



Leveraging Behavioral Game Theory for the Study of International Relations

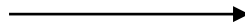
U.S. AIR FORCE

Capt William N. Caballero



The Cuban Missile Crisis

What if....



...would history have been different?



Limitations of Classical Deterrence Theory Analysis



- Qualitative Limitations

Traditional models of deterrence are indifferent to temperament, intellect, background, biases, etc.

- Humans known to be overconfident, emotional, and vulnerable to perceptual errors
- Mental Illness
 - 27% of EU has suffered from mental disorder (Davidson, 2006)
 - ~49% of US presidents between 1776-1974 suffered from disorder (e.g., depression, alcoholism, etc.)

- Quantitative Limitations

- ★ 1. Equilibrium concepts built upon self-interest and *mutual consistency* (i.e., based upon accurate beliefs of what adversaries actually do)
- ★ 2. Assumed to reason to equilibrium profile immediately
 - What about learning?



BGT #1: Cognitive Hierarchy (CH)



- Modeled upon step-by-step reasoning
 - Shown to empirically describe behavior in many games
- Players are k -step thinkers according to a Poission(τ) probabilistic density, f
 - A k -step player is overconfident and doesn't realize players can think as strategically as they do
 - Beliefs formed about other players “accurately” by normalizing the true distribution as appropriate
- Each k -step player best responds to who he believes his opponents are
 - 0-step thinkers assumed to randomize equally
 - Solved recursively by calculating 1-step players best response to 0-step, and continuing until some large k



BGT #2: Experience Weighted Attraction (EWA)

- Players make decisions based upon (1) accumulated experience, and (2) attraction toward a given strategy

Experience of
player i

$$N_i(t) = \phi_i(1 - \kappa_i)N_i(t - 1) + 1, \quad t \geq 1.$$

Attraction of
player i to
strategy j

$$A_i^j(t) = \frac{\phi_i N_i(t - 1) A_i^j(t - 1) + [\delta_i + (1 - \delta_i) I(s_i^j, s_i(t))] \pi_i(s_i^j, s_{-i}(t))}{N(t)}$$

Probability
player i plays
strategy j

$$P_i^j(t + 1) = \frac{e^{\lambda A_i^j(t)}}{\sum_{k=1}^m m_i \lambda A_i^k(t)}$$

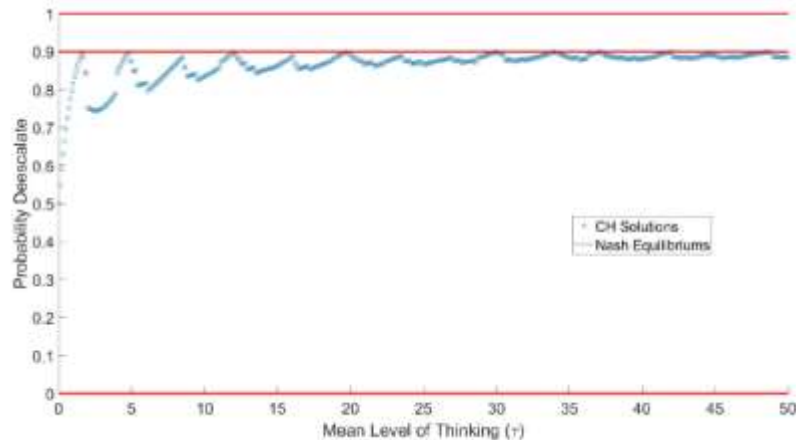
- Initial variables for attraction and experience seeded
 - Usually informed with the Cognitive Hierarchy model
 - Insight can be gained via many simulation runs



Nuclear Crisis (Chicken) Game

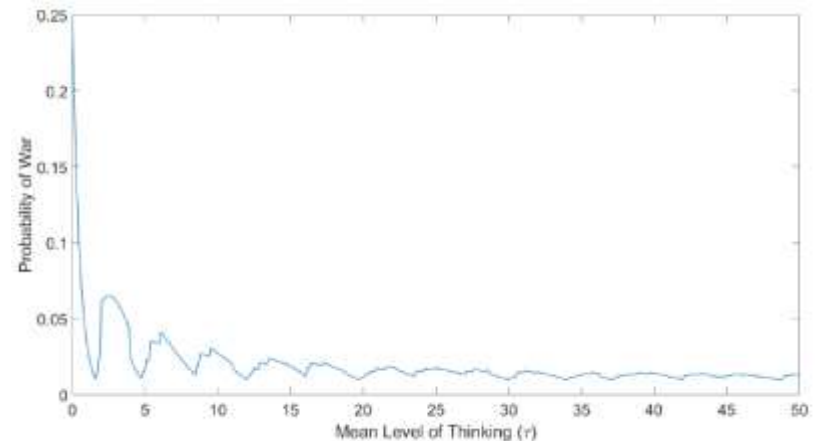
	Deescalate	Hold Firm
Deescalate	(0,0)	(-1,1)
Hold Firm	(1,-1)	(-10,-10)

