

Lecture 16
28 October 2010
CSCI 7000-003
Inference, Models and Simulation for Complex Systems

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tereroreism (noun)

a violent act
by non-governmental actors
to create fear
for political purposes

"terrorism from below" vs. "terrorism from above"

MIPT TERRORISM

KNOWLEDGE BASE™

incident profile

ABU HAFS AL-MASRI BRIGADE AND SECRET ORGANIZATION OF AL-QAEDA IN EUROPE ATTACKED TRANSPORTATION TARGET (JULY 7, 2005, UNITED KINGDOM)

Incident Date: July 7, 2005

Terrorist Organization(s): Abu Hafs al-Masri Brigade ,

Secret Organization of al-Qaeda in Europe

Target: Transportation

City: London

Country: United Kingdom

Region: Western Europe

Tactic: Bombing

Weapon: Explosives

Fatalities: 27

Injuries: 0



RAND-MIPT data

- •40 years (1968-2008)
- domestic + international
- 5000+ cities, 187 countries
- 36,018 events (37% deadly)

terrorist organizations

10,335 events attributed to

910 identifiable orgs.

381 groups kill 1+

3,249 fatal events

MIPT TERRORISM

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major terrorist organizations 1968-2008 (Wave 3,4)

I.	Revolutionary Armed Forces of Colombia (FARC)	45.	Democratic Front for the Liberation of Palestine (DFLP)	70.	Orly Organization
2.	Hamas	46.	UNITA	71.	People's Liberation Forces (El Salvador)
3.	Taliban	47.	Revolutionary Nuclei	72.	Front for the Liberation of the Cabinda Enclave
4.	Basque Fatherland and Freedom (ETA)	48.	al-Gama'a al-Islamiyya (GAI)	73.	
5.	Communist Party of Nepal-Maoist (CPN-M)	49.	Free Aceh Movement (GAM)	74.	African National Congress (South Africa)
6.	National Liberation Army (Colombia)	50.	Kurdistan Freedom Hawks	75.	Moro National Liberation Front (MNLF)
7.	Palestinian Islamic Jihad (PIJ)	51.	April 19 Movement	76.	Islamic Great Eastern Raiders Front
8.	Liberation Tigers of Tamil Eelam (LTTE)	52.	Lord's Resistance Army (LRA)	77.	Palestinian Revolution Forces General Command
9.	al-Fatah	53.	Moro Islamic Liberation Front (MILF)	78.	Chukakuha
10.	Communist Party of India-Maoist	54.	Real Irish Republican Army (RIRA)	79.	Communist Combatant Cells
11.	al-Qaeda Organization in the Land of the Two Rivers	55.	al-Qaeda	80.	Popular Front for the Liberation of Palestine General
12.	Anti-Castro Cubans	56.	Tawhid and Jihad		Command (PFLP-GC)
13.	Hezbollah	57.	Popular Liberation Army	81.	Red Brigades
14.	Fronte di Liberazione Naziunale di a Corsica (FLNC)	58.	Eritrean Liberation Front (ELF)	82.	Japanese Red Army (JRA)
15.	Shining Path	59.	Montoneros	83.	Animal Liberation Front (ALF)
16.	Islamic State of Iraq	60.	Turkish Communist Party Marxist-Leninist (TKP/ML-	84.	Committee of Solidarity with Arab and Middle East
17.	Popular Front for the Liberation of Palestine (PFLP)		TIKKO)		Political Prisoners (CSPPA)
18.	United Liberation Front of Assam (ULFA)	61.	Mozambique National Resistance Movement	85.	Front for the Liberation of Lebanon from Foreigners
19.	al-Aqsa Martyrs Brigades	62.	Ulster Defence Association/Ulster Freedom Fighters		(FLLF)
20.	Kurdistan Workers' Party (PKK)	63.	Purbo Banglar Communist Party (PBCP)	86.	Jamatul Mujahedin Bangladesh
21.	Tupac Amaru Revolutionary Movement	64.	National Liberation Front of Tripura (NLFT)	87.	Informal Anarchist Federation
22.	Ansar al-Sunnah Army	45.	First of October Antifascist Resistance Group (GRAPO)	88.	Sudan People's Liberation Army
23.	Black September	46.	Red Hand Defenders (RHD)	89.	Ninth of June Organization
24.	New People's Army (NPA)	47.	Lashkar-e-Taiba (LeT)	90.	Guerrilla Army of the Poor
25.	Abu Nidal Organization (ANO)	48.	Hizbul Mujahideen (HM)	91.	Loyalist Volunteer Force (LVF)
26.	Mujahideen Shura Council	49.	Mujahideen Youth Movement	92.	Anti-Imperialist International Brigade
27.	Armenian Secret Army for the Liberation of Armenia	50.	Bersatu	93.	All Tripura Tiger Force (ATTF)
28.	Irish Republican Army (IRA)	51.	People's Revolutionary Army (Argentina)	94.	People's Revolutionary Army (Colombia)
29.	Revolutionary People's Liberation Party/Front	52.	Farabundo Marti National Liberation Front	95.	Social Resistance
_,,	(DHKP/C)	53.	Jaish-e-Mohammad (JeM)	96.	Arab Communist Organization (ACO)
30.	People's War Group (PWG)	54.	Islamic Jihad Jerusalem	97.	Anti-Terrorist Liberation Group
31.	United Self-Defense Forces of Colombia (AUC)	55.	Peronist Armed Forces	98.	Riyad us-Saliheyn Martyrs' Brigade
32.	Jewish Defense League (JDL)	56.	Khmer Rouge	99.	Kosovo Liberation Army (KLA)
33.	Amal	57.	Justice Commandos for the Armenian Genocide	100.	
34.	Armed Islamic Group	58.	Continuity Irish Republican Army (CIRA)	101.	
35.	Palestine Liberation Organization (PLO)	59.	PKK/KONGRA-GEL		Jamiat ul-Mujahedin (JuM)
36.	Earth Liberation Front (ELF)	60.	National Democratic Front of Bodoland (NDFB)		Alex Boncayao Brigade (ABB)
37.	Abu Sayyaf Group (ASG)	61.	Lautaro Youth Movement		Pattani United Liberation Organization (PULO)
38.	Popular Resistance Committees	62.	Action Directe		Group Bakunin Gdansk Paris Guatemala Salvador
39.	Manuel Rodriguez Patriotic Front	63.	Polisario Front		Irish National Liberation Army (INLA)
40.	Revolutionary Organization 17 November (RO-N17)	64.	Mujahedin-e-Khalq (MeK)		Revolutionary Struggle
41.	al-Qaeda Organization in the Islamic Maghreb	65.	Maoist Communist Center (MCC)	107.	
42.	Baloch Liberation Army (BLA)	66.	Popular Forces of April 25		Ananda Marga
43.	Revolutionary People's Struggle	67.	Third of October Group		Tupamaros
44.	Red Army Faction	68.	Baader-Meinhof Group	110.	raparriar 03
TT.	Neu Airly Lacuott	00.	Daader-Fielillor Group		

