

# Frustration and Anger in Games

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# Introduction

Frustration, anger, and aggression have important consequences for economic and social behavior.

- ▶ Anger arises from the frustration of non-attainment of an expected outcome; as a behavioral consequence, this goal-blockage experience can lead to aggressive behavior.
- ▶ Emotions depend on beliefs and then we need belief-dependent preferences to illustrate anger-like motivations.
- ▶ We develop a formal framework and a set of models that incorporate frustration and anger in games.

# Motivation & Examples

The following is inconsistent with standard social preferences (e.g., inequity aversion), but consistent with our model(s):

- ▶ **Psychology:** frustration-aggression hypothesis (Dollard et al., 1939). “Experiences of anger consist of the experience of an event as obstructing one’s goals and as caused by someone else’s blameworthy intent.” (Frijda, 1993).
- ▶ **Facts (empirics):**
  - ▶ unexpected losses by home football/soccer teams are associated with increased domestic violence (Card & Dahl, 2011) or violent crime (Munyo & Rossi 2013).
  - ▶ firms do not want to “antagonize customers” (Anderson, E. and D. Simester 2010)
- ▶ **Facts (experimental):**
  - ▶ Self-reported anger correlates with *punishment* of free-riders in *Public Good Games* (Fehr & Gächter, 2002)
  - ▶ Rejections in the *Ultimatum Game* correlate with (manipulated) initially expected offers (Sanfey, 2009; Xiang *et al.*, 2013, with fMRI)
  - ▶ Deviations from expectations drive both anger and the destruction of endowments in *Power-to-Take Games* (van Winden *et al.* 2002,'05).
  - ▶ *Agents are blamed by principals* for bad outcomes (Gurdal *et al.* 2014).

# Setting

Consider **multistage games with observable actions**:

- ▶ Players  $i \in I$
- ▶ Histories/nodes  $h: \emptyset, a^1, (a^1, a^2), \dots \in \bar{H}$  ( $\emptyset$ =root of tree  $\bar{H}$ )
- ▶ Paths, or terminal nodes  $z = (a^1, \dots, a^T) \in Z$ , where  $a^t = (a_i^t)_{i \in I}$  is a profile of actions
- ▶ Monetary payoffs  $\pi(z) = (\pi_i(z))_{i \in I}$
- ▶ Beliefs about paths conditional on each nonterminal history  $h \in H := \bar{H} \setminus Z$ :
  - ▶ **First-order beliefs**:  $\alpha_i = (\alpha_i(\cdot|h))_{h \in H} \in \Delta_i^H(Z)$
  - ▶ **Second-order beliefs**:  $\beta_i = (\beta_i(\cdot|h))_{h \in H} \in \Delta_i^H(Z \times \Delta_{-i}^H(Z))$
  - ▶ **Coherence** of  $(\alpha_i, \beta_i)$ :  $\alpha_i(\cdot|h) = \text{marg}_Z \beta_i(\cdot|h)$  for each  $h \in H$
- ▶ Main focus: *2-stage games with complete information* (simplicity)

# Frustration

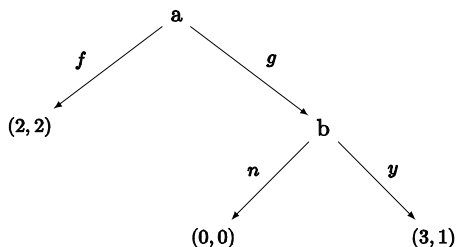
- ▶ Anger is anchored in frustration.
- ▶ **Frustration** is given by *unavoidable shortfall* in expected material payoff; thus, it depends on his beliefs about others and on own plans.

Player  $i$ 's frustration, in the second stage given  $a^1$ , is defined as:

$$F_i(a^1; \alpha_i) = \left[ \mathbb{E}[\pi_i; \alpha_i] - \max_{a_i^2 \in A_i(a^1)} \mathbb{E}[\pi_i | (a^1, a_i); \alpha_i] \right]^+$$

where  $[x]^+ = \max\{0, x\}$ .

## Example: Ultimatum mini-Game



If Bob initially expects  $f$  (fair offer), his frustration following  $g$  (greedy o.) is

$$F_b(g; \alpha_b) = [2 \cdot (1 - \alpha_b(g)) + 1 \cdot \alpha_b(g) \alpha_b(y|g) - 1]^+ .$$

Given  $g$ , Bob is more frustrated (i) the more he expects the fair offer  $f$ , and (ii) the less he initially plans to reject the greedy offer  $g$ .

- ▶ *How do players react to frustration?*

# Blame

A frustrated player may go after his co-players depending on the evaluation of how much his opponents can be blamed for the outcome which frustrates him.

