

DME Integrative Assignment

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1 Task 1: Plan & Explore

1.1 Origin of Data & Purpose Introduction

Introduction Data drives security. The wide spread adoption of data information systems has been used to recognize crime hot-spots to increase policing efficiency and protect people. Thus, creating effective information systems for crime prevention is at the center of policy makers and executive branches of governments. This trend has led to the Chicago PD reaching out to this data management team with the request of creating a Data Management System for crime-data in Chicago.

To this end, the Chicago PD and this Data Management Unit is interested on setting the foundation for a FAIR database to answer research questions; i.e. a data base meant to flexible and easy in use of slicing and dicing data to find answers and, contemporaneously, make them available. Additionally, any code produced during this endeavour will be made public on GitHub for transparency purposes.

Data Description in Scope, Volume, and Format The data was provided by the Chicago PD contains a sample of 730,900 registered crimes in the administrative districts of Chicago between the years of 2017 and 2021. The initial data source is in CVS-format and pertains to specific recorded crimes in the administrative jurisdiction of the Chicago PD in addition to time, location, crime type, and arrested or not. Thus, the data contact is to be found on the Chicago PD website (**CITE THE CHICAGO WEBSITE FOR THE DATA**). Considerations regarding the ethical (& GDPR compliant regardless of whether the data comes from the USA) use of the data will be discussed in part 5 of this assignment.

Project time frame, researchers, and misc information The set project time frame is the 27th of August 2022 till 2nd of October 2022. Involved in this project is only one student, Angelo Barisano. Additionally, this project is designed to comply with FAIR standards (**CITE FAIR STUFF HERE**).

1.2 WHAT IS THE PURPOSE OF THIS ASSIGNMENT??

1.3 Research Question

In an iterative (agile) development cycle the following questions have been set up: Chicago is known for its high homicide rate; this leads to policy makers focusing on this issue the most.

Upon conducting an initial Exploratory Data Analysis (EDA), three major categories were identified in the data:

- Location
- Crime type
- Crime record data (time, arrest, etc.)

Based on the data categories and EDA, the following research questions guide the creation of the database in increasing complexity.

Question 1 Finding prevalent crime patterns in the data is a common starting point. Thus, this question provides future research with an adjustable query to gain an overview over the general distribution of crime by type. Subsequently applying a temporal component (i.e. by day of week, month, year, season, etc.) to this initial distribution reveals trends and temporal patterns. This way, this question helps to answer questions to policy makers regarding general trends; such as how crime developed overall and by type. As such:

- How do crime types (e.g. homicides) patterns distributed by a temporal component? How do certain crime types (homicide) patterns distribute by seasonality patterns, by time of day?

Question 2 The next logical progression is to observe the location and crime dimension together. The assumption is that certain districts and beats tend to be more prevalent in certain crime types. Thus, question two follows:

- Do certain crime patterns (e.g. for homicides) persist by location such as certain districts/ beats/ blocks?

Question 3 Finally, time, location, and crime type is triangulated. This enables policymakers to discern localized trends in the data in order to address crime patterns by distributing resources more efficiently; i.e. allocating more resources to dangerous beats during the night. Additionally, accessory dimensions will be integrated into the analysis to provide a holistic description. For instance assuming that crimes that lead to more arrests are more resource intensive, these crimes put a disproportionate strain on law enforcement. Thus, by triangulating arrests by location and e.g. time of day this will enable us to show areas that need more attention by law enforcement. Another angle would be a specific analysis of beats. **Beats are the smallest administrative unit of a police district; a beat is patrolled for one year by one unit and then transferred to another beat. Thus, it might be interesting to investigate the connection between a subset of beats that suddenly stop showing problems during one year and then re-appear in terms of crime in another year. The sub-question would, thus, investigate whether beats that usually persisted in crime only persist on a closed yearly basis. This way, effective police units might be identified and resources might be allocated more efficiently.**

- Triangulating time, crime-type, and location which areas persists in certain crimes wrt. time? In order to prevent homicides; which “beats“ are the most prevalent among homicides? During which time of day (for effective allocation of policing resources)?

As such, the final question considers a variety of hypotheses that can be explored. Overall, these project based questions are constructed in such a way that they guide an external user (PD) through the process of finding areas that need successively complex “sliced & diced” information and culminate in the creation of actionable policy implications regarding crime prevention through resource allocation.

ADD PLOTS of EDA ALREADY HERE!!!

2 Design and Organize

IMPORTANT!!!! READ THE DEFINITION FOR 3rd NF AGAIN; MAYBE CRIME AND LOCATION QUALIFY TO BE 3rd NF... but maybe also not. STRESS AGAIN THAT THE INCLUSION OF BLOCK IS NOT NEEDED FOR THIS RESEARCH!!!

Entity 1: Case Part 1 identified three relevant data categories. The first component consist of the individual instances of cases. Conceptually, these are central to this project as they enable the creation of the frequency distributions conditional on time and/or location. The variables that define this entity are as follows:

- CaseId
- DateTime object implicitly containing day, month, year, and time of day
- Arrest Boolean
- Location Description??
- Location Description??
- Location Description??

The DateTime object will enable the clustering of crimes by the time dimension. Additionally, arrest information is used to further drill down the analysis and dissect the cases for more resource intensive cases. Finally, the dimensions of Latitude and Longitude will be included on the case level. The reason for this is, while lat-lon information pertains to the location category, this variable(s) is case specific due to its precision. Imagine the database where latitude and longitude would be described as a standalone entity hierarchically below district or beat. To make the relation work each location would have to carry a CaseId as a foreign key in order to identify what type of crime was perpetrated at this location. Assuming that the lat-lon information is sufficiently granular, this would create a one-to-one relationship between case and the lat-lon entity (disregarding district in this case). Any one-to-one relationship is redundant. Thus, it does not make sense to place lat-lon as a standalone entity hierarchically below district. The reason for the inclusion of lat-lon is its usage as geopandas objects in plotting crime in a heat-map in part 6. Please note that while the information of lat-lon technically violates 1st NF requirements, this

information is not supposed to be processed via SQL (except for PostGIS applications) but as a datatype in scripting languages; thus it is an atomic item.

The primary benefit of case as an entity is to make the following two dimensions compliant to the 2nd normal form (and to some extent compliant with 3rd normal form with some caveats) by default. If we were to leave out case as an entity and immediately match crime types and location, the resulting two entities could not comply with 3rd normal form as crime types and location (as categories) would produce a many-to-many relationship. As such, the case entity inadvertently functions as an associative entity, reducing many-to-many relationships to two many-to-one relationships.¹ As a consequence, case complies to the 