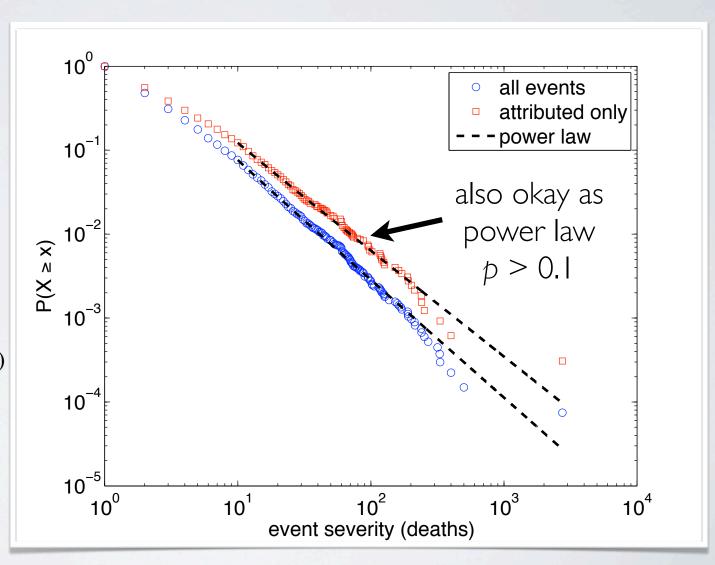
Breton Revolutionary Army (ARB)