- Cognitive Hierarchy Analysis



Converges to MNE as τ increases

Probability of War may increase as a population of players begins to think more strategically





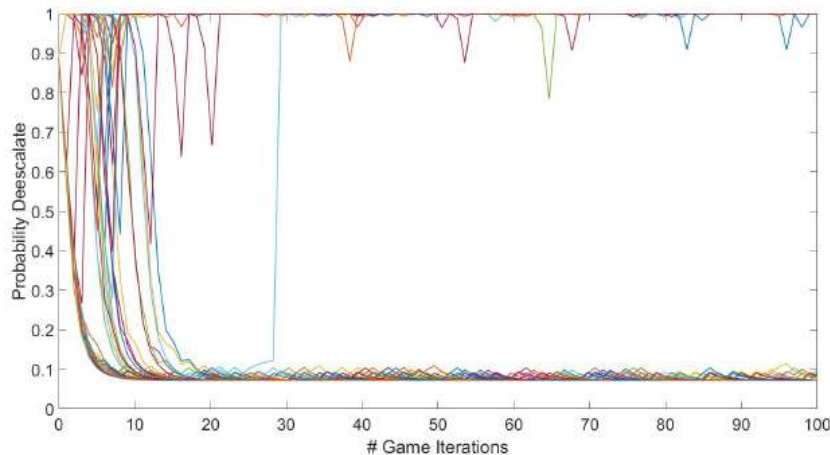
Nuclear Crisis (Chicken) Game



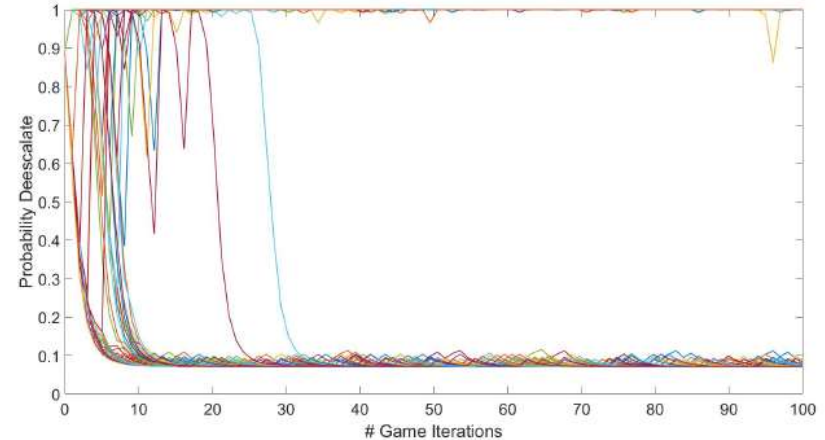
	Deescalate	Hold Firm
Deescalate	(0,0)	(-1,1)
Hold Firm	(1,-1)	(-10,-10)

- EWA Analysis

Row Player



Column Player



Players learn to play one of the two pure Nash equilibrium

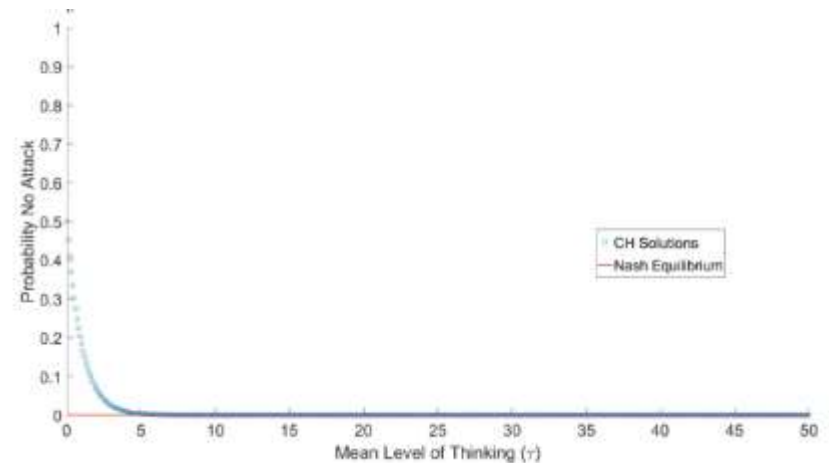
BGT methods may distinguish between the Nash equilibriums!



