TEMPORAL ANALYSIS AND FORECASTING

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## ABOUT ME. .

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## TEMPORAL ANALYSIS AND NEXT EVENT PREDICTION



## REMINDERS

- These specific techniques are best applied to series predictions.
- We need to use the dates/times the incident OCCURRED, not when it was reported.
- Ranges of hours or days are expected in many property crimes and will be accounted for in our analysis.


## BEHAVIOR

Humans are habitual creatures. We develop highly effective muscle memory and maintain routines of behavior to get through the mundane tasks in our lives.

Our repetitive and habitual nature also makes us very predictable. For instance, we tend to drive the same route to work or school, and prefer to shop and eat at our favorite places. This is also true for criminals, whether taking care of personal responsibilities or planning and executing their crimes.

This behavioral repetition is the foundation of tactical crime series analysis and next-event prediction.


## PREDICTING THE NEXT HIT

## DAYS OF THE WEEK

Frequency

Tempo

Burn Rate

## FREQUENCY

Count how many incidents occurred on each day

Burglary by Day


## TEMPO

## March 2024

SUNDAY MONDAY

TUESDAY
WEDNESDAY THURSDAY FRIDAY

- Identify if there is a pattern
- Every three days, two days, four days, etc.



## TEMPO

| Case Number | Date | Time | Interval | DOW |
| :--- | :--- | :--- | :--- | :--- |
| $24-1234$ | $3 / 5 / 2024$ | $0100-0350$ |  | Tue |
| $24-1235$ | $3 / 7 / 2024$ | $0130-0320$ | 2 | Thu |
| $24-1236$ | $3 / 8 / 2024$ | $2315-0345$ | 1 | Fri |
| $24-1237$ | $3 / 10 / 2024$ | $0210-0400$ | 2 | Sun |
| $24-1238$ | $3 / 14 / 2024$ | $2215-0330$ | 4 | Thu |
| $24-1239$ | $3 / 16 / 2024$ | $2330-0345$ | 2 | Sat |
| $24-1240$ | $3 / 17 / 2024$ | $0200-0415$ | 1 | Sun |
| $24-1241$ | $3 / 19 / 2024$ |  | 2 | Tue |


| Average | 2 |
| :--- | ---: |
| Standard Dev | 1 |
| Median | 2 |
| Mode | 2 |
| Min | 1 |
| Max | 4 |

## BURN RATE

- When there is no discernable temporal pattern...
- Does the value of the stolen goods correlate with the frequency of their activity?

Thefts Associated with Offender X: Property Value v Temporal Interval


Figure 12-16: Timeline of crimes with ratio of property value stolen to interval.


| Case Number | Date | Time | Interval | Property Value | Ratio \$ per Day | Prediction Days (with Avg) | $\mid$ Prediction Days (with Median) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 24-1234 | 3/5/2024 | 0100-0350 | 0 | \$300 | 150.00 |  |  |
| 24-1235 | 3/7/2024 | 0130-0320 | 2 | \$100 | 100.00 |  |  |
| 24-1236 | 3/8/2024 | 2315-0345 | 1 | \$350 | 175.00 |  |  |
| 24-1237 | 3/10/2024 | 0210-0400 | 2 | \$600 | 150.00 |  |  |
| 24-1238 | 3/14/2024 | 2215-0330 | 4 | \$325 | 162.50 |  |  |
| 24-1239 | 3/16/2024 | 2330-0345 | 2 | \$100 | 100.00 |  |  |
| 24-1240 | 3/17/2024 | 0200-0415 | 1 | \$300 | 150.00 | 2.15 | 2.1 |
| 24-1241 | 3/19/2024 |  | 2 | \$700 |  | 5.01 | 4.7 |
|  |  | Average | 2 | \$ 353.57 | \$ 139.58 |  |  |
|  |  | Standard Dev | 1 | 228.4132637 | \$ 32.03 |  |  |
|  |  | Median | 2 | \$ 325.00 | \$ 150.00 |  |  |
|  |  | Min | 1 | \$ 100.00 | \$ 100.00 |  |  |
|  |  | Max | 4 | \$ 700.00 | \$ 175.00 |  |  |
|  |  | Correlation Coefficient |  | 0.981423606 |  |  |  |
|  |  |  |  | Positive correla | between the | perty value taken and the dars | s between hits |

## PREDICTING THE NEXT HIT

## HOURS OF THE DAY

## MIDPOINT ANALYSIS

Basic analytic method to deal with uncertain temporal data is to calculate the midpoint of the timeframe of an incident. In essence - calculating the median of the incidents' time to find frequency and make a prediction.

