

# Game Theory Examples

Adopted from Sarit Kraus  
"Strategic Negotiation in  
Multi-Agent Environments"

# Strategic Negotiation Model

- A set of agents involved in a turn-taking negotiation (offering solution)
  - Offer ! Yes/no/opt out
- Assumptions
  1. Rational agents
  2. Avoid opting out
  3. Commitments are kept
  4. No long term commitments
  5. Common belief (1-4)

# Utility Functions

- Fixed loss/gain per period
  - $U^i(o,t) = U^i(o,0) + t * C$
- Time constant discount
  - $U^i(o,t) = \delta_i^t * U^i(o,0), \delta \in [0;1]$
- Financial interest rate model
  - $U^i(o,t) = 1/(1+r)U^i(o,0) + C (1+r)/r * (1-1/(1+r)^t)$
- Finite horizon models
  - $U^i(o,t) = U^i(o,0) * (1-t/N) - t * C$
- $U(o,0)$  initial value,  $C = \text{cost /loss per period}$

# Game Solutions

- Nash Equilibrium
  - No agent can benefit from deviation given actions of others
- Sub-game perfect equilibrium
  - At each stage a Nash equilibrium is the solution
- Sequential equilibrium
  - Given incomplete information, a Nash equilibrium is determined based on belief

# Case 1: Negotiation about resource allocation

- Two agents negotiate about a common resource
- Ex: Two robots on Mars
  - NASA and ESA.
- Bilateral negotiation
- Two agents
  - Attached agent – holder of the resource
  - Waiting agent – Waiting to gain access to resource
- Fixed resources, say  $M$
- Solution:  $s_a + s_w = M$

# Motivation

- Future negotiation
  - Fear of future loss
- Waiting agent threat
  - The other agent might destroy resource
- Costless process
  - The actual negotiation is inexpensive

# Utility Function Properties

- A0: Disagreement the worst outcome
  - For  $x \in \{ |S| \cup \text{OPT} \} \cap T$ :  $U^i(\text{disagree}) < U^i(x)$
- A1: The resource is valuable
  - For  $t \in T, r, s \in S$ :  $r > s \Rightarrow U^i(r, t) > U^i(s, t)$
  - Maximize access to resource
- A2: Cost benefit over time
  - For  $t_1, t_2 \in T, t_1 < t_2$ :
  - $U^W(s, t_1) < U^W(s, t_2)$  and  $U^A(s, t_1) > U^A(s, t_2)$

# Utility Function Properties II

- A3: Agreements cost over time
  - $i \in \{A, W\}, \forall t_1, t_2 \in T, s_1, s_2 \in S, c_i$
  - $U^i(s_1, t_1) > U^i(s_2, t_2)$  iff
  - $(s_i + c_i t_1) > (s_{2i} + c_i t_2)$
- A4: Cost of opting out over time
  - $\forall t \in T$ :
  - $U^W(\text{opt}, t) > U^W(\text{opt}, t+1)$  &  
 $U^A(\text{opt}, t) < U^A(\text{opt}, t+1)$



# Range of agreements

- A5:  $8 \leq t \leq T$ 
  - If  $\text{Possible}^{t+1} \neq \emptyset \Rightarrow \text{Possible}^t \neq \emptyset$
  - If  $\text{Possible}^{t+1} \neq \emptyset \Rightarrow$ 
    - $U^W(s^{w,t},t) \leq U^W(s^{w,t+1},t+1)$
    - $U^W(\text{opt},t) \leq U^W(s^{w,t+1},t+1)$
    - $U^A(s^{w,t+1},t+1) \leq U^A(s^{w,t},t)$
  - If  $\text{Possible}^t \neq \emptyset \Rightarrow$ 
    - $U^A(s^{w,t},t) \leq U^A(\text{opt},t+1)$

# Agreements are possible

- A6: Possible agreements
  - $\text{Possible}^0 \neq \emptyset$  and  $\text{Possible}^1 \neq \emptyset$
  - During the first two periods there are outcomes better than opting out

# Example

- NASA & ESA have two robots on Mars
  - Joint mission
  - NASA damaged antenna (1 day repair)
    - Use of backup line is expensive
  - Sharing of ESA antenna
  - ESA is using some NASA equipment in its experiments

