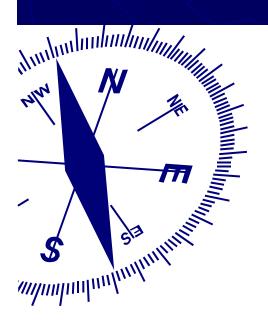
# Risk Terrains: Theoretically- and Empirically-Grounded Spatial Models for Tactical Decision-Making

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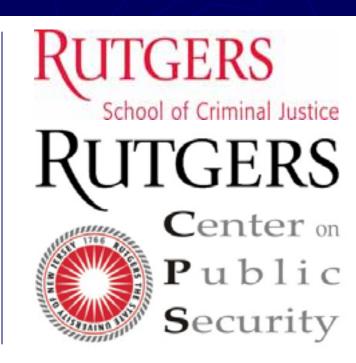
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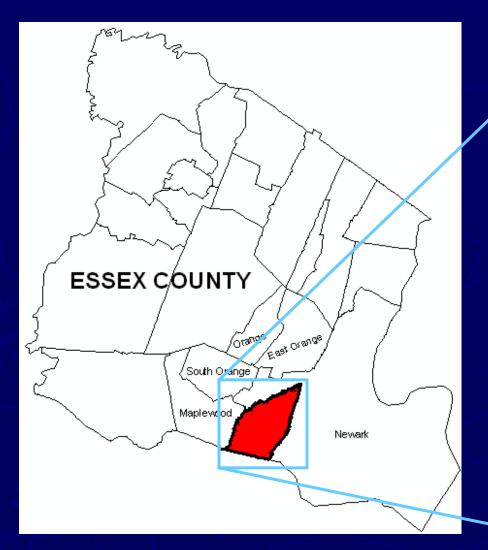
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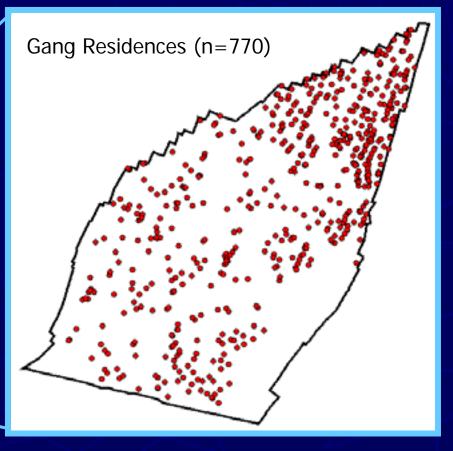
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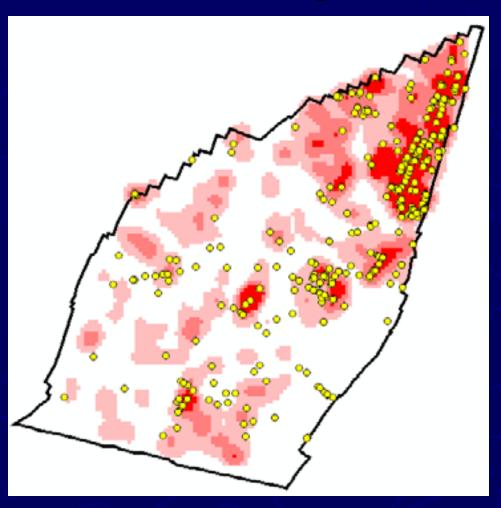






## Drug Arrests (points) Gang Residences (density)

Drug arrests cluster in areas where large numbers of gang members live.