- ▶  $B_{ij}$  measures the amount of frustration  $i$  attributes to  $j$ , with:

$$B_{ij}(a^1; \beta_i) \leq F_i(a^1; \alpha_i)$$

- ▶ Player  $i$  moving at the second stage chooses  $a_i$  to maximize his “decision utility” of the form

$$u_i(a^1, a_i; \beta_i) = \pi_i(a^1, a_i) - \theta_i \sum_{j \neq i} B_{ij}(a^1; \beta_i) \pi_j(a^1, a_i)$$

where  $\theta_i \geq 0$  is a sensitivity parameter.

- ▶ Three approaches to incorporate anger into utility functions according to different levels of cognitive appraisal, reflected by different blame functions.

# Simple Anger (SA)

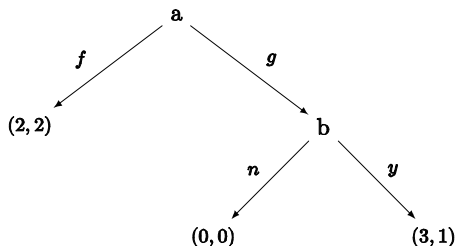
A player's tendency to hurt others is proportional to his frustration, un-modulated by cognitive appraisal of blame:

$$B_{ij}(a^1; \alpha_j) = F_i(a^1; \alpha_j)$$

- ▶ *Frustration-aggression displacement hypothesis* (Dollard *et al.*, 1939): the existence of frustration leads to some form of aggressive behavior through a displacement effect that directs hostile inclinations at substitute targets.
- ▶ *Card & Dahl, 2001*: correlation between an external source of frustration from unexpected loss by local teams and an increasing number of reports of domestic abuse.



## Simple Anger: Ultimatum mini-Game



- ▶ If Bob initially expects  $f$  with certainty, his frustration following  $g$  is  $F_b(g; \alpha_b) = [2 \cdot 1 + 0 \cdot \alpha_b(y|g) - 1]^+ = 1$ . Therefore  $u_b^{SA}(g, n; \alpha_b) - u_b^{SA}(g, y; \alpha_b) = 3\theta_b - 1$ . Bob rejects  $g$  if  $\theta_b \geq 1/3$ ; otherwise, he accepts.
- ▶ If Bob initially expects  $g$  with certainty, his frustration following  $g$  is  $F_b(g; \alpha_b) = [2 \cdot 0 + 1 \cdot \alpha_b(y|g) - 1]^+ = 0$ . Bob accepts  $g$  for every  $\theta_b$  and  $\alpha_b(y|g)$ .

# Anger from Blaming Behavior (ABB)

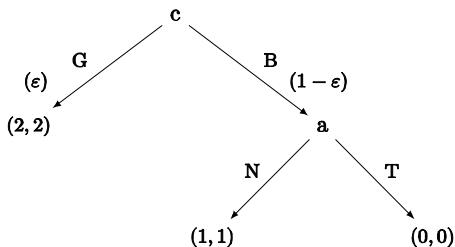
A player blames whoever causes his frustration.

How much  $i$  blames  $j$  is determined by a continuous function  $B_{ij}(a^1; \alpha_i)$  such that:

$$B_{ij}(a^1; \alpha_i) = \begin{cases} 0, & \text{if } \{j\} \neq I(\emptyset) \\ F_b(g; \alpha_b), & \text{if } \{j\} = I(\emptyset) \end{cases}$$

- ▶ In *leader-followers games*, SA and ABB are equivalent.  
For example, in the Ultimatum Minigame the two models yield to the same behavioral prediction.

## Example: Hammering One's Thumb



$c$ =chance,  $a$ =Andy,  $b$ =Bob (inactive, 2nd payoff). Assume that  $\varepsilon < 1/2$ . Following *Bad day*, we have:

$$F_i(B; \alpha_a) = (1 - \varepsilon) \cdot 2 + \varepsilon \alpha_a (N|B) \cdot 1 - 1 > 0$$

Difference between simple anger and anger from blaming behavior:

- ▶ **SA:** given  $B$ , Andy chooses  $T$  for  $\theta_a$  sufficiently high;
- ▶ **ABB:** given  $B$ , Andy chooses  $N$  regardless of  $\theta_a$ .

