N_{i}(t)\left(\sum_{j=1}^{n} x_{j} u(i, j)-d\right)
$$

$N(t)$... population size at time $t$
$N_{i}(t)$... number of players playing strategy $s_{i}$
$x_{j}(t) \ldots \frac{N_{j}(t)}{N(t)}$
$d$... death rate

## Replicator Dynamics (cont.)

generalizing to continuous time:

$$
N_{i}(t+\Delta t)=N_{i}+\Delta t N_{i}\left(\sum_{j=1}^{n} x_{j} u(i, j)-d\right)
$$

thus

$$
\frac{\Delta N_{i}}{\Delta t}=N_{i}\left(\sum_{j=1}^{n} x_{j} u(i, j)-d\right)
$$

## Replicator Dynamics (cont.)

if $\Delta t \rightarrow 0$

$$
\frac{d N_{i}}{d t}=N_{i}\left(\sum_{j=1}^{n} x_{j} u(i, j)-d\right)
$$

## Replicator Dynamics (cont.)

size of entire population may also change:

$$
\begin{aligned}
N(t+\Delta t) & =\sum_{i=1}^{n}\left(N_{i}+\Delta t\left(N_{i} \sum_{j=1}^{n} x_{j} u(i, j)-d\right)\right) \\
& =N+\Delta t\left(N \sum_{i=1}^{n} x_{i} \sum_{j=1}^{n} x_{j} u(i, j)\right)
\end{aligned}
$$

hence

$$
\frac{d N}{d t}=N\left(\sum_{i=1}^{n} x_{i}\left(\sum_{j=1}^{n} x_{j} u(i, j)-d\right)\right)
$$

## Replicator Dynamics (cont.)

let

$$
\begin{aligned}
\sum_{j=1}^{n} x_{j} u(i, j) & =\tilde{u}_{i} \\
\sum_{i=1}^{n} x_{i} \tilde{u}_{i} & =\tilde{u}
\end{aligned}
$$

then we have

$$
\begin{aligned}
\frac{d N_{i}}{d t} & =N_{i}\left(\tilde{u}_{i}-d\right) \\
\frac{d N}{d t} & =N(\tilde{u}-d)
\end{aligned}
$$

## Replicator dynamics (cont.)

remember some calculus?

$$
\left(\frac{u}{v}\right)^{\prime}=\frac{u^{\prime} v-u v^{\prime}}{v^{2}}
$$

## Replicator dynamics (cont.)

## remember some calculus?

$$
\begin{gathered}
\left(\frac{u}{v}\right)^{\prime}=\frac{u^{\prime} v-u v^{\prime}}{v^{2}} \\
\frac{d x_{i}}{d t}=\frac{\left(N N_{i}\left(\tilde{u}_{i}-d\right)-\left(N_{i} N(\tilde{u}-d)\right)\right)}{N^{2}} \\
=x_{i}\left(\tilde{u}_{i}-\tilde{u}\right)
\end{gathered}
$$

## Pigeon orientation

- each ESS is an asymptotically stable state (in finite games, that is...)
- inverse does not always hold (but we will only consider games where it does)
- a.k.a. point attractors
- sample dynamics:

$x$-axis: time
$y$-axis: proportion of $A$-players


## Rock-Paper-Scissor again

- three-strategy game: two independent variables
- number of R-players
- number of P-players
- number of S-players follows because everything sums up to 1
- supressing time dimension gives orbits



## Asymmetric games

- symmetric games:
- same strategy set for both players
- $u_{A}(i, j)=u_{B}(j, i)$ for all strategies $s_{i}, s_{j}$
- evolutionary interpretation: symmetric interaction within one population
- asymmetric games:
- players have different strategy sets or utility matrices
- evolutionary interpretation
- different roles within one population (like incumbent vs. intruder, speaker vs. hearer, ...), or
- interaction between disjoint populations
- evolutionary behavior differs significantly!


## Asymmetric games (cont.)

## Hawks and Doves

|  | H | D |
| :---: | :---: | :---: |
| H | 1,1 | 7,2 |
| D | 2,7 | 3,3 |

- can be interpreted symmetrically or asymmetrically
- symmetric interpretation:
- hawks prefer to interact with doves and vice versa
- ESS: $80 \%$ hawks / $20 \%$ doves
- both strategies have average utility of 2.2
- dynamics:


## Symmetric Hawk-and-doves

- if hawks exceed 80\%, doves thrive, and vice versa
- 80:20 ratio is only attractor state



## Asymmetric Hawks-and-doves

- suppose two-population setting:
- both $A$ and $B$ come in hawkish and dovish variant
- everybody only interacts with individuals from opposite "species"
- excess of $A$-hawks helps $B$-doves and vice versa
- population push each other into opposite directions


## Hawks and doves

- 80:20 ratio in both populations is stationary
- not an attractor, but repellor



## Asymmetric stability

- crucial difference to symmetric games: mutants do not play against themselves
- makes second clause of the symmetric ESS superfluous


## Theorem (Selten 1980)

In asymmetric games, a configuration is an ESS iff it is a strict Nash equilibrium.

## Asymmetric replicator dynamic

$$
\begin{aligned}
\frac{d x_{i}}{d t} & =x_{i}\left(\sum_{j=1}^{n} y_{j} u_{A}(i, j)-\sum_{k=1}^{n} x_{k} \sum_{j=1}^{n} y_{j} u_{A}(k, j)\right) \\
\frac{d y_{i}}{d t} & =y_{i}\left(\sum_{j=1}^{m} x_{j} u_{B}(i, j)-\sum_{k=1}^{n} y_{k} \sum_{j=1}^{m} x_{j} u_{B}(k, j)\right)
\end{aligned}
$$

$x_{i} \ldots$ proportion of $s_{i}^{A}$ within the $A$-population $y_{i} \ldots$ proportion of $s_{i}^{B}$ within the $B$-population

## Symmetrizing asymmetric games

- asymmetric games can be "symmetrized"
- correspondig symmetric game shares Nash equilibria and ESSs
- new strategy set:

$$
S^{A B}=S^{A} \times S^{B}
$$

- new utility function

$$
u^{A B}(\langle i, j\rangle,\langle k, l\rangle)=u^{A}(i, l)+u^{B}(j, k)
$$

## Stability in symmetrized games

## strict Nash equilibria

In symmetrized games, the asymptotically stable states are exactly the strict Nash equilibria. (Selten 1980)


## Stability in symmetrized games

## neutrally stable states

In symmetrized games, a strategy is Lyapunov stable iff it is a neutrally stable state. (Cressman 2003)


## Stability in symmetrized games

## ESSets

In symmetrized games, a set of strategies is an asymptotically stable set of rest points iff it is an ESSet.


## Exercises

(1) Find the symmetric ESSs of the following games (provided they exist):

- Prisoner's dilemma
- Stag hunt
(2) Find the asymmetric ESSs of the following games (again, provided they exist):
- Bach or Stravinsky
- Matching pennies
(3) Symmetrize the asymmetric version of Hawks and Doves and find the symmetric ESSs of the result. Which configuration in the original game do they correspond to?