Islamic Army in Iraq

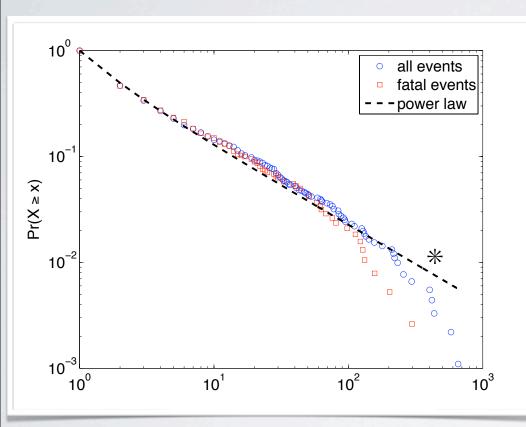
attribution matters a little

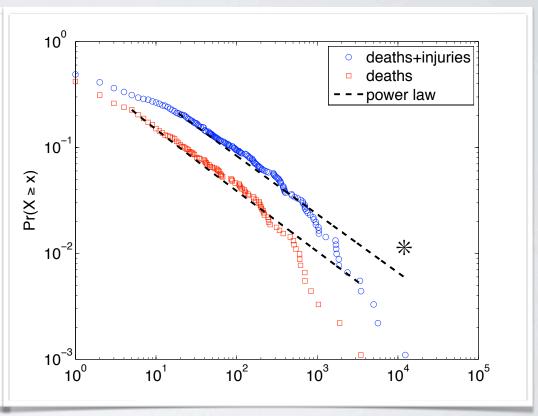
50% of "severe" events by:

- al-Qaeda in Iraq (46)
- Tamil Tigers (23)
- Hamas (20)
- al-Qaeda (16)
- Taliban (15)
- Ansaral-Sunnah Army (15)
- FARC (13)
- Hezbollah (12)
- Mujahideen Shura Council (11)
- Lord's Resistance Army (11)
- Islamic State of Iraq (10)
- Fatah (9)



most groups uninteresting



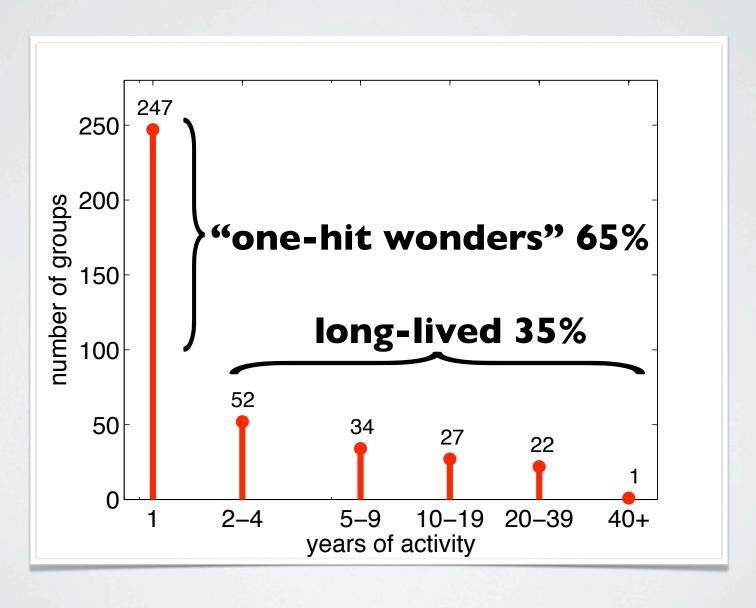


total number of events

total casualties

*these are **not plausible** power laws, p < 0.1

most groups die quickly



behavioral dynamics of terrorist groups

behavioral dynamics of terrorist groups

traditional studies:

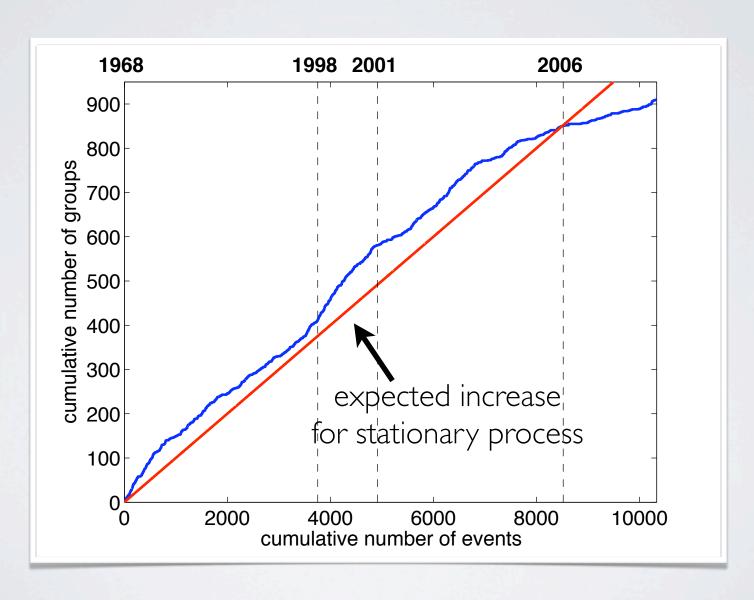
- political motivation,
- strategic choices,
- organizational structure,
- material support, etc.

behavioral dynamics of terrorist groups

but, given that a terrorist group acts:

- do its attacks change over its lifetime?
- how do they change?
- are there patterns?
- are these patterns stationary?
- can we make predictions?

are dynamics stationary?



how does terrorism progress? a hypothesis

how does terrorism progress? a hypothesis



attacks → recruitment → growth → more attacks

group size and age determine rate of attack (terrorist "cells" largely interchangeable, size is main limitation on rate)

test this hypothesis using data

development curves

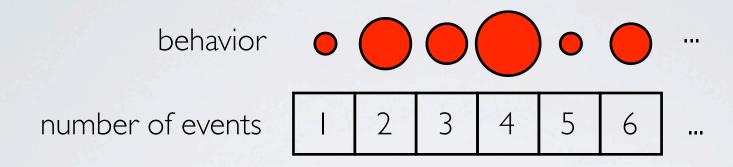
(a.k.a. "experience" curves)

development curves

plots group's behavior as function of maturity $\,k\,$

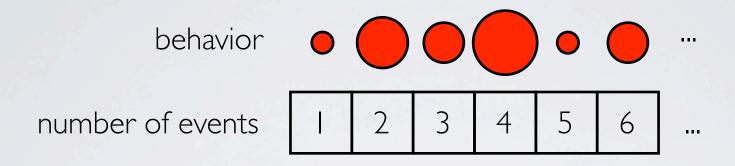
- facilitates inter-group comparisons
- frequency (time between attacks Δt)
- severity (deaths x)

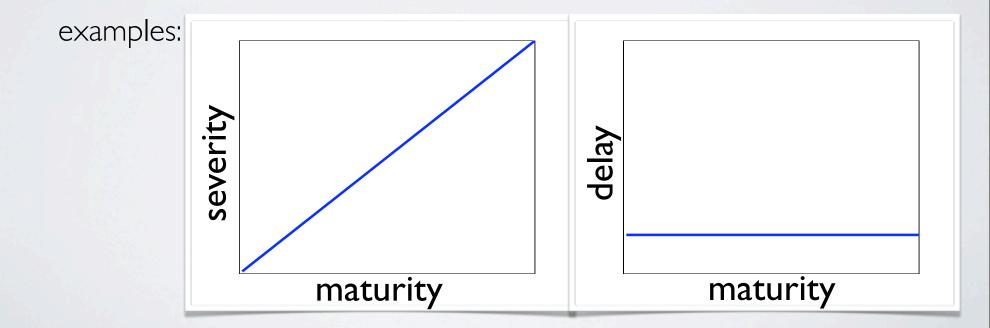
development curves



examples:

development curves

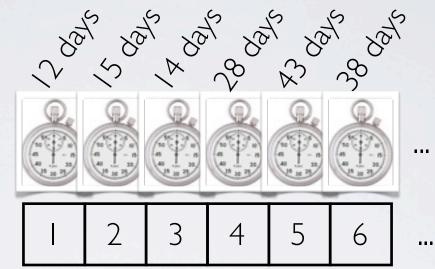




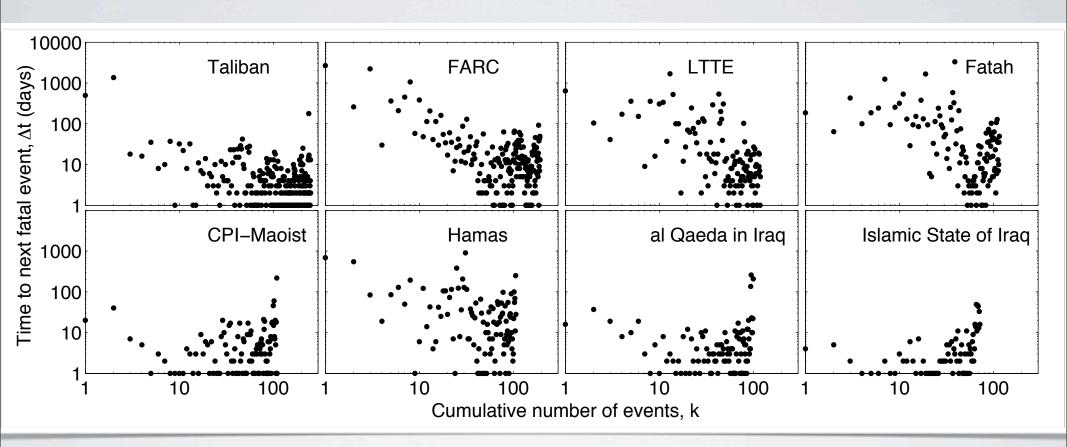
frequency of attacks

time between attacks

event number

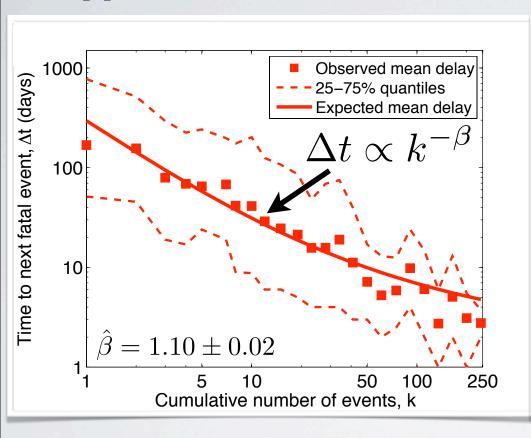


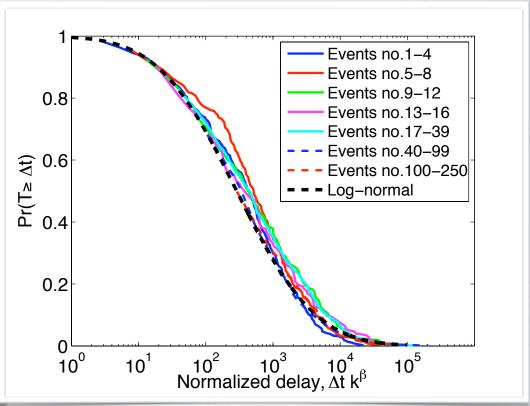
individual curves



combine these curves to extract typical trajectory

typical curve

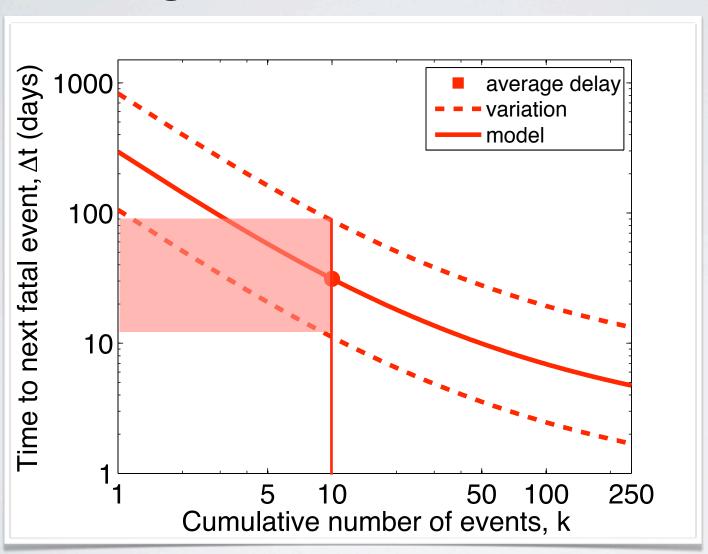




truncated, shifted log-normal

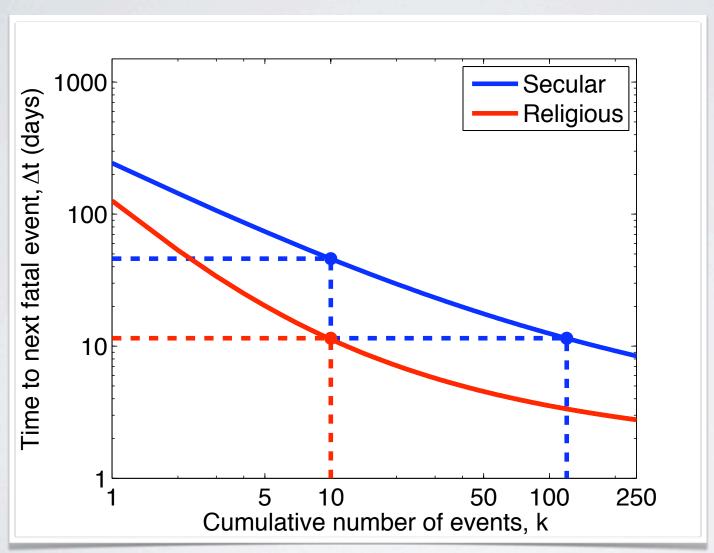