# ABB: Could-Have-Been Blame

We propose two specific functional forms for ABB:

## 1 Could-have-been blame

A frustrated player  $i$  considers for each co-player  $j$  what  $i$  would have obtained at most, in expectation, had  $j$  chosen differently:

$$B_{ij}(a^1, \alpha_i) = \min \left\{ \left[ \max_{a'_j \in A_j(\emptyset)} \mathbb{E}[\pi_i | (a^1_{-j}; a'_j); \alpha_i] - \mathbb{E}[\pi_i | a^1; \alpha_i] \right]^+ ; F_i(a^1; \alpha_i) \right\}$$

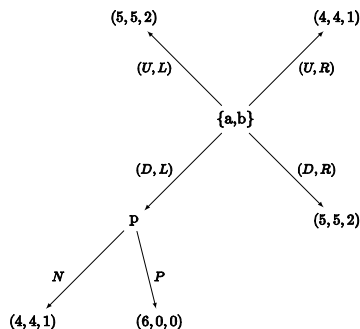
# ABB: Blaming Unexpected Deviations

## 2 Blaming unexpected deviations

A frustrated  $i$  assesses for each co-player  $j$  how much  $i$  would have obtained had  $j$  behaved as expected:

$$B_{ij}(a^1, \alpha_i) = \min \left\{ \left[ \sum_{a'_j \in A_j(\emptyset)} \alpha_{ij}(a'_j) \mathbb{E}[\pi_i | (a^1_{-j}, a_j); \alpha_i] - \mathbb{E}[\pi_i | a^1; \alpha_i] \right]^+ ; F_i(a^1; \alpha_i) \right\}$$

# Could-Have-Been Blame: Asymmetric Punishment



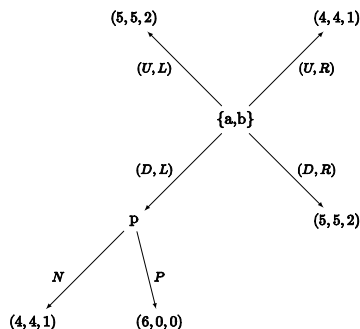
Consider Penny at  $a^1 = (D, L)$ .

$$B_{pa}((D, L); \alpha_p) = B_{pb}((D, L); \alpha_p) =$$

$$\min\{[2 - \mathbb{E}[\pi_p|(D, L); \alpha_p]]^+, [\mathbb{E}[\pi_p; \alpha_p] - 1]^+\} = [\mathbb{E}[\pi_p; \alpha_p - 1]]^+$$

- ▶ Penny fully blames both Ann and Bob for her frustration, but can and does punish only Bob.

# Blaming Unexpected Deviations: Asymmetric Punishment



If Penny is initially certain of  $(U, L)$  then  $\mathbb{E}[\pi_p; \alpha_p] = 2$ . Given  $(D, L)$ , her frustration is  $F_p((D, L); \alpha_p) = [2 - 1]^+ = 1$ .

- ▶ Penny fully blames Ann, who deviated from  $U$  to  $D$ :

$$B_{pa}((D, L); \alpha_p) = \min \left\{ \left[ 2 - \mathbb{E}[\pi_p | a^1; \alpha_p] \right]^+ ; 1 \right\} = 1$$

- ▶ Penny does not blame Bob, who played  $L$  as expected.

# Anger from Blaming Intentions (ABI)

A player blames whoever he believes *intended* to cause his frustration.

- ▶ A frustrated player asks himself whether the co-player intended to give her a low expected payoff:

$$B_{ij}(a^1; \beta_i) =$$

$$\min \left\{ \mathbb{E} \left[ \max_{a_j} \sum_{a_{-j}^1} \alpha_{j,-j}(a_{-j}^1) \mathbb{E}[\pi_i | (a_j^1, a_{-j}^1); \alpha_j] - \mathbb{E}[\pi_i; \alpha_j] \middle| a^1; \beta_i \right], F_i(a^1, \alpha_i) \right\}$$

- ▶ Key issue: is observed behavior interpreted as *intentional*? According to the “trembling-hand” story, deviations from equilibrium are unintentional  $\Rightarrow$  no blame, no aggression!



# Sequential Equilibrium: Consistent Assessments

Fix psychological utility function  $u_i$  ( $u_i = u_i^{SA}, u_i^{ABB}, u_i^{ABI}$ , or other).

An **assessment** is a profile of behavioral strategies and coherent beliefs  $(\sigma_i, \alpha_i, \beta_i)_{i \in I}$  such that  $\sigma_i$  is the *plan*  $\alpha_i$  entailed by second-order belief  $\beta_i$ .

