

A tutorial on game theory for wireless networks

Jean-Pierre Hubaux
EPFL

static games;
dynamic games;
repeated games;
strict and weak
dominance;
Nash equilibrium;
Pareto optimality;
Subgame perfection;
...

Chapter outline

B.1 Introduction

B.2 Static games

B.3 Dynamic games

B.4 Repeated games

Brief introduction to Game Theory

- Discipline aiming at modeling situations in which actors have to make decisions which have mutual, **possibly conflicting**, consequences
- Classical applications: **economics**, but also politics and biology
- Example: should a company invest in a new plant, or enter a new market, considering that the **competition** *may* make similar moves?
- Most widespread kind of game: **non-cooperative** (meaning that the players do not attempt to find an agreement about their possible moves)

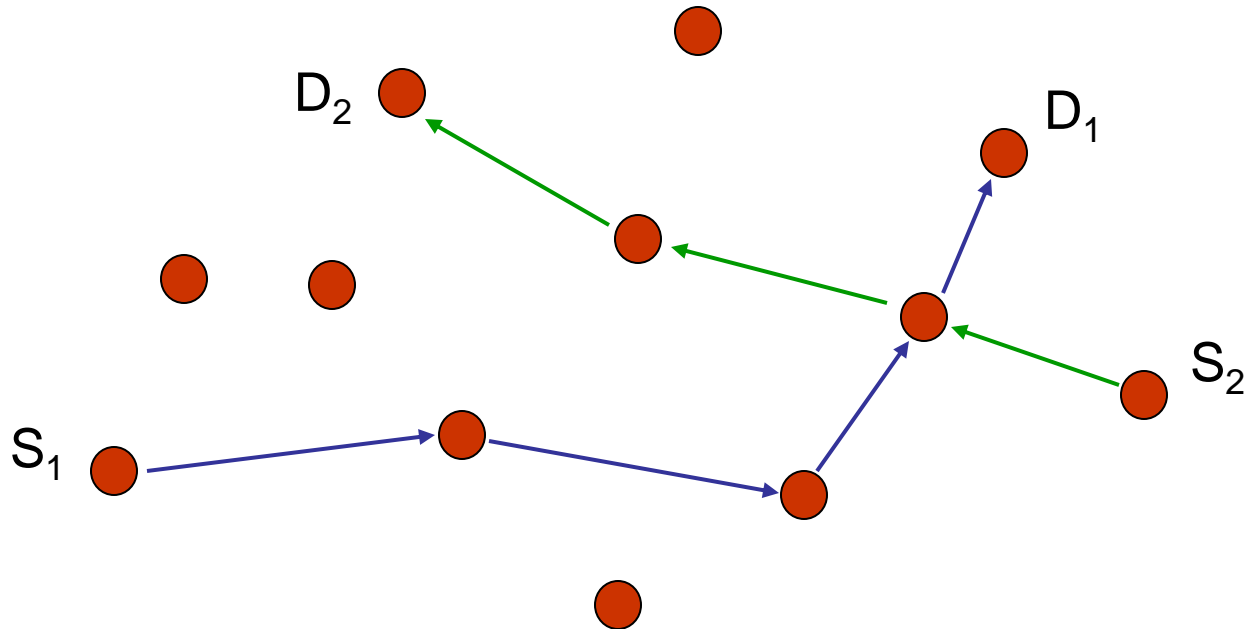
Classification of games

Non-cooperative	Cooperative
Static	Dynamic (repeated)
Strategic-form	Extensive-form
Perfect information	Imperfect information
Complete information	Incomplete information

Perfect info: each player knows the identity of other players and, for each of them, the payoff resulting of each strategy.

Complete info: each player can observe the action of each other player.