$$\left\{ p(\log \Delta t) \propto \exp \left[\frac{-(\log \Delta t + \beta \log k - \mu)^2}{2\sigma^2} \right] \right\}$$

forecasting?

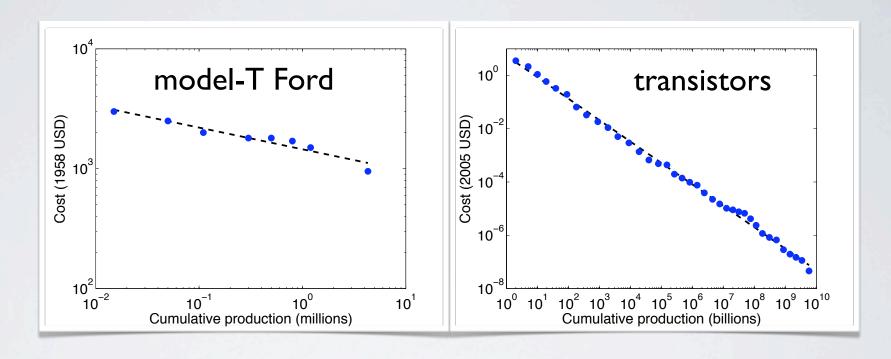


secular vs. religious terrorism

secular vs. religious terrorism

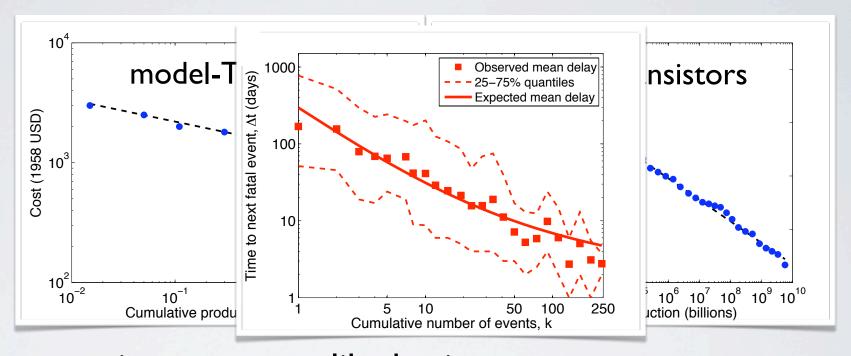


experience curves: cost vs. "time"



"our strategy is to get big fast" Jeff Bezos of Amazon.com

experience curves: cost vs. "time"



terrorist groups act like businesses

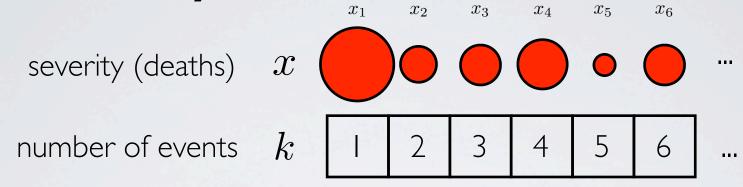
(whose "product" is terrorist attacks)