The downside to this method is that it assigns an artificially high probability to an arbitrary median in the data, so while simple, it is not the most reliable.

## MIDPOINT ANALYSIS



## AORISTIC ANALYSIS

Aoristic analysis addresses a temporal problem common with some types of recorded crime. In many cases, police know exactly when a crime occurred.

When victims of crime are unable to say when the event occurred, many police departments record a crime event as having a 'start' date and time, and an 'end' date and time. These dates/times can also be referred to as the 'from' and 'to' date and time. The start date-time usually references when the person left their house (or parked their car), and the end date-time records when they first discovered their property missing. The period between the start date-time and end date-time is referred to as the event's time span. Incidents that have an undetermined event time are described as 'aoristic'.

Hours
Case Numbers

|  | 24-1234 | 24-1235 | 24-1236 | 24-1237 | 24-1238 | 24-1239 | 24-1240 | Total | Percentage |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 2100 |  |  |  |  |  |  |  |  |  |
| 2200 |  |  |  |  | 1 |  |  | 1 | 4\% |
| 2300 |  |  | 1 |  | 1 | 1 |  | 3 | 11\% |
| 0000 |  |  | 1 |  | 1 | 1 |  | 3 | 11\% |
| 0100 | 1 | 1 | 1 |  | 1 | 1 |  | 5 | 19\% |
| 0200 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 7 | 26\% |
| 0300 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 7 | 26\% |
| 0400 |  |  |  |  |  |  | 1 | 1 | 4\% |
| 0500 |  |  |  |  |  |  |  | 0 | 0\% |
| 0600 |  |  |  |  |  |  |  | 0 | 0\% |
| 0700 |  |  |  |  |  |  |  | 0 | 0\% |
| 0800 |  |  |  |  |  |  |  | 0 | 0\% |
|  |  |  |  |  |  |  |  | 27 |  |

A proportional probability distribution is the aoristic approach, which distributes the relative probability of the time event across each hour.

|  | B1 | B2 | B． |  | B4 | B6 | Bs | B1 | B1 |  | B15 | B16 | B17 | B18 | B19 | Total | \％ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 2100 |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  | $\bigcirc$ | 0 |  |
| 2200 |  |  | $\times$ |  |  | $\times$ |  |  |  |  |  |  | $\times$ |  |  | 3 | 5 |  |
| 2300 |  |  | $\times$ |  | $\times$ | $\times$ | $\times$ |  |  |  | $\times$ |  | $\times$ | $\times$ |  | 7 | 411 |  |
| 0000 |  |  | $\times$ |  | $\times$ | $\times$ | $\times$ |  |  |  | $\times$ |  | $\times$ | $\times$ |  | 7 | 4 |  |
| 0100 |  |  | $\times$ |  | $\times$ | $\times$ | $\times$ | $\times$ | $\times$ |  | $\times$ |  | $\times$ | 又 |  | 9 | 814 |  |
| 0200 | － |  | $\times$ |  | $\times$ | $\times$ | $\times$ | $\times$ | $\times$ |  | 又 | $\times$ | $\times$ | $\times$ | $\times$ | 12 | 19 | 384． |
| 0300 | $\times$ |  | $\times$ |  | $\times$ | $\times$ | $\times$ | $\times$ | $\times$ |  | 又 | $\times$ | $\times$ | $\times$ | X | 12 | 19 | $36^{\circ}$ |
| 0400 |  | $\times$ | $\times$ |  | $\times$ | $\times$ |  |  |  |  |  |  |  | $\times$ |  | 5 | 8 |  |
| 0500 |  | $\times$ | $\times$ |  | $\times$ | X |  |  |  |  |  |  |  |  |  | 4 | 6 |  |
| 0600 |  |  | $\times$ |  | Х | － |  |  |  |  |  |  |  |  |  | 3 | 5 |  |
| 0700 |  |  | $\times$ |  |  |  |  |  |  |  |  |  |  |  |  | 1 | 2 |  |
| 0800 |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 0 | 0 |  |
|  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  | $4 / 4$ |  |  |

Calculate the time frame by making a grid for the hours of the day，add up the incidents in each hour block and calculate the percentage for the ranges．

Count the incidents per hour，calculate the percentage and concentrate on the highest frequency times．