# Example

- ESA is earning \$5000 / minute of experimentation
- NASA is loosing \$3000 / minute of backup line usage
- Per minute of shared usage \$1000 is earned by each group
- NASA total gain is \$550000, loss of \$1000 / minute of negotiation
- ESA cost of US equipment is \$100000 if the opt out.
- Constant gain/loss example with a finite horison

# Formally

- $U^e(s,t) = 1000 s_e + 5000 t$
- $U^e(\text{opt}_n,t)=5000 t$
- $U^e(\text{opt}_e,t) = 5000 t - 100000$
- $U^n(s,t) = 1000 s_n - 3000 t$
- $U^n(\text{opt}_n,t) = 550000 - 1000 t$
- $U_n(\text{opt}_e,t) = -1000 t$
- $M = 1440$  (1 day = 1440 minutes)

# Formally

- $c_e = 5, c_n = -3$
- $s^{n,t} = (890 - 2t, 550 + 2t)$
- $U^n(s^{n,t}, t) = (550 - t) * 10^3$
- $U^e(s^{n,t}, t) = (890 + 3t) * 10^3$
- An agreement is achieved in the second period (888, 552)
  - ESA earn over time, but opting out might cause a loss, NASA losses over time, but waiting might not result in getting access

# What could a mediator do?

- Earliest solution that is "popular"
- Nash product is an approach
  - Maximization of
  - $(U^A(x,0) - U^A(\text{opt}_a, 0)) \text{£ } (U^W(x,0) - U^W(\text{opt}_w, 0))$
- As loss by W is larger than gain by A, W will prefer an early solution (step 1), while A prefers a late solution. Mediator solution will be a solution is step 1. Asymmetries cause a preference for mediation.

## Case 2: Negotiation about Task Distribution

- Several agents to share a common task
- $M$  jobs to be completed
- Time before an agreement = loss
- Agreement  $s_1 + s_2 = M$



# Attributes of Utility Function

- A1: Actions are costly
  - $t \in T, r, s \in S$ :  
 $r_i > s_i \Rightarrow U^i(r, t) < U^i(s, t)$
- A2: Time is valuable
  - $t_1, t_2 \in T, s \in S$ :  
 $t_1 < t_2 \Rightarrow U^i(s, t_1) > U^i(s, t_2)$
- A3: Agreements cost over time
  - Each agent has a cost  $c_i > 0$  such that
  - $\forall r, s \in S \forall t_1, t_2 \in T$ :  
 $U^i(s, t_2) > U^i(r, t_2)$  iff  $(s_i - c_i t_1) > (r_i - c_i t_2)$

# Attributes of Utility Function

- A4: Opting out costs more over time
  - $\forall t_1, t_2 \in T$ :  
 $t_1 < t_2 \Rightarrow U^i(\text{opt}, t_1) < U^i(\text{opt}, t_2)$
- A5: Agreements vs Opting Out
  - $\forall t \in T$ :  
 $U^i(s, t) > U^i(\text{opt}, t) \Leftrightarrow U^i(s, t-1) > U^i(\text{opt}, t-1)$
- A6: Time period when an agreement is not possible
  - $\forall t \in T$ :  $\text{Possible}^t = \emptyset$ ,  $t_m = \min t$ ,  $\text{Possible}^0 \neq \emptyset$

# Solution

- A solution is always reached
- If agent  $i$  is to propose a solution at  $t_m - 1$ , it will suggest its sub-game perfect equil. The other will accept it.

# Ex: delivery of newsletters

- Two news agencies N1, N2
- Two delivery agents D1, D2
- N1! D1 is paid \$200,  
N2! D2 is paid \$225
- Delivery cost \$1, A period of wait is \$1
- M subscribers of N1 and N2
- If agreement N1! D1 = \$170,  
N2! D2 = \$200,  
Still \$1 / call, \$2 / period of wait

# Formally

- $U^1(\text{opt}, t) = 200 - M - t \text{ } \text{€}$   
 $U^1(s, t) = 170 - s_1 - 2t$
- $U^2(\text{opt}, t) = 225 - M - t \text{ } \text{€}$   
 $U^2(s, t) = 200 - s_2 - 2t$
- Ex:  $M=100$ ) :
  - $s^{2,t}=(69-t, 31+t),$   
 $s^{1,t}=(26+t, 74-t),$   
 $t_m = 22$  ) agreement (46,54)