Cooperation in self-organized wireless networks



**Usually, the devices are assumed to be cooperative.
But what if they are not?**

Chapter outline

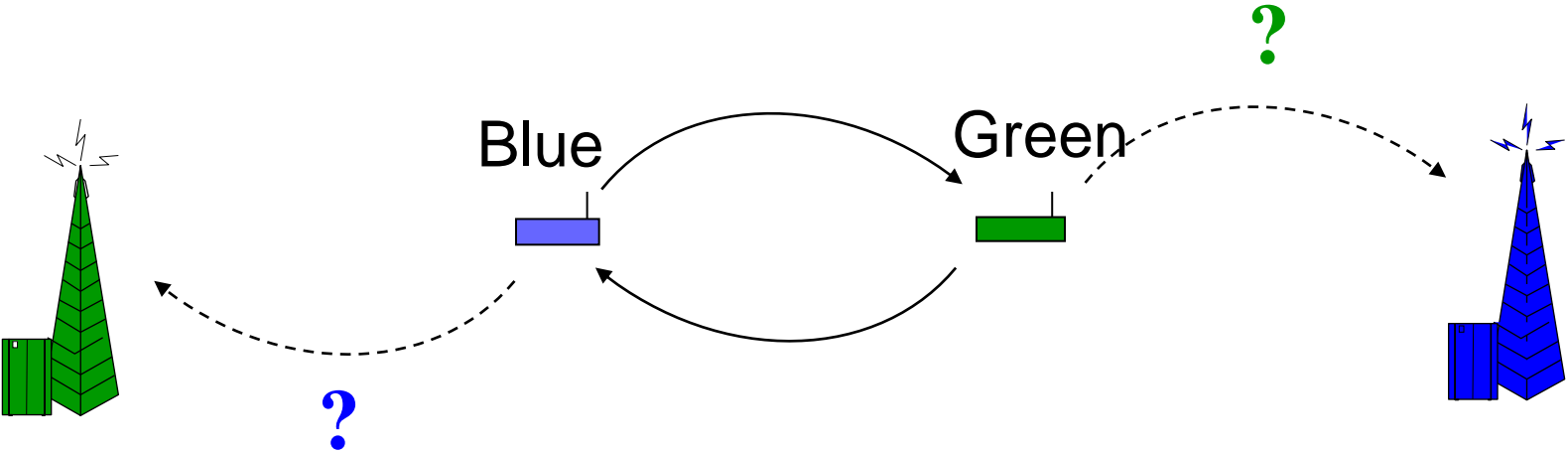
B.1 Introduction

B.2 Static games

B.3 Dynamic games

B.4 Repeated games

Example 1: The Forwarder's Dilemma



From a problem to a game

- users controlling the devices are **rational** = try to maximize their benefit
- game formulation: $G = (P, S, U)$
 - P: set of players
 - S: set of strategy functions
 - U: set of payoff functions →
 - Reward for packet reaching the destination: 1
 - Cost of packet forwarding: c ($0 < c \ll 1$)
- **strategic-form** representation

		Green	
		Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 1)$
	Drop	$(1, -c)$	$(0, 0)$

Solving the Forwarder's Dilemma (1/2)

Strict dominance: strictly best strategy, for any strategy of the other player(s)

Strategy s_i strictly dominates if

$$u_i(s_i, s_{-i}) > u_i(s'_i, s_{-i}), \forall s_{-i} \in S_{-i}, \forall s'_i \in S_i$$

where: $u_i \in U$ payoff function of player i

$s_{-i} \in S_{-i}$ strategies of all players except player i

In Example 1, strategy Drop **strictly dominates** strategy Forward

		Green	
	Blue	Forward	Drop
Forward		(1-c, 1-c)	(-c, 1)
Drop		(1, -c)	(0, 0)

Solving the Forwarder's Dilemma (2/2)

Solution by iterative strict dominance:

		Green	
		Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 1)$
	Drop	$(1, -c)$	$(0, 0)$

BUT

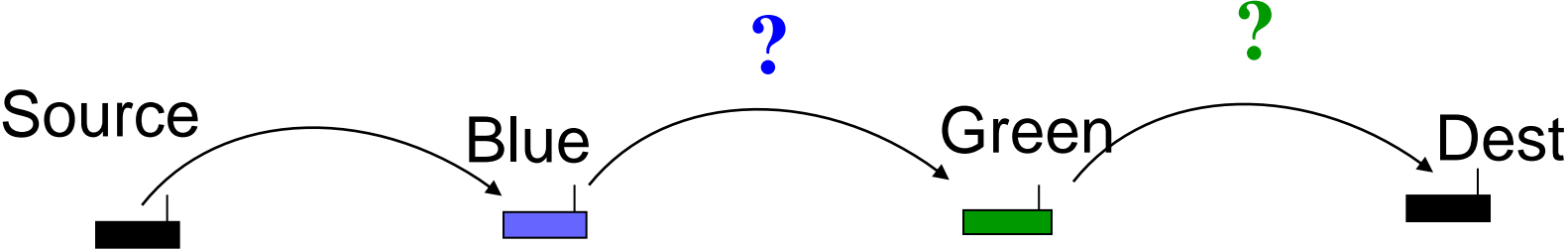
Drop *strictly dominates* Forward

Forward would result in a *better outcome*

} Dilemma

Result: Tragedy of the commons ! (Hardin, 1968)