labor constrained industry

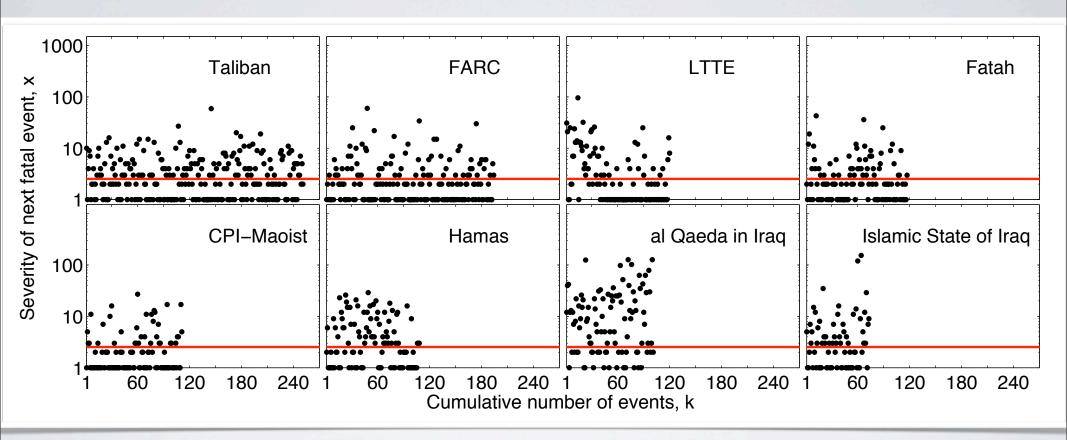
(more people = more attacks ≠ more severe attacks; what about cyber?)

even terrorists face universal social constraints

attack severity

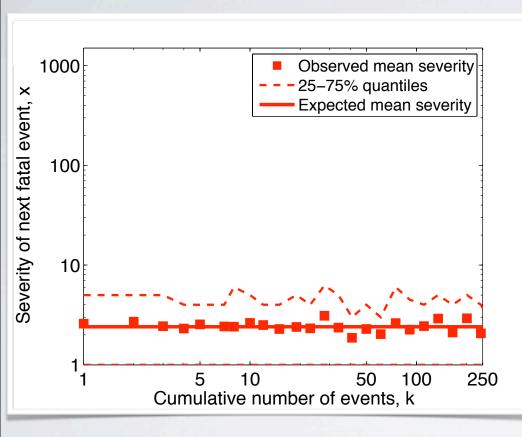


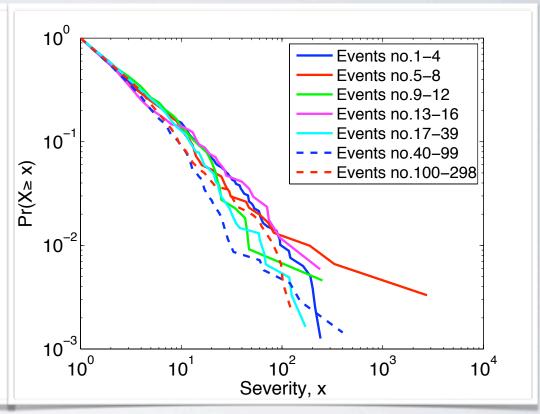
individual curves



combine these curves to extract typical trajectory

typical curve





invariant distribution

$$p(x \mid k) \propto x^{-\alpha}$$
 $x \ge 1$

why does attack rate accelerate?

organizational learning



organizational learning



existing members become more efficient

(better planning, coordination, execution)

organizational learning



existing members become more efficient (better planning, coordination, execution)

unfortunately, very hard to test empirically (little data on terrorist event planning)

organizational growth



new, replaceable, independent members

(recruit new, independent terrorist cells)

organizational growth



new, replaceable, independent members

(recruit new, independent terrorist cells)

predicts delay and size are inversely proportional

$$\Delta t \propto 1/s$$

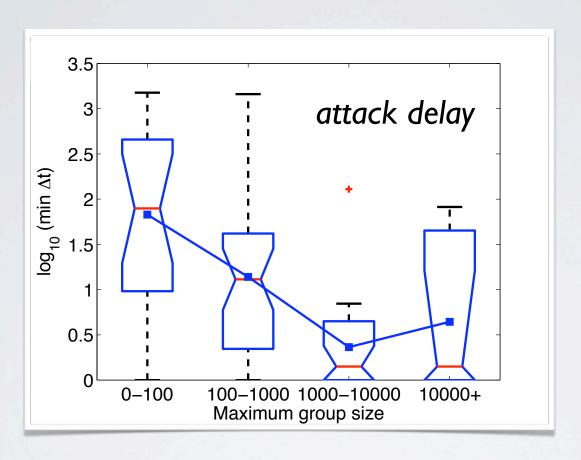
size matters

The Nature of the Beast: Organizational Structures and the Lethality of Terrorist Attacks