Preemptive War Game

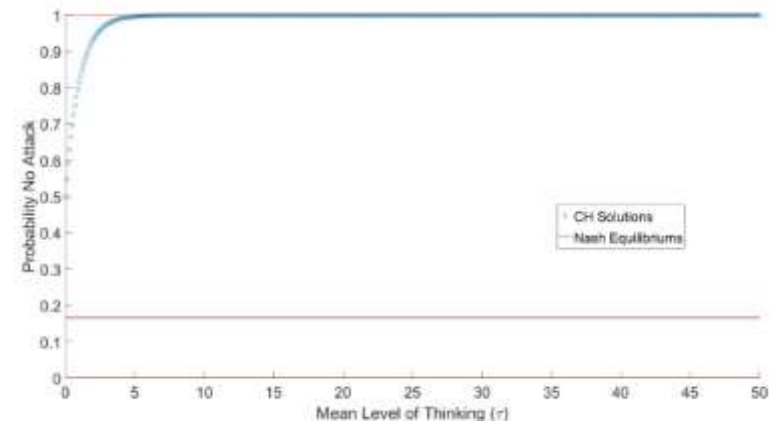
Prisoner Dilemma Game

	No Attack	Attack
No Attack	(3,3)	(-1,4)
Attack	(4,-1)	(0,0)



Assurance Game Variant

	No Attack	Attack
No Attack	(8,8)	(1,3)
Attack	(3,1)	(2,2)



But... did USSR and US actually value collective peace more?