An assessment  $(\sigma_i, \beta_i)_{i \in I}$  is **consistent** if, for all  $i, h$  and  $a = (a_j)_{j \in I}$ ,

- (a) (behav.strat. given by 1<sup>st</sup>-ord. beliefs)  $\alpha_i(a|h) = \prod_{j \in I(h)} \sigma_j(a_j|h)$ ,
- (b) (correct 2<sup>nd</sup>-ord. beliefs)  $\text{marg}_{\mathcal{G}_{\Delta_{-i}}(Z)} \beta_i(\cdot|h) = \delta_{\alpha_{-i}}$ ,

where  $\alpha_i$  is derived from  $\beta_i$  (coherence) and  $\delta_{\alpha_{-i}}$  is the Dirac probability measure that assigns probability 1 to the singleton  $\{\alpha_{-i}\}$ .

# Sequential Equilibrium: Sequential Rationality

An assessment  $(\sigma_i, \beta_i)_{i \in I}$  is a **sequential equilibrium (SE)** if

1. it is consistent and
2. it satisfies the following **sequential rationality** condition (one-shot-deviation property):

$$\forall i \in I, \forall h \in H, \text{Supp} \sigma_i(\cdot | h) \subseteq \arg \max_{a_i \in A_i(h)} u_i(h, a_i; \beta_i).$$

# Equilibrium Analysis

**Theorem** (cf. B&D, 2009)

*If  $u_i(h, a_i; \cdot)$  is continuous for all  $i \in I$ ,  $h \in H$  and  $a_i \in A_i(h)$ , then there is at least one SE.*

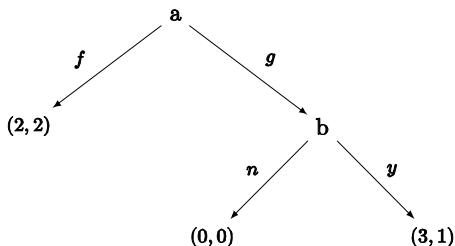
- ▶ Every game with SA, ABB, or ABI has at least one SE.

## Proposition

*In every perfect-information game form with no chance move and a unique SE of the material-payoff game, this unique material-payoff equilibrium is realization-equivalent to an SE of the psychological game with ABI, ABB, or – with only two players – SA.*

- ▶ *Intuition:* PI  $\Rightarrow$  pure-strat. material-payoff eq.  $\Rightarrow$  No on-path surprise  $\Rightarrow$  No on-path anger with psy-utility functions  $\Rightarrow$  On-path material payoff maximization and angry punishment of deviations makes deviations even less attractive.

## Example: Sequential Equilibria of UmG



- ▶ Under all models (SA, ABB, ABI),  $(g, y)$  is SE for all  $\theta_b$  (illustration of previous Proposition):
  - ▶ if greedy offer  $g$  is expected no anger  $\Rightarrow$  yes
- ▶ Under **SA** and **ABI**, also  $(f, n)$  is SE if  $\theta_b$  is high enough:
  - ▶ off-path offer  $g$  is unexpected  $\Rightarrow$  anger  $\Rightarrow$  no for suff. high  $\theta_b$  (credible threat)
- ▶ Under **ABI**  $(f, n)$  is *not* SE:
  - ▶ off-path offer  $g$  interpreted as *unintentional mistake* (trembling hand)  $\Rightarrow$  no blame  $\Rightarrow$   $n$  not credible threat





# Discussion

- ▶ *Dynamic Inconsistency of preferences*: implied by F&A models, but we assume sophistication  $\Rightarrow$  no change of plan
- ▶ *T-period extension*: fast vs. slow play version
  - ▶ fast play: benchmark is initial expectation
  - ▶ slow play: benchmark is beginning-of-period expectation
  - ▶ cooling off effect (experiment by Gneezy and Imas, 2014)
- ▶ *Unintuitive implication of SE*: deviations are not blamed and punished, because they are perceived as unintended
- ▶ Do not blame (sic) us, we are true to the original concept. Blame instead the trembling-hand notion of consistency built into (original) SE, and look for different solution concepts!
- ▶ *Polymorphic SE*: minimal generalization of SE allowing meaningful on-path updating about others' intentions (even with complete information!)




## Discussion (cont.)

- ▶ We make sense of relevant evidence with psychological models where anger is belief-dependent: unavoidable shortfall
- ▶ Anger can also depend on regret (e.g., unexpected discounts after purchase, see Anderson & Simester, 2010), which is belief-dependent in a different way ...
- ▶ ... or on perceived unfairness (riots, political unrest), which—however—often is hard to distinguish from deviation from expectations
- ▶ *F&A vs Negative Reciprocity*: both give credibility to threats, but unlike NR, in the F&A models no aggression occurs on a pure-equilibrium path  $\Rightarrow$  no miserable equilibrium
- ▶ *F&A vs Guilt Aversion*: complementary “commitment devices,” GA (Battigalli & Dufwenberg 2007) supports on-path promises, F&A supports off-path threats

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