Predictive Perspectives 2011



Fighting Crime with Predictive Analytics

How Predictive Analytics Can Help Focus Efforts and Reduce Crime

Business Analytics www.spss.com/perspectives

Introduction

- Trends and Headlines
- How Data is Changing Policing
 - Data explosion
 - Use of Information Technology
- Role of Predictive Analytics in Policing
 - Customer Story: The Richmond Police
- Two Scenarios
 - Profiling
 - Decisioning
- Wrap Up



A View into Crime: A Global View

Current Worldwide Homicide/Murder Rates



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Recent Headlines

Police face cuts as economy falters

Baltimore Police Sue Over City Budget Cuts

Police vs. City Council on Oakland budget cuts

Budget cuts force city police to park cycles; sale next?

Amid Police Budget Cuts, Ohio Judge Urges Public to Arm Themselves

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Trends Impacting Use of Predictive Analytics in Policing

- Explosion of electronically-available data
 - Electronic record-keeping
 - Warehousing
 - Linkage



Information Explosion

In volume. 15 petabytes

Amount of new information being generated every day, 8x more than the information in all U.S. libraries.

200 billion

More than 200 billion emails are sent every day.

988 exabytes

Amount of digital information that will exist in 2010—equivalent to a stack of books from the sun to Pluto and back.

In variety. 80%

New data growth that is unstructured content, generated largely by email, with increasing contribution by documents, images, video and audio.

30 billion

By 2010, up to 30 billion RFID tags will be produced globally, embedded into products, passports, buildings—even animals.

\$5.7 million

For every 1,000 knowledge workers it employs, a company loses \$5.7 million annually in time wasted reformatting information between applications.





Police Departments Capitalize on Information Technology



Finnish Defence Forces: SOA service reuse enables a projected 80% reduction in time required to develop new C4 systems. Consolidation and virtualization leads to a projected 75% reduction in required infrastructure.



NYPD Crime Information Warehouse: Gives officers mobile access to more than 120 million criminal complaints, arrests and 911 records, as well as 5 million criminal records, parole files and photographs.



Informed, Real-Time Decisions at the Point of Impact



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Public Sector CFOs View of Analytical Capabilities



"We tend to react well but anticipate poorly" - Canadian CFO

Source: IBM Global CIO Study 2010; March 2010 (at www-935.ibm.com/services/uk/cfo/cfostudy2010)





Crime Prediction and Prevention

- Analyze crime statistics, predict incidents in time and space and facilitate collaboration within and across policing departments.
 - Planning tools: allow municipalities to analyze history, set future objectives and metrics, and build execution plans.
 - Scorecards and dashboards: enable municipalities to monitor and respond to key metrics.
 - Reports and analysis: guide users to the issues to be addressed or resolved quickly.
 - Predictive analytics: profile crimes and criminals to improve solved crime rates and optimize resource usage.





Crime Prediction and Prevention What Can Predictive Analytics Do For You?

- Deliver a foundation for more proactive law enforcement /policing.
- Provide greater predictive analysis and data mining from disparate data sources.
- Respond to inquiries, requests for services and investigative actions in a timely manner and increase citizen satisfaction.
- Increase quality of decisions by providing more insightful, actionable reporting.
- Redeploy resources effectively to meet objectives that evolve over time.
- Reduce operational and IT costs by providing self-service reporting and analysis to users.







Richmond Police Department Effective force deployment lowers cost and crime

Challenge

 Needed a solution that could identify trends and patterns that might indicate how to best deploy forces to prevent crime or determine whether or not a threat is real.

Solution

- Using IBM SPSS, analysts are able to identify actionable patterns and make high quality decisions by fully exploiting huge data sets.
 - Incident reports
 - Crime tips
 - Calls for service

Results

- Facilitated the deployment of officers to where they were most needed.
- Identified minor crimes likely to escalate into violence.
- Accelerated the criminal investigation process.



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Richmond Police Department Effective force deployment lowers cost and crime



"IBM SPSS Modeler and data mining represent a revolution in our ability to access previously unobtainable data, and pull meaning and value from it. This is as close to a crystal ball as we are ever going to get." Colleen McCue, program manager for the Department's Crime Analysis Unit



Applying Predictive Analytics Examples of Usage Scenarios

Profiling

- Using all available data to create profiles of crimes and criminals to improve solved crime rates
- Decisioning
 - Using predictive analytics to proactively manage resource deployment





Profiling Scenario









Johnny is arrested for breaking into a car

He is 15 years old and confesses that he wanted to belong to a group of friends

Will he become a repeat offender? If YES: advise DA and later parole officer?

A citizen reports a burglary

Reports that her house was burglarized while she was talking to a representative from the city council

Does this crime resemble Do we have a team working on others? Is it serial? similar crimes that we can assign it to?



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The perpetrators entered by breaking a window probably between 3am and 5am. Crime was discovered at 6 pm next day

Does it make sense to send out a CSI team?

Is it likely that they'll find useful evidence?



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PD uses predictive analytics to profile crimes & criminals to improve solved crime rates and optimize resource usage





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Aspiring Repeat Offender profile

male

And And

. . .

lf

And

And

- Burglary,

age 14-16

- Visit by city official,

Entry 'Back door'.

- Victim "Elderly'

Break In

report>12hrs And entry ='broken window'

And object='Commercial Property'

Then probability evidence is 6%

Niaht

crime ='car break in' And motive ='peer pressure'

Crime profile \rightarrow Team 4 Cluster 'Bogus Official'



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Key Players

Focus on: Keith Patterson

- Colin Wiertz
- Markus Haffey

Then repeat risk is HIGH → ALERT DA **Predictive Modeling** Crime record notes for Crime Pattern and call logs Detection CS profile → No Deployment

PD uses predictive analytics to profile crimes & criminals to improve solved crime rates and optimize resource usage



Crime Data

Communication Data





Financial Data



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Combine multiple disparate data sources

Predictive Modeling

for Crime Pattern

Detection

Crime record notes

and call logs

Crime Data

Surveillance Data



Communication Data



Financial Data



Colin Wiertz
Markus Haffey
Predictive Modeling

Financial Data

Who are the key persons? Who are the leaders?

players within a narcotics network





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improve solved crime rates and optimize resource usage

Text Analytics



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Communication Data

Crime Data





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Centralized Analytics



Communication Data





Financial Data






































improve and adapt predictions



Feedback loop of new data to improve and adapt predictions



Feedback loop of new data to improve and adapt predictions















Decisioning

Predictive Perspectives 2011





Shift Commander Actively manages force deployment decisions. Traditionally reactive, but now proactive in making next day decisions for every dispatch area



Understands geographically where events are likely to happen

Shift Commander



Shift Commander

Understands
geographically
where events are
likely to happen



Deploys the right number of officers at the right place and the right time



Shift Commander





Patrol Officer Traditionally used experience / instinct. Now, at the start of shift , based on input from the commander and likelihood of crime, examines his deployment area to better understand patrol routes



Shift Commander





Patrol Officer



Notices change in weather conditions



Shift Commander





Patrol Officer



weather conditions



Enters updated factors in the system, including current patrol activity, to generate real-time predictions of crime in areas of interest



Shift Commander







Patrol Officer



Notices change in weather conditions





Shift Commander



Patrol Officer







Shift Commander



Patrol Officer





Shift Commander



Patrol Officer





The agency uses predictive analytics to proactively deploy police forces and prevent crime



Shift Commander



Patrol Officer





The agency uses predictive analytics to proactively deploy police forces and prevent crime



Historical crime incidents (RMS, CAD)



Shift Commander



Patrol Officer





The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Shift Commander



Patrol Officer





The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Shift Commander



Patrol Officer





The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Likelihood of Crime



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Shift Commander



Patrol Officer











Enabling factors (Weather, Police presence, ...)





Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

Risk Assessment

And EntertainmentEvent And DayAfterPayday And DispatchZone=004 Then V Crime=Yes (65, 0.98)





Likelihood of Crime





Shift Commander



Patrol Officer













Risk Assessment If Day=Saturday

And EntertainmentEvent And DayAfterPayday And DispatchZone=004 Then V_Crime=Yes (65, 0.98)

The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Likelihood of Crime



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Shift Commander



Patrol Officer









Planning

Risk AssessmentIfDay=SaturdayAndEntertainmentEventAndDayAfterPaydayAndDispatchZone=004ThenV_Crime=Yes (65, 0.98)

Risk Assessment: area 008

If Condition=Rain And Temp>=60 And PatrolActivityPS=High Then V_Crime=No (0.92)

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Enabling factors (Weather, Police presence, ...)





Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)





Likelihood of Crime





Shift Commander



Patrol Officer







weather conditions







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Interactive Decisioning

The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)





Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Likelihood of Crime

Capabilities



Shift Commander



Patrol Officer



Understands



weather conditions





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Predictive Modeling



Interactive Decisioning

The agency uses predictive analytics to proactively deploy police forces and prevent crime

Likelihood

of Crime



Enabling factors (Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

Capabilities



Shift Commander



Patrol Officer



Understands

geographically





The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

Deployment into Operational Processes

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Interactive Decisioning



Likelihood of Crime

Capabilities



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Patrol Officer



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The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Likelihood

of Crime



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

Real-time Risk Analysis

Business Objectives



Shift Commander



Patrol Officer



Understands

geographically

where events are likely to happen





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Interactive Decisioning The agency uses predictive analytics to proactively deploy police forces and prevent crime

Effective & Efficient Force Deployment



Enabling factors (Weather, Police presence, ...)



Likelihood

of Crime



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)






Shift Commander



Patrol Officer







Shift Commander



Patrol Officer



The agency uses predictive analytics to proactively deploy police forces and prevent crime



Enabling factors (Weather, Police presence, ...)



Likelihood

of Crime



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Decisioning





Shift Commander



Patrol Officer



Understands



Risk Assessment If Day=Saturday And EntertainmentEvent And DayAfterPayday And DispatchZone=004 Then V_Crime=Yes (65, 0.98)

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Enabling factors (Weather, Police presence, ...)



Likelihood

of Crime



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

"Policing"





Shift Commander



Patrol Officer





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Interactive Decisioning

The agency uses predictive analytics to proactively deploy police forces and prevent crime







Enabling factors (Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Likelihood

of Crime



Capture ——	Predict
Enabling factors Weather conditions Police presence	
Crime data Incidents Offence Date / Time Dispatch zone	
Triggers City events Paydays Holiday	

Act

















Shift Commander



Patrol Officer







Risk Assessment: area 008

Planning

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Interactive Decisioning

The agency uses predictive analytics to proactively deploy police forces and prevent crime



"Crime Characteristics"



Likelihood

of Crime





Enabling factors (Weather, Police

presence, ...)

Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)





Shift Commander



Patrol Officer







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Interactive Decisioning

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Enabling factors (Weather, Police presence, ...)



Likelihood

of Crime

"Conditions"



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)





Shift Commander



Patrol Officer





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Interactive Decisioning

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Enabling factors (Weather, Police presence, ...)



Likelihood

of Crime

"Triggers"



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Enabling factors (Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

Step 1: Implement a data repository to store circumstances such as weather, city events, and local holidays that characterize crime.

Journey



characterizing the occurrence of crime - in order to predict future similar crimes.





Understands geographically where events are likely to happen



Step 3: Apply crime prediction models using current data to plan next day activity and officer deployment.



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Likelihood

of Crime



(Weather, Police presence, ...)



Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)



Step 4: Configure the agency's GIS application to display crime predictions and allow patrol officer interactions for up to the minute updates.



Patrol Officer





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Likelihood

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Historical crime incidents (RMS, CAD)



Triggers (City events, Paydays, Time, Holiday...)

Future Possibilities

- Tactical analysis
 - Use predictive analytics for post crime analysis and criminal investigations to gain insight into unsolved crimes.
- Apply predictive analytics in Human Capital Management
 - Recruit officers with right competencies and retain the most valuable officers
- Actively Involve Citizen Feedback
- Tackle Other Security Threats
 - Cyber Crime
 - Internal/External Terrorist Threats
 - Traffic Safety



Summary

- Police Departments doing more with less
 - Budget constraints
- Data is Increasingly Open and Accessible
- Predictive Analytics Turns Data into Insight
- Multiple Applications
 - Profiling
 - Proactive Resource Allocation
- ROI is Significant
 - Richmond Police





Questions?



Predictive Perspectives 2011