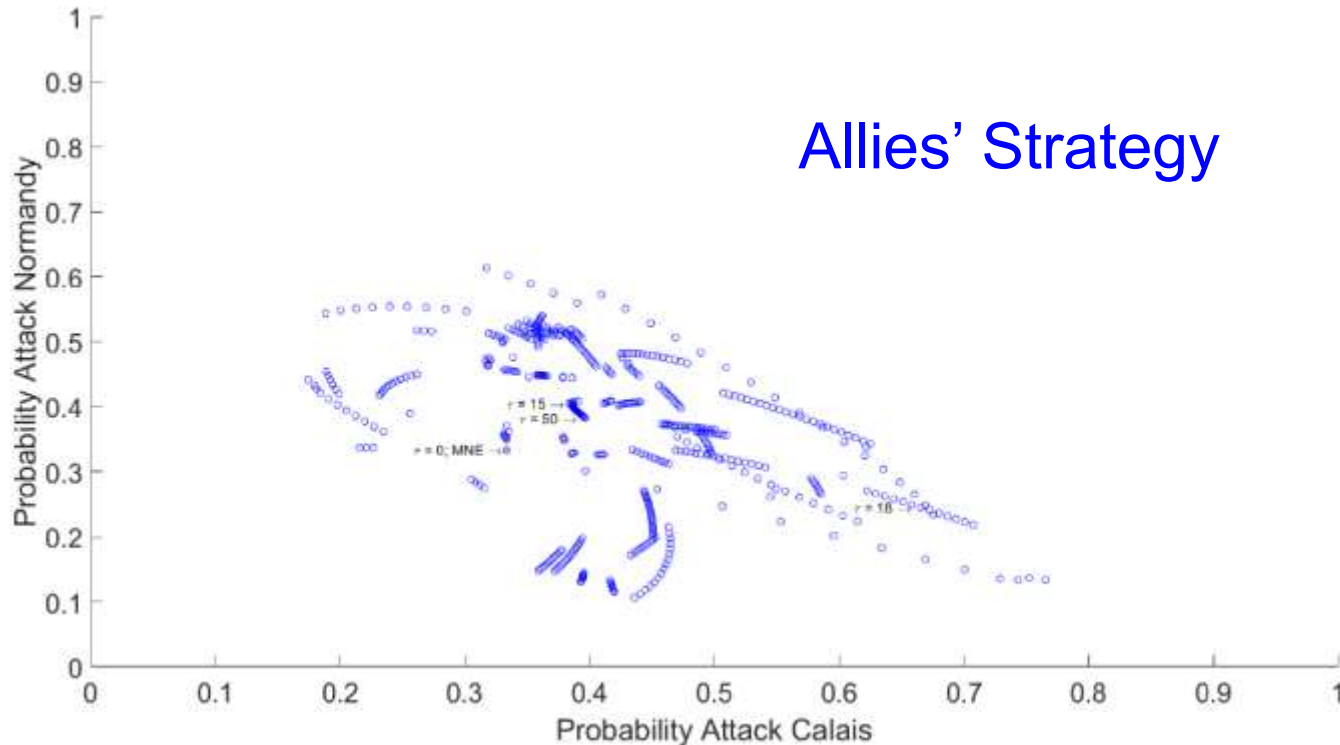


D-Day (Matching Pennies) Game

		Germans		
		Calais	Normandy	Brittany
Allies	Calais	(0,1)	(1,0)	(1,0)
	Normandy	(1-c _N ,0)	(-c _N ,1)	(1-c _N ,0)
	Brittany	(1-c _B ,0)	(1-c _B ,0)	(-c _B ,1)