Victor Asal University at Albany—State University of New York **R. Karl Rethemeyer** University at Albany—State University of New York

order-of-magnitude estimates of *maximum* size over 1998-2005 for 381 terrorist groups

prediction: $\min(\Delta t) \propto 1/\max(s)$



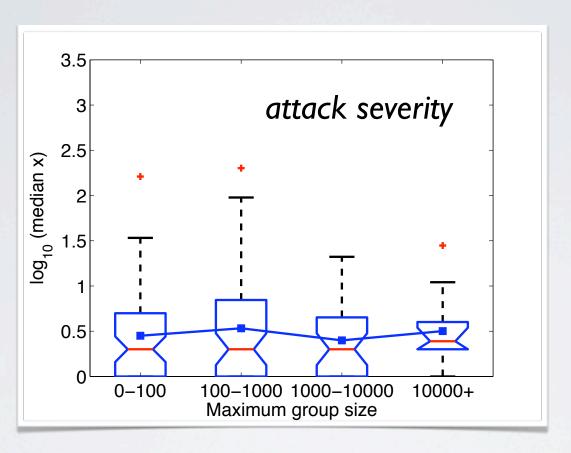
delay decreases with size

organizational growth



new, replaceable, independent members (recruit new, independent terrorist cells)

but, are larger groups better at killing?



severity independent of size

organizational growth



new, replaceable, independent members

(recruit new, independent, interchangeable terrorist cells)

attacks → growth via recruitment → more attacks

organizational learning may still play a role



predicting the future

predicting the future

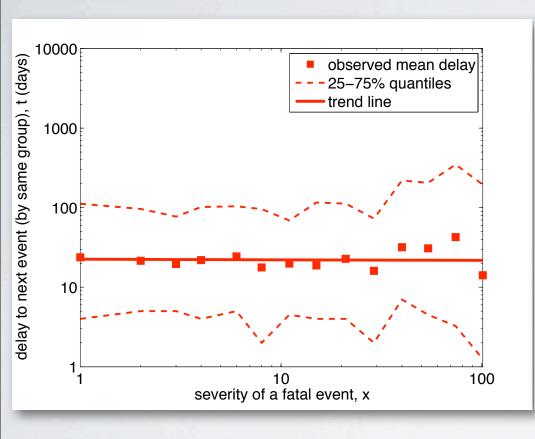
given we know only

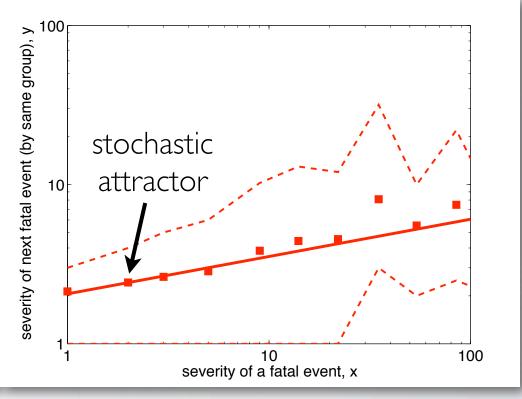
severity of an event by some group,

can we predict

- · delay until next event by same group
- severity of that event

predicting the future





 $\Delta t \approx 28.1 \text{ days}$

independent of severity

 $x_{t+1} \approx 2x_t^{1/4}$ strong attenuation

summary

- many robust patterns in terrorist group behavior
- a group's attack rate accelerates as with age (but group motivation matters)
- feedback loop between attack frequency and size
- terrorist groups like start-up companies (whose product is terrorist attacks)
- attack severity follows invariant power law (which does not change with group age or size)
- delay independent of severity; recurrent severity strongly attenuated

some open questions

- · do terrorist organizations learn?
- what organizational factors determine β ?
 - ideology matters. why? what else?
- where does power law for severity come from?
- can we forecast behavior of individual groups?
- how do these organizations die?
- what is predictable about future terrorist attacks?

tuesday: you!