Example 2: The Joint Packet Forwarding Game



- Reward for packet reaching the destination: 1
- Cost of packet forwarding: c ($0 < c \ll 1$)

		Green	
		Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 0)$
	Drop	$(0, 0)$	$(0, 0)$

No strictly dominated strategies !

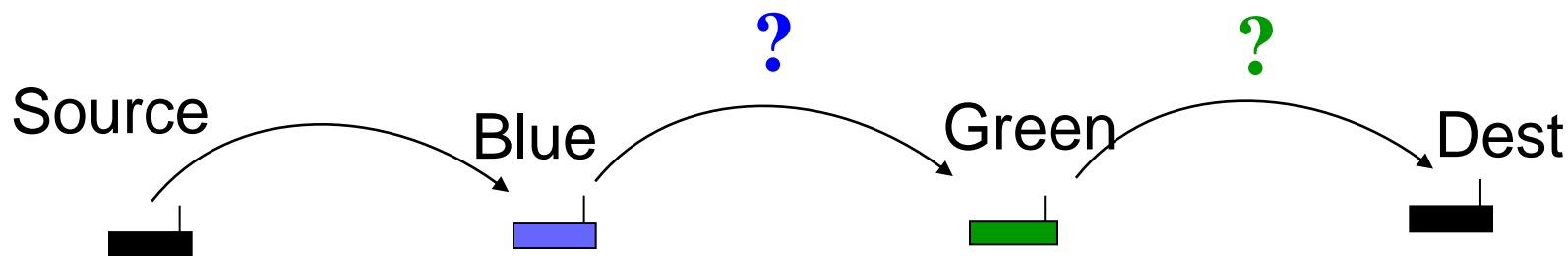
Weak dominance

Weak dominance: strictly better strategy for at least one opponent strategy

Strategy s'_i is weakly dominated by strategy s_i if

$$u_i(s'_i, s_{-i}) \leq u_i(s_i, s_{-i}), \forall s_{-i} \in S_{-i}$$

with strict inequality for at least one s_{-i}



Iterative weak dominance

BUT

The result of the iterative weak dominance is not unique in general !

	Green	
	Blue	
Blue	Forward	Drop
Forward	(1-c, 1-c)	(-c, 0)
Drop	(0, 0)	(0, 0)

Nash equilibrium (1/2)

Nash Equilibrium: no player can increase its payoff by deviating unilaterally

E1: The Forwarder's Dilemma

		Green	
		Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 1)$
	Drop	$(1, -c)$	$(0, 0)$

E2: The Joint Packet Forwarding game

		Green	
		Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 0)$
	Drop	$(0, 0)$	$(0, 0)$

Nash equilibrium (2/2)

Strategy profile s^* constitutes a **Nash equilibrium** if, for each player i ,

$$u_i(s_i^*, s_{-i}^*) \geq u_i(s_i, s_{-i}^*), \forall s_i \in S_i$$

where: $u_i \in U$ payoff function of player i

$s_i \in S_i$ strategy of player i

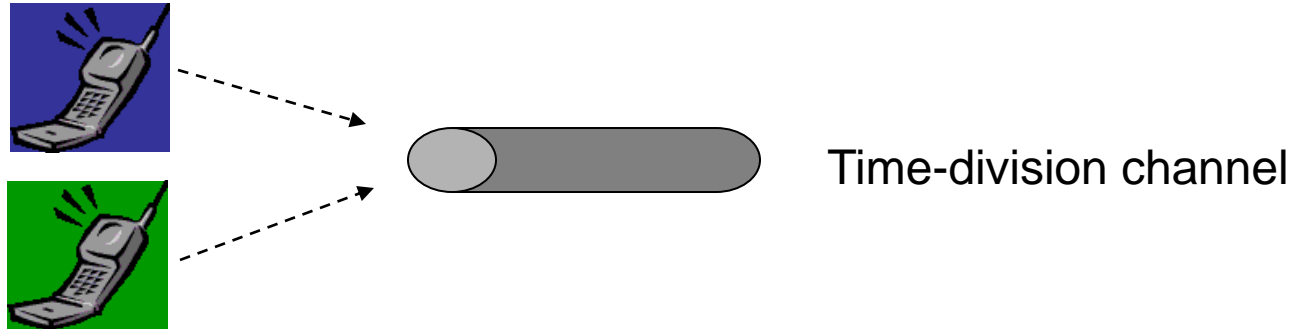
The **best response** of player i to the profile of strategies s_{-i} is a strategy s_i such that:

$$b_i(s_{-i}) = \arg \max_{s_i \in S_i} u_i(s_i, s_{-i})$$

Nash Equilibrium = Mutual best responses

Caution! Many games have more than one Nash equilibrium

Example 3: The Multiple Access game



Reward for successful transmission: 1

Cost of transmission: c
($0 < c \ll 1$)

		Green	
		Quiet	Transmit
Blue	Quiet	$(0, 0)$	$(0, 1-c)$
	Transmit	$(1-c, 0)$	$(-c, -c)$

There is no strictly dominating strategy

There are two Nash equilibria

Mixed strategy Nash equilibrium

p: probability of transmit for Blue

q: probability of transmit for Green

$$u_{blue} = p(1-q)(1-c) - pqc = p(1-c-q)$$

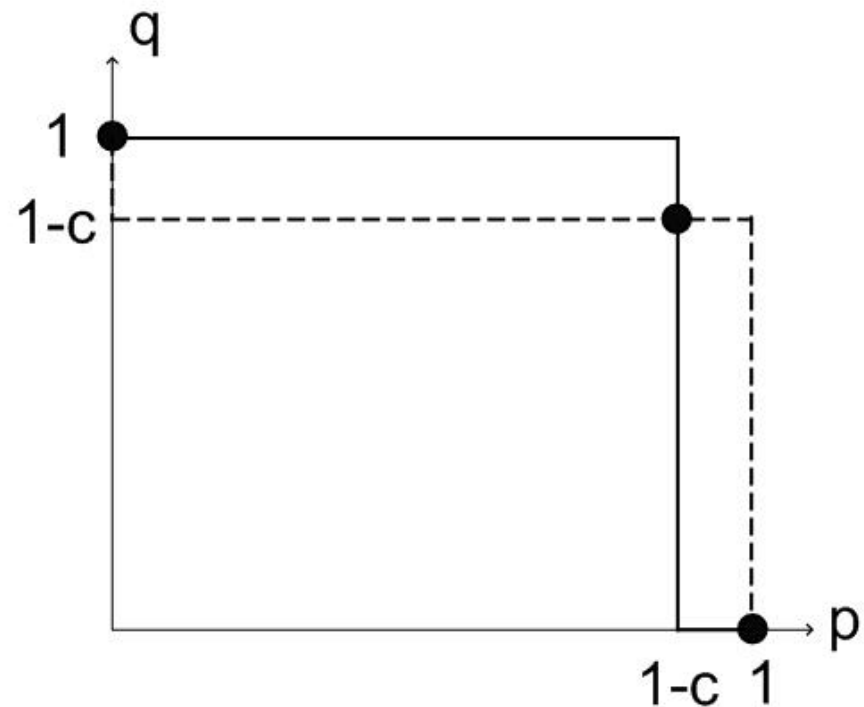
$$u_{green} = q(1-c-p)$$

objectives

- Blue: choose p to maximize u_{blue}
- Green: choose q to maximize u_{green}

$$p = 1 - c, \quad q = 1 - c$$

is a Nash equilibrium



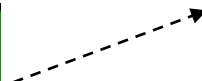
Example 4: The Jamming game

transmitter



two channels:
 C_1 and C_2

jammer



transmitter:

- reward for successful transmission: 1
- loss for jammed transmission: -1

jammer:

- reward for successful jamming: 1
- loss for missed jamming: -1

	Green		
Blue		C_1	C_2
C_1		$(-1, 1)$	$(1, -1)$
C_2		$(1, -1)$	$(-1, 1)$

There is no pure-strategy Nash equilibrium

$$p = \frac{1}{2}, q = \frac{1}{2} \text{ is a Nash equilibrium}$$

p : probability of transmit on C_1 for Blue

q : probability of transmit on C_1 for Green

Theorem:

Every finite strategic-form game has a mixed-strategy Nash equilibrium.