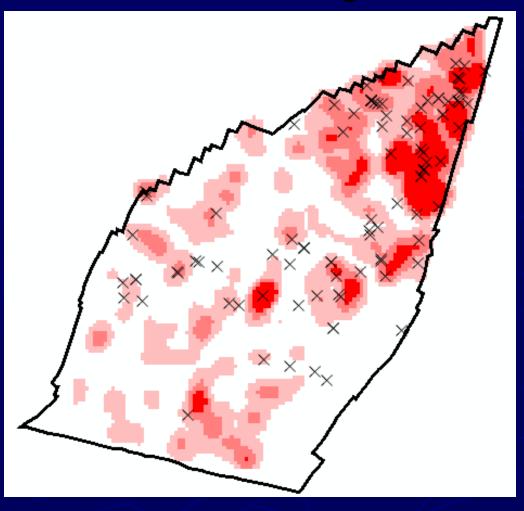






## Shootings (x) Gang Residences (density)

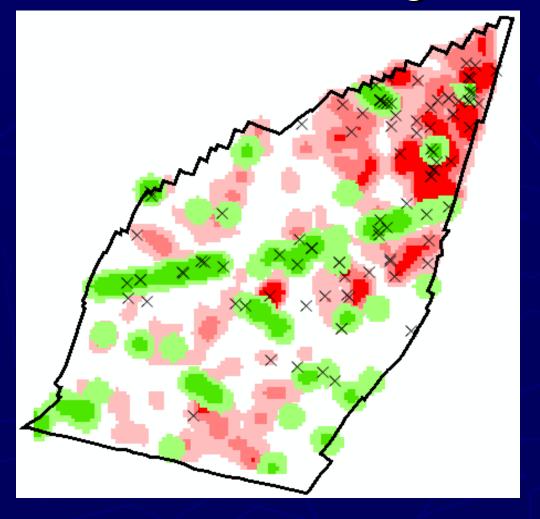
Shootings occur most often in areas were drugs are sold and many gang members live.





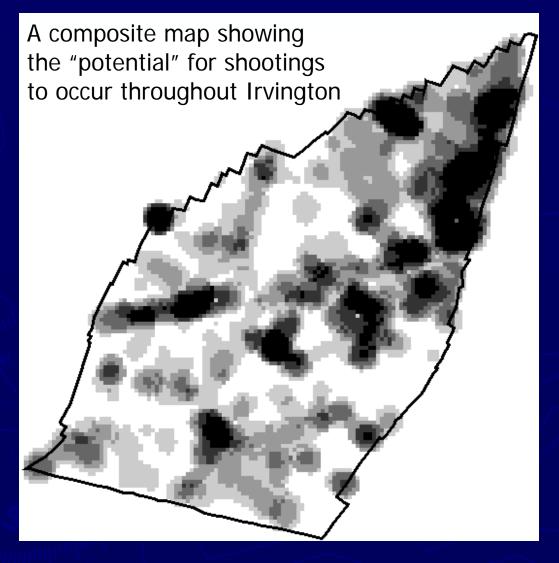
## Shootings (x) Gang & Infrastructure (density)

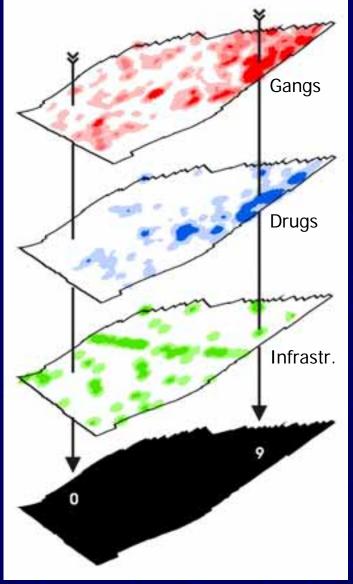
Liquor stores, bars, strip clubs & fast food restaurants help to explain shootings outside of gang or drug areas.





#### RISK TERRAIN

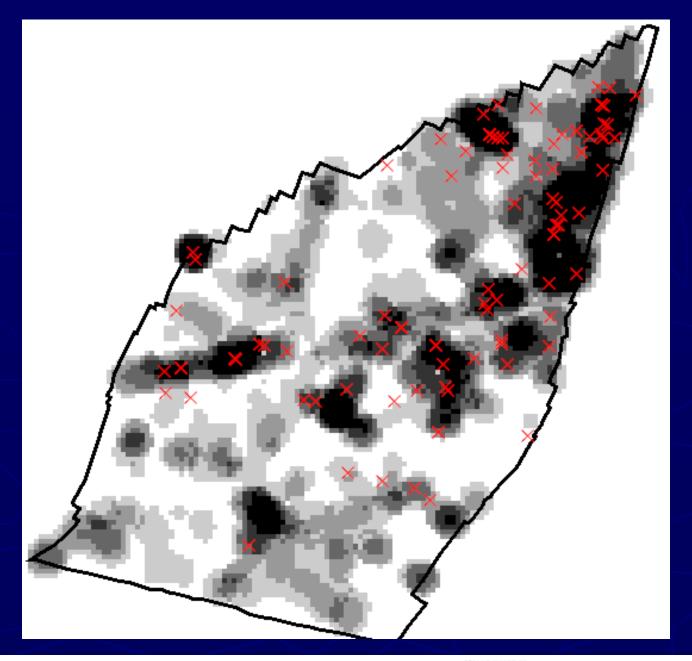








Risk Terrain matches locations of actual shootings.

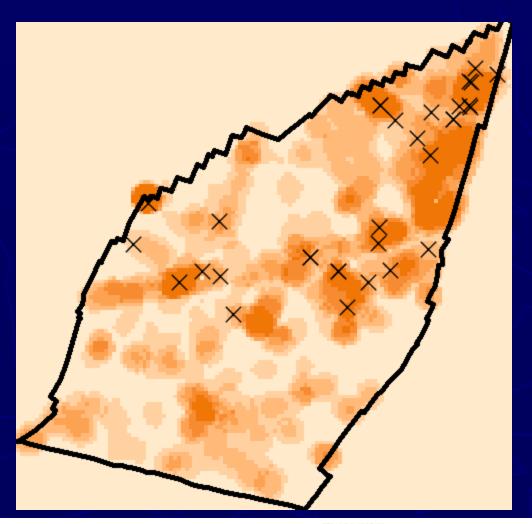






## Shootings (x) Risk Terrain

▶ Jan. 2007 – June 2007

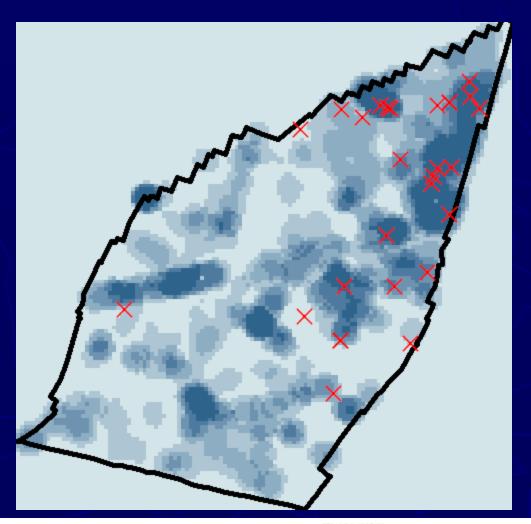






## Shootings (x) Risk Terrain

▶ July 2007 – Dec. 2007

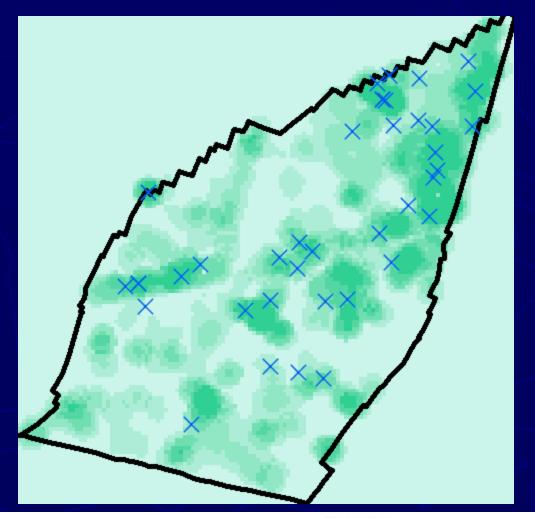






## Shootings (x) Risk Terrain

▶ Jan. 2008 – Sept. 2008

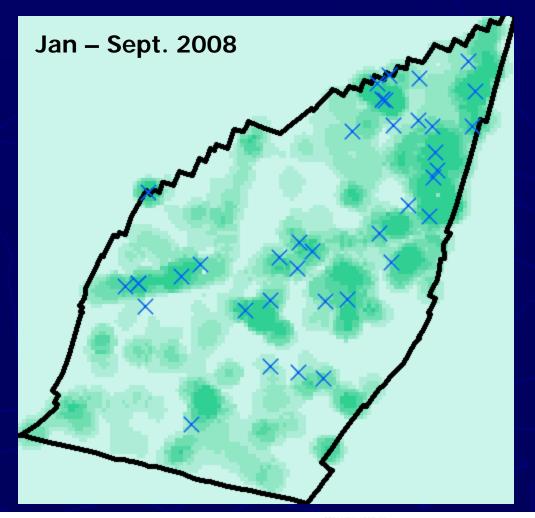






#### 21 Month Animation

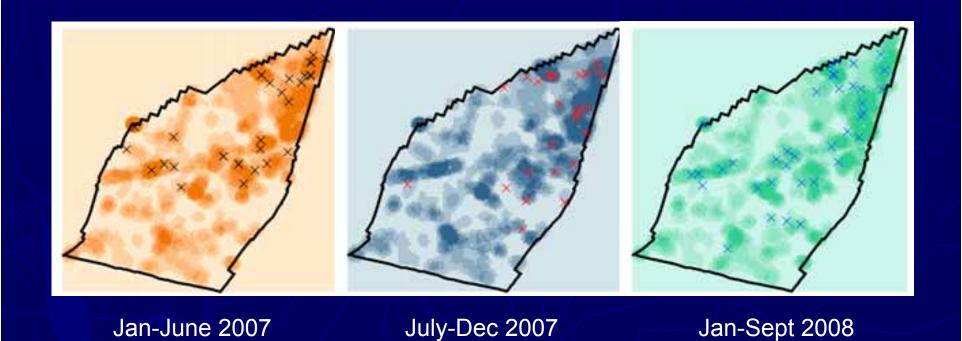
Watch shooting incidents disperse South, and then to the West







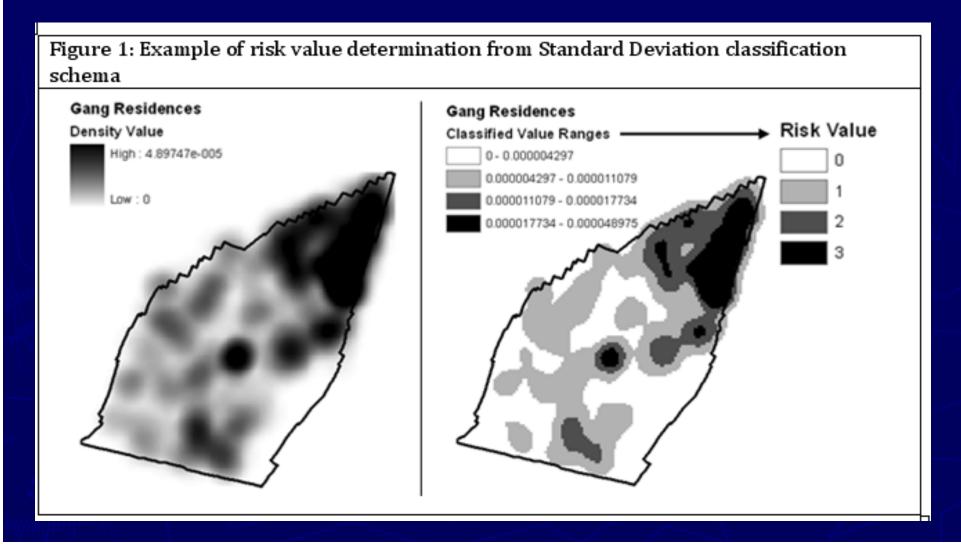
## But is it statistically significant?







#### Risk Map Layer Classification Method





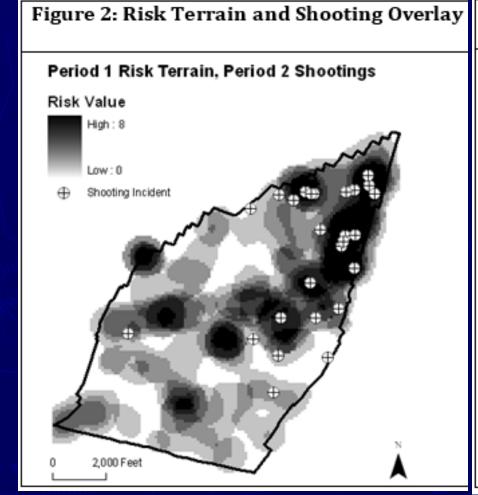
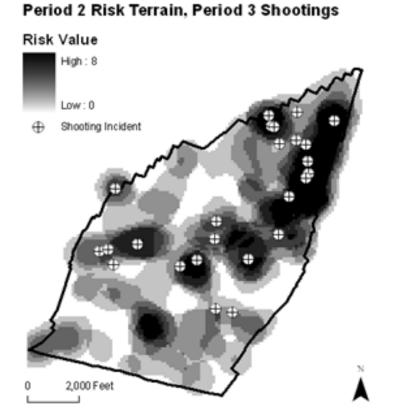
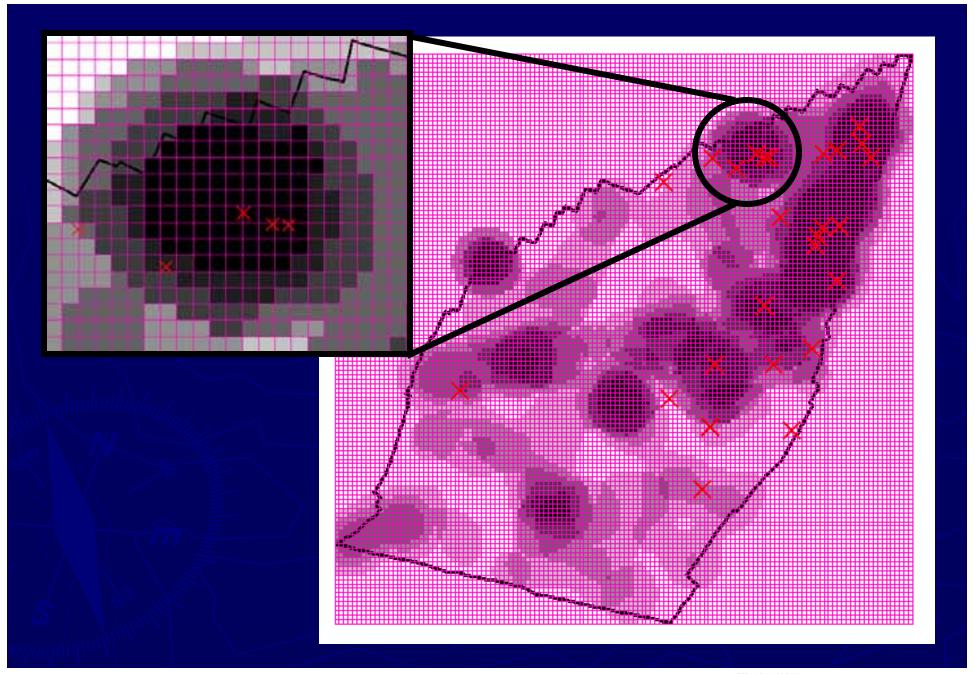


Figure 3: Risk Terrain and Shooting Overlay











#### Regression Analysis

Ind. Var. = Risk Value (0-8)

Dep. Var. = Presence of any Shooting (Yes/No)

TABLE 1:	Logistic Regi	ressions for	r Risk Valu	e on Shooting

Period 1 Risk Terrain*								
	В	S.E.	Wald	df	Sig.	Exp(B)	95% C.I. for Exp(B)	
							Lower	Upper
Risk Value	.52	.097	29.06	1	<.001	1.69	1.397	2.048

<sup>\*-2</sup> Log likelihood = 280.824; Nagelkerke R Square = .11; n=4046 street-intersected cells

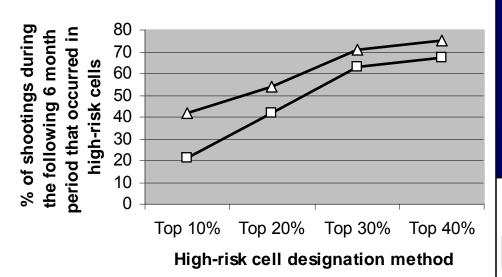
Period 2 Risk Terrain**								
	В	S.E.	Wald	df	Sig.	Exp(B)	95% C.I. for Exp(B)	
							Lower	Upper
Risk Value	.44	.094	22.31	1	<.001	1.56	1.297	1.876

<sup>\*\* - 2</sup> Log likelihood = 280.695; Nagelkerke R Square = .08; n = 4046 street-intersected cells



#### Period 1

— Risk Terrain Map — Retrospective Map



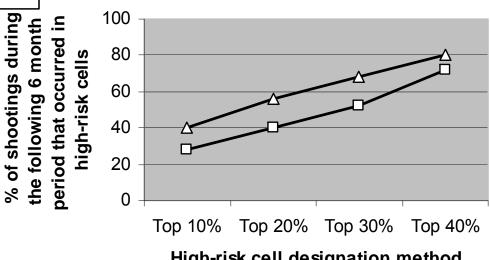
**Risk Terrains:** a statistically significant forecast of future shootings across a range of cut points; meaningfully more accurate than retrospective hotspot mapping.

#### Period 2

— Risk Terrain Map — Retrospective Map

Fisher's Exact Tests: everything is statistically significant at p<0.05 except for Period 1 Retro, 10%

N cells = 4.046N shootings = 24(P1), 25(P2)

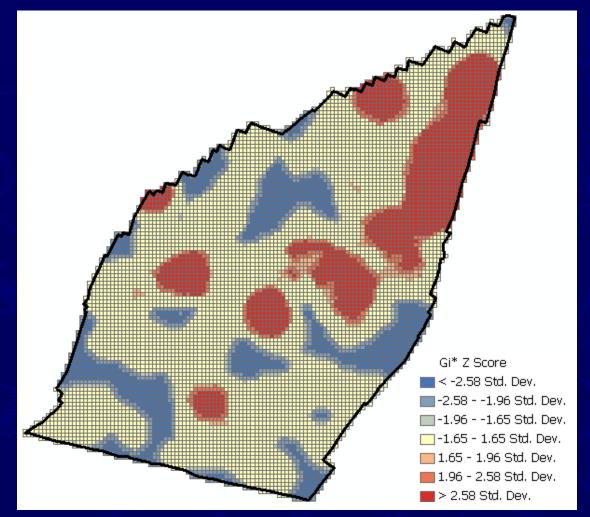


High-risk cell designation method













### Risk Terrain Modeling Overview

Risk Terrains require the operationalization of all risk factors to a geography using justifiable methods.

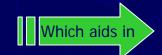
Risk Terrain Modeling (RTM)



Risk Terrain Maps

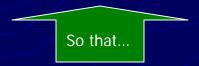


Spatial Intelligence



Repetition can be used to **evaluate** the interventions

One or more interventions can be targeted at one or more risk factors in the RTM



Strategic Decision-Making