$c_N = 0.25$ and $c_B = 0.4$

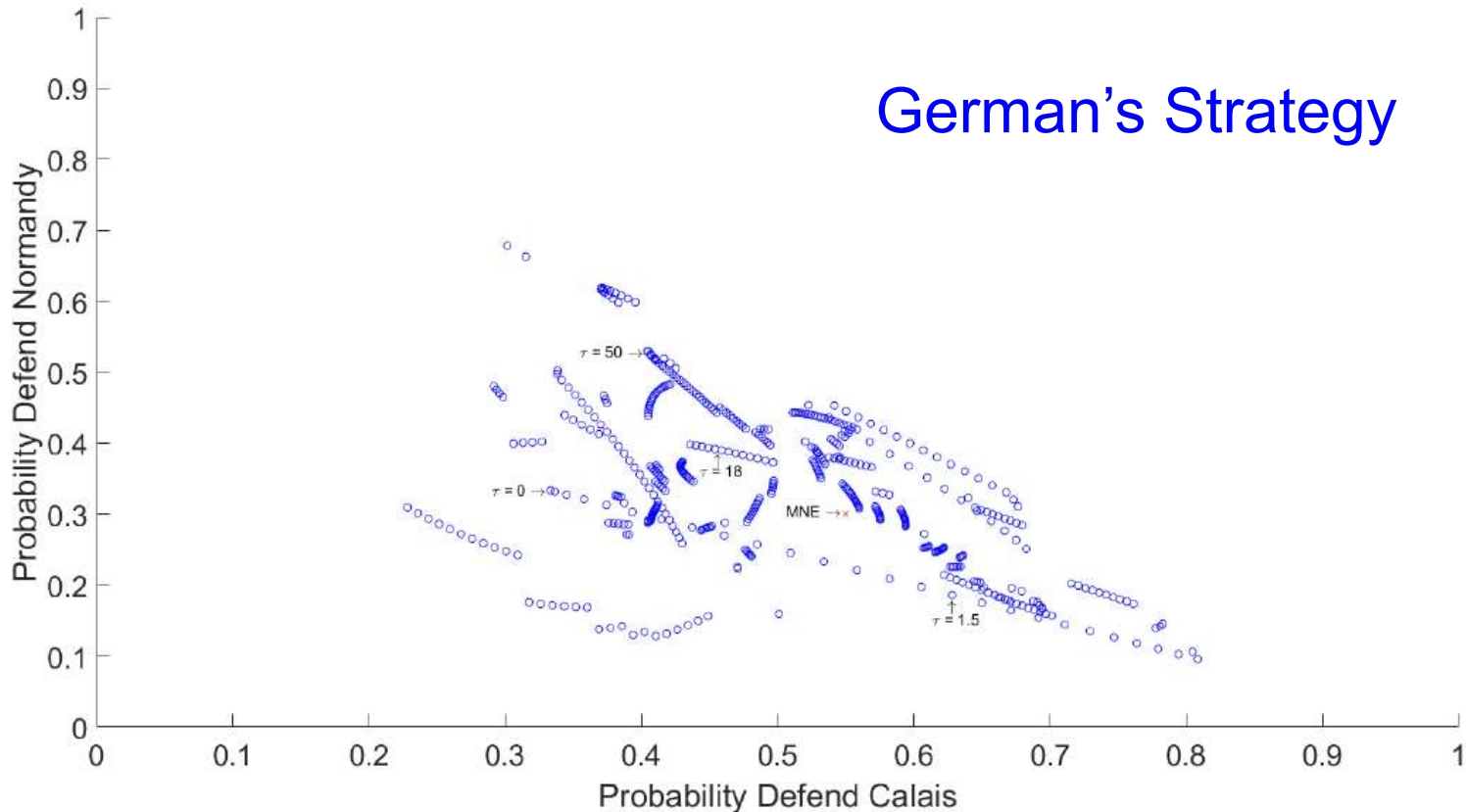
- Cognitive Hierarchy Analysis





D-Day (Matching Pennies) Game

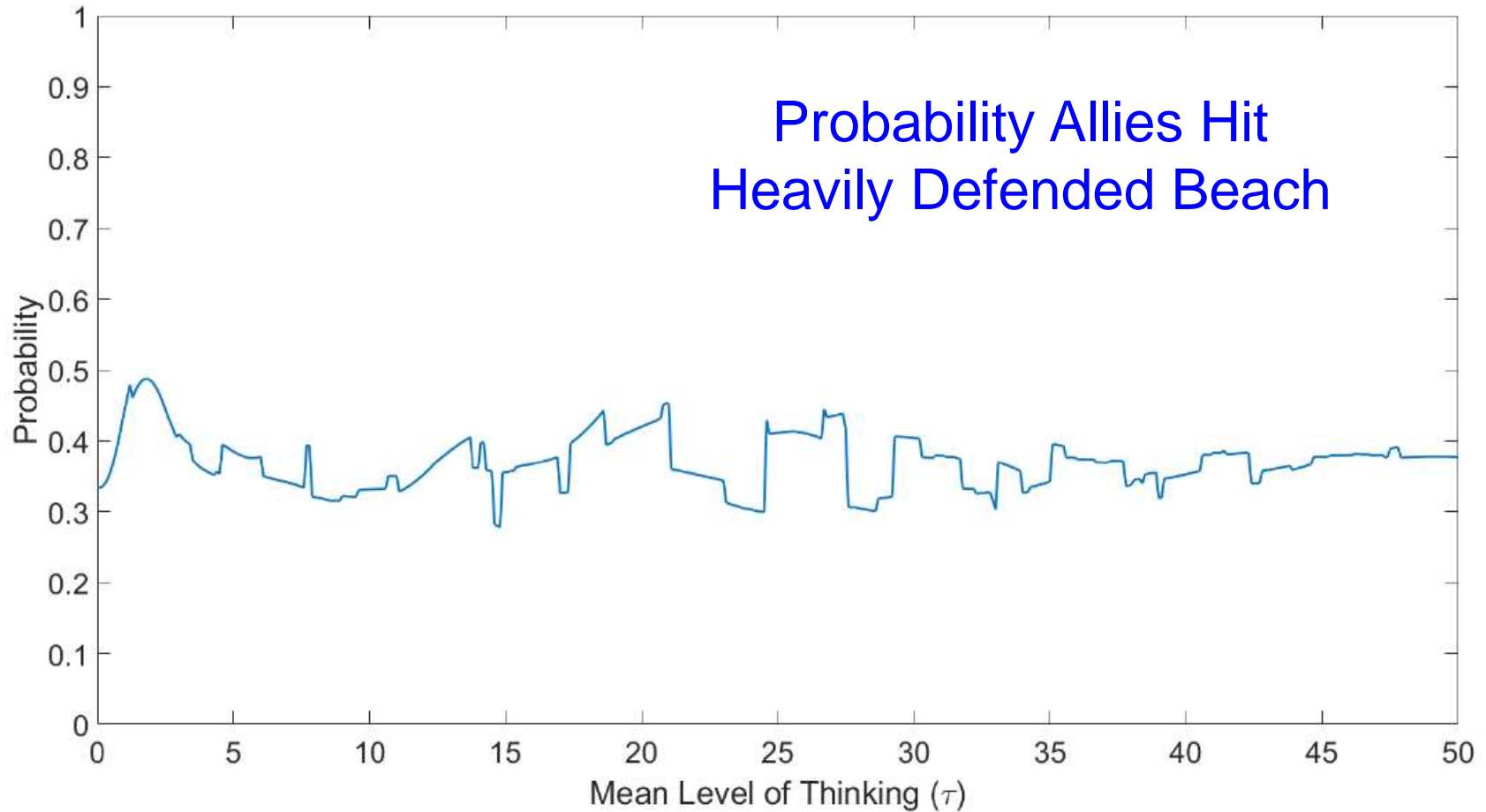
- Cognitive Hierarchy Analysis (continued)



As τ increases, we are not approaching the NE (strict)...