Efficiency of Nash equilibria

E2: The Joint Packet Forwarding game

		Green	
		Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 0)$
	Drop	$(0, 0)$	$(0, 0)$

How to choose between several Nash equilibria ?

Pareto-optimality: A strategy profile is Pareto-optimal if it is not possible to increase the payoff of any player without decreasing the payoff of another player.

How to study Nash equilibria ?

Properties of Nash equilibria to investigate:

- uniqueness
- efficiency (Pareto-optimality)
- emergence (dynamic games, agreements)

Chapter outline

B.1 Introduction

B.2 Static games

B.3 Dynamic games

B.4 Repeated games

Extensive-form games

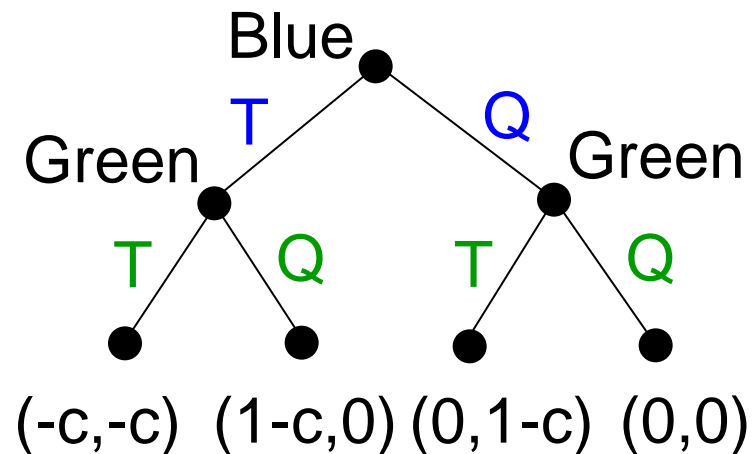
- usually to model sequential decisions
- game represented by a tree
- Example 3 modified: the **Sequential** Multiple Access game: Blue plays first, then Green plays.



Time-division channel

Reward for successful transmission: 1

Cost of transmission: c
($0 < c \ll 1$)

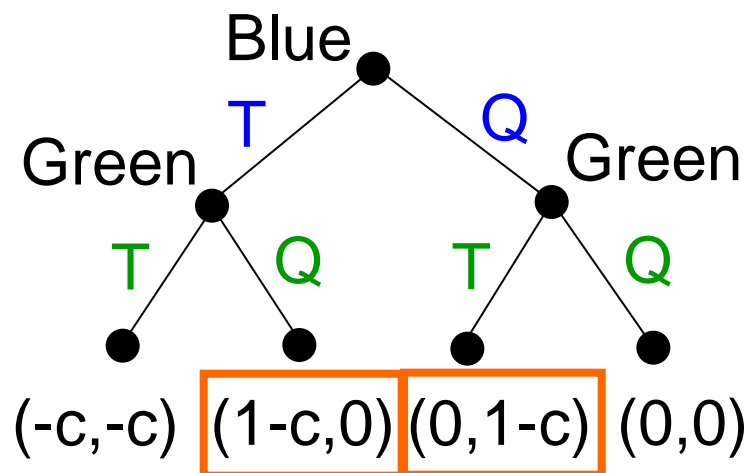


Strategies in dynamic games

- The strategy defines the moves for a player for every node in the game, even for those nodes that are not reached if the strategy is played.

strategies for **Blue**:
T, Q

strategies for **Green**:
TT, TQ, QT and QQ

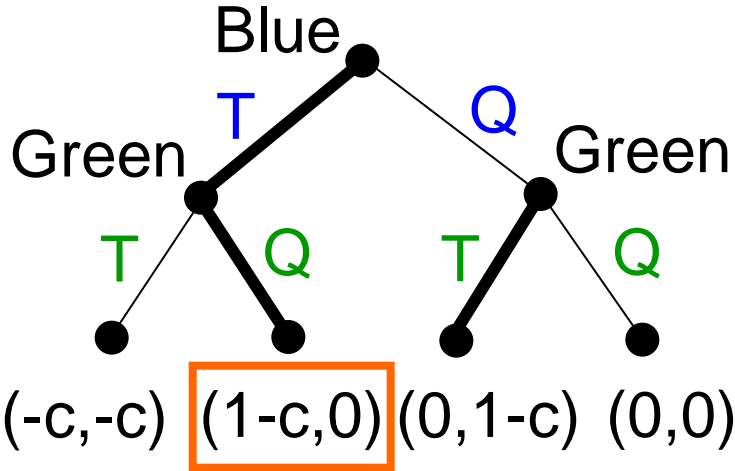


TQ means that player p2 transmits if p1 transmits and remains quiet if p1 remains quiet.

Backward induction

- Solve the game by reducing from the final stage
- Eliminates Nash equilibria that are *incredible threats*

Incredible threat: (Q, TT)



Backward induction solution: $h=\{T, Q\}$

Subgame perfection

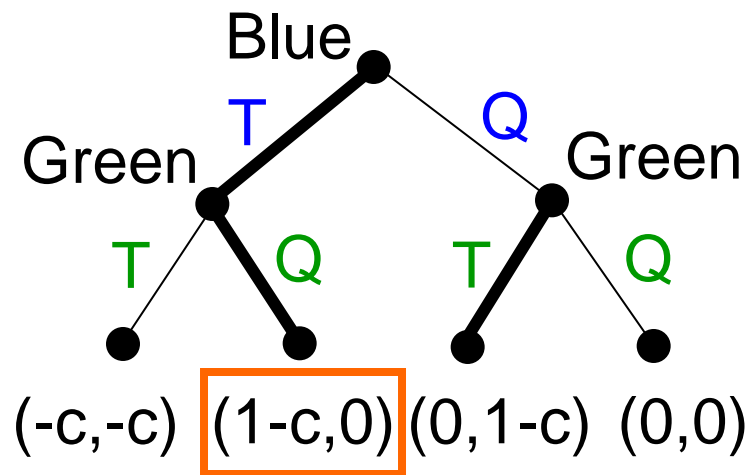
- Extends the notion of Nash equilibrium

One-deviation property: A strategy s_i conforms to the *one-deviation property* if there does not exist any node of the tree, in which a player i can gain by deviating from s_i and apply it otherwise.

Subgame perfect equilibrium: A strategy profile s constitutes a subgame perfect equilibrium if the one-deviation property holds for every strategy s_i in s .

Finding subgame perfect equilibria using backward induction

Subgame perfect equilibria:
(T, QT) and (T, QQ)



Stackelberg games have one leader and one or several followers

Chapter outline

B.1 Introduction

B.2 Static games

B.3 Dynamic games

B.4 Repeated games

Repeated games

- repeated interaction between the players (in **stages**)
- **move**: decision in one interaction
- **strategy**: defines how to choose the next move, given the previous moves
- **history**: the ordered set of moves in previous stages
 - most prominent games are history-1 games (players consider only the previous stage)
- **initial move**: the first move with no history
- finite-horizon vs. infinite-horizon games
- stages denoted by **t** (or **k**)

Utilities: Objectives in the repeated game

- finite-horizon vs. infinite-horizon games
- myopic vs. long-sighted repeated game

myopic: $\bar{u}_i = u_i(t+1)$

long-sighted finite: $\bar{u}_i = \sum_{t=0}^T u_i(t)$

long-sighted infinite: $\bar{u}_i = \sum_{t=0}^{\infty} u_i(t)$

payoff with discounting: $\bar{u}_i = \sum_{t=0}^{\infty} u_i(t) \cdot \omega^t$

$0 < \omega \leq 1$ is the discounting factor

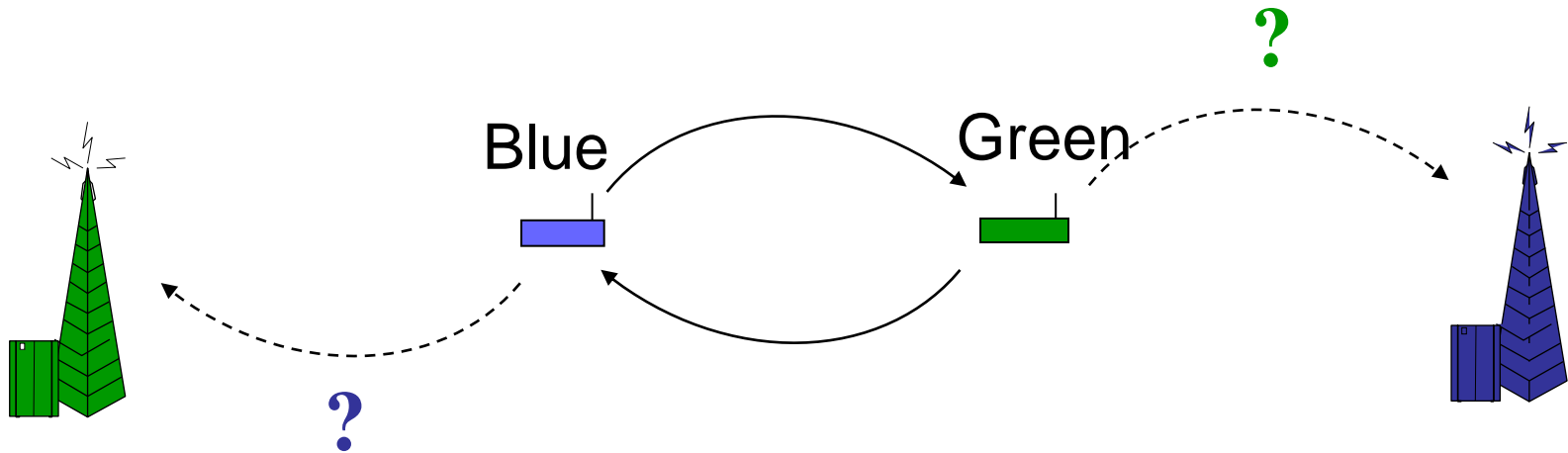
Strategies in the repeated game

- usually, history-1 strategies, based on different inputs:
 - others' behavior: $m_i(t+1) = s_i[m_{-i}(t)]$
 - others' and own behavior: $m_i(t+1) = s_i[m_i(t), m_{-i}(t)]$
 - payoff: $m_i(t+1) = s_i[u_i(t)]$

Example strategies in the Forwarder's Dilemma:

Blue (t)	initial move	F	D	strategy name
Green (t+1)	F	F	F	AllC
	F	F	D	Tit-For-Tat (TFT)
	D	D	D	AllD
	F	D	F	Anti-TFT

The Repeated Forwarder's Dilemma



		Green	
	Blue	Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 1)$
Blue	Drop	$(1, -c)$	$(0, 0)$

stage payoff

Analysis of the Repeated Forwarder's Dilemma (1/3)

infinite game with discounting: $\bar{u}_i = \sum_{t=0}^{\infty} u_i(t) \cdot \omega^t$

Blue strategy	Green strategy
AIID	AIID
AIID	TFT
AIID	AIIC
AIIC	AIIC
AIIC	TFT
TFT	TFT

Blue payoff	Green payoff
0	0
1	-c
$1/(1-\omega)$	$-c/(1-\omega)$
$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$
$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$
$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$

Analysis of the Repeated Forwarder's Dilemma (2/3)

Blue strategy	Green strategy	Blue payoff	Green payoff
AIID	AIID	0	0
AIID	TFT	1	-c
AIID	AIIC	$1/(1-\omega)$	$-c/(1-\omega)$
AIIC	AIIC	$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$
AIIC	TFT	$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$
TFT	TFT	$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$

- AIIC receives a high payoff with itself and TFT, but
- AIID exploits AIIC
- AIID performs poor with itself
- TFT performs well with AIIC and itself, and
- TFT retaliates the defection of AIID

TFT is the best strategy if ω is high !

Analysis of the Repeated Forwarder's Dilemma (3/3)

Blue strategy	Green strategy	Blue payoff	Green payoff
AIID	AIID	0	0
TFT	TFT	$(1-c)/(1-\omega)$	$(1-c)/(1-\omega)$

Theorem: In the Repeated Forwarder's Dilemma, if both players play AIID, it is a Nash equilibrium.

Theorem: In the Repeated Forwarder's Dilemma, both players playing TFT is a Nash equilibrium as well.

The Nash equilibrium $s_{\text{Blue}} = \text{TFT}$ and $s_{\text{Green}} = \text{TFT}$ is Pareto-optimal (but $s_{\text{Blue}} = \text{AIID}$ and $s_{\text{Green}} = \text{AIID}$ is not) !

Experiment: Tournament by Axelrod, 1984

- any strategy can be submitted (history-X)
 - strategies play the Repeated Prisoner's Dilemma (Repeated Forwarder's Dilemma) in pairs
 - number of rounds is finite but unknown
- ↓
- TFT was the winner
 - second round: TFT was the winner again

R. Axelrod *The Evolution of Cooperation*
Basic Books, 1984

An Example beyond Engineering

		Country 2	
		Reduce military investment	Increase military investment
Country 1	Reduce military investment	(1, 1)	(-1, 2)
	Increase military investment	(2, -1)	(0, 0)

Payoffs:

2: I have weaponry superior to the one of the opponent

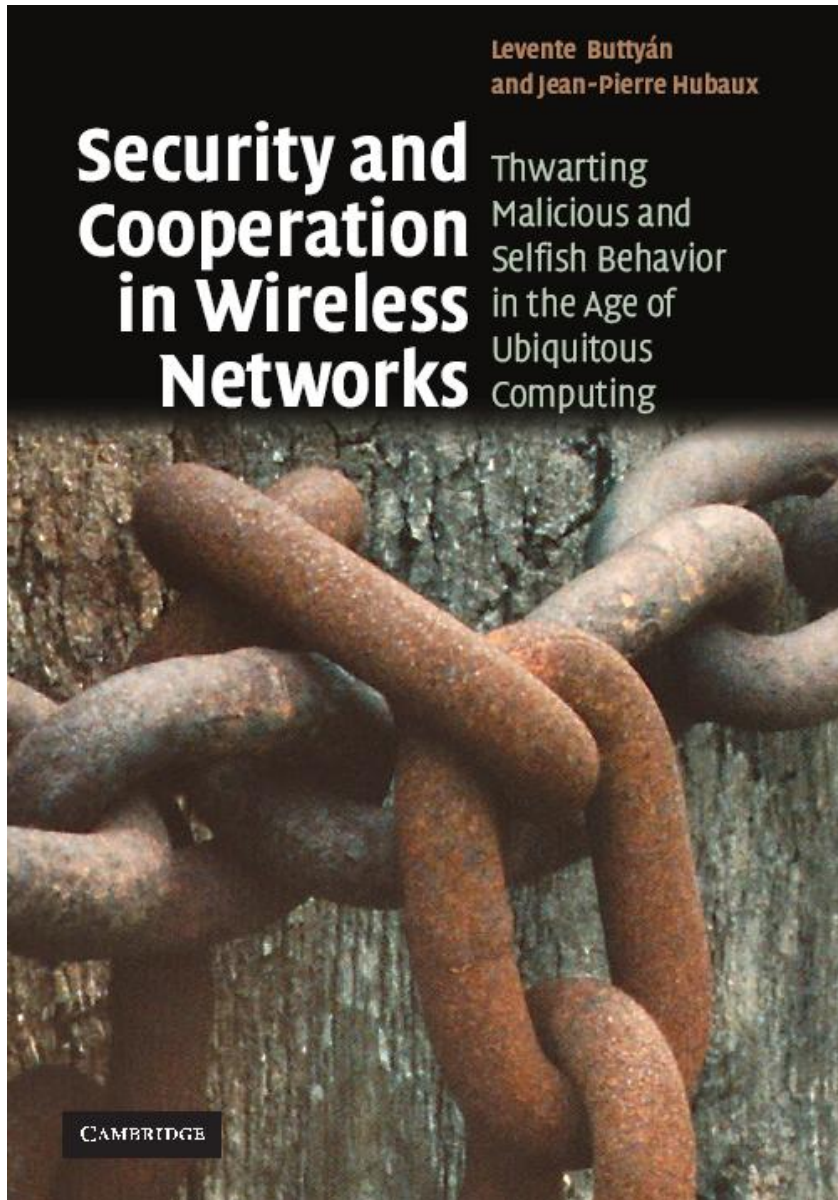
1: We have equivalent weaponry and managed to reduce it on both sides

0: We have equivalent weaponry and did not managed to reduce it on both sides

-1: My opponent has weaponry that is superior to mine

Discussion on game theory

- Rationality
- Payoff function and cost
- Pricing and mechanism design (to promote desirable solutions)
- Infinite-horizon games and discounting
- Reputation
- Cooperative games
- Imperfect / incomplete information



<http://secowinet.epfl.ch>

Conclusions

- Game theory can help modeling greedy behavior in wireless networks
- Discipline still in its infancy
- Alternative solutions
 - Ignore the problem
 - Build protocols in tamper-resistant hardware