## COMPARISON



## REMINDER

| Mon- | 15 |  | th. | - | 13 | 4 | 4 | 1 | tib | 4 | 4 | 4 | 3 | $=$ |  | 4 | 17 | 4 | 4) | 13 | 4 | th | 1 | 13 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Tue | 13 | 3 | 1 | It | 13 | 12 | 18 | 1 | 12 | 17 | 11 | 12 | 18 | 15 | 4 | 14 | 14 | 12 | + | 11 | 3 | 4 | 18 | 4 |
| Wed | 1 | \% | 1 | is | $1{ }^{1}$ | 18 | \#1 | 4 | 1 | 12 | is | 4 | ता | 11 | \% | 4 | 12 | 4 | 4 | 3 | 4 | 4 | 5 | 16 |
| This | 11 | 41 | 18 | 1 | 14 | 12 | 14 | 1 | $\square$ | 13 | 4 | 4 | 17 | $\pi$ | 2 | 16 | 17 | 17 | 4 | 11 | 17. | 11 | + | 4 |
| Fri- | 14 | 4 | 4 | H | 11 | 7 | $\pm$ | ! | 11 | 12 | 13 | $\pi$ | 17 | स | \% | 3 | 12 | 17 | 8 | 15 | 14 | 42 | 4 | 13 |
| Sas | 1 | 4 | 4 | 17 | " | 18 | 12 | 1 | $\pm$ | 12 | 4 | 14 | 15. | 8 | *) | 1 | 1 | 1 | 4 | 12 | 4 | * | 12 | 18 |
| Sun | 18 | is | 18 | 14 | $\square$ | 18 | 4 | 12 |  | 9 | 7 | 10 | 5 | 4 | $f$ | 4 | 12 | 4 | 4 | 15 | 13 | 4 | 11 | $\pm$ |
|  | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | $\dot{8}$ | 9 | 10 |  |  | 13 | 14 | 15 | 16 | 17 | 18 | 19 | 20 | 21 | 22 | 23 |

Frequency
22
20
16
16
14
12
10
10

## USING OUR EXAMPLE NUMBERS FROM EARLIER:

If the suspects continue to act as they have in the past, anticipate our next hit being on Saturday March 23, most likely between 0200 and 0400 hours.

## CONSIDERATIONS

- If all known timeframes are over 24 hours, you cannot reliably predict the anticipated time of the next hit.
- If most incidents could have occurred over multiple days (e.g., vacation burglary), you could conduct a midpoint analysis of the days or, better yet, a similar calculation to the aoristic analysis of days of the week noting that the reliability of the prediction will be reduced due to the lack of specific temporal data.


## TEMPORAL PROGRESSION

- Times changing throughout the series
- Correlation to geographic/spatial pattern

Example - Incidents are progressively occurring later in the night (or earlier the next morning) as the incidents get further away from their central node of activity (residence).

## LINEAR REGRESSION

If there is a strong correlation of your incidents over time (either increasing or decreasing in frequency somewhat consistently) you can use Linear Regression to forecast the next interval.

| Date | Interval Days | Dow | Series Item |
| :--- | ---: | :--- | ---: |
| $1 / 1 / 2024$ |  | Mon | 1 |
| $1 / 11 / 2024$ | 10 | Thu | 2 |
| $1 / 19 / 2024$ | 8 | Fri | 3 |
| $1 / 27 / 2024$ | 8 | Sat | 4 |
| $2 / 3 / 2024$ | 7 | Sat | 5 |
| $2 / 10 / 2024$ | 7 | Sat | 6 |
| $2 / 14 / 2024$ | 4 | Wed | 7 |
| $2 / 17 / 2024$ | 3 | Sat | 8 |
| Next Hit | 2.428571429 |  | 9 |
| Corr Coef | -0.952500953 |  |  |



Figure 12-31: Accelerating tempogram including trendline \& forecast.

## TEMPORAL APPROXIMATION METHOD

- Estimates the probability that a specific type of crime will occur at any given hour of the day based on the current series and past incidents.
- Including in our analysis the historical crimes that we have precise KNOWN times for of similar crime type.






## KEEP IN MIND

We are dealing with humans, and many factors are at play in every person's life, including suspects. Even the best, most accurate predictions can still be thwarted by a suspect who changes their pattern of behavior or an outside factor or influence that changes the 'game'.

Don't fret if your forecast/prediction does not come to fruition, go back and reassess with this new information and try again.

## REFERENCES

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## FUTURE CLASSES IN THE TACTICAL SERIES



SPATIAL ANALYSIS


CRIMINAL BEHAVIOR AND TACTICAL PROFILING


PRODUCTS AND DISSEMINATION


EFFECTIVE RESPONSE

## IIII:

AFTER THE ARREST

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## QUESTIONS?