D-Day (Matching Pennies) Game



How can such irregular behavior be utilized to inform policy?



Insights for Policymaking



- Behavioral theories coincide with the intuition of tailored deterrence – specifics of adversary matter
 - But BGT provides less definite predictions of adversary behavior than perfect rationality analysis
 - What is τ for the population of a given nation's leadership?
 - What are the appropriate EWA parameters?
- As, the defining BGT parameters are uncertain, the construction of “optimal” policies is not possible
 - Instead, “robust” policies should be pursued utilizing robust optimization, stochastic programming, or distributionally robust optimization techniques



D-Day Game Revisited

		Germans		
		Calais	Normandy	Brittany
Allies	Calais	(0,1)	(1,0)	(1,0)
	Normandy	(1- c_N ,0)	(- c_N ,1)	(1- c_N ,0)
	Brittany	(1- c_B ,0)	(1- c_B ,0)	(- c_B ,1)

- Assume τ equal to 0, 1, 2, 3, 4 or 5, then a large M-step thinker infers the following payoffs

τ	Expected Value of Calais	Expected Value of Normandy	Expected Value of Brittany
0	0.667	0.417	0.267
1	0.491	0.505	0.355
2	0.271	0.615	0.465
3	0.318	0.499	0.534
4	0.432	0.348	0.570
5	0.629	0.135	0.587

*Minimum possible payoff for each attack

Attacking Calais is the robust decision

- However, this assumes we have no information regarding the probability τ assumes any integer 0-5



D-Day Game Revisited

		Germans		
		Calais	Normandy	Brittany
Allies	Calais	(0,1)	(1,0)	(1,0)
	Normandy	(1- c_N ,0)	(- c_N ,1)	(1- c_N ,0)
	Brittany	(1- c_B ,0)	(1- c_B ,0)	(- c_B ,1)

- If we had the following distribution over τ

τ	Probability
0	0.05
1	0.10
2	0.50
3	0.25
4	0.05
5	0.05

- The potential expected payoffs for the attacks

Expected Value of Calais	Expected Value of Normandy	Expected Value of Brittany
0.350	0.528	0.472

Attacking Normandy yields the maximum expected payoff



D-Day Game Revisited

		Germans		
		Calais	Normandy	Brittany
Allies	Calais	(0,1)	(1,0)	(1,0)
	Normandy	(1- c_N ,0)	(- c_N ,1)	(1- c_N ,0)
	Brittany	(1- c_B ,0)	(1- c_B ,0)	(- c_B ,1)

- If we had the following set of distributions over τ

τ	Probability Distribution 1	Probability Distribution 2	Probability Distribution 3
0	0.05	0.10	0.05
1	0.10	0.05	0.05
2	0.50	0.30	0.20
3	0.25	0.25	0.20
4	0.05	0.1	0.40
5	0.05	0.2	0.1

- The potential payoffs for each decision are

Probability Distribution	Expected Value of Calais	Expected Value of Normandy	Expected Value of Brittany
1	0.350	0.528	0.472
2	0.421	0.438	0.491
3	0.411	0.422	0.517

Attacking Brittany
is the
distributionally
robust decision

*Minimum expected value for each attack



Future Research



- How do group dynamics affect behavioral theories?
- Do the high stakes of national security games affect BGTs?
 - LeVeck, Brad L, D. Alex Hughes, James H Fowler, Emilie Hafner-Burton, and David G Victor. 2014. "The Role of Self-interest in Elite Bargaining," 111:18536–18541. 52.
- Does culture induce significant behavioral changes?
 - Camerer, Colin F. 2011. *Behavioral Game Theory: Experiments in Strategic Interaction*. Princeton University Press, Princeton, NJ.
- How do the conclusions of classic IR models change when approached from a behavioral lens?
 - Fearon, James D. 1994. "Domestic Political Audiences and the Escalation of International Disputes." *American Political Science Review* 88 (3): 577–592.
 - Kydd, Andrew H. 2007. *Trust and Mistrust in International Relations*. Princeton University Press, Princeton, NJ.



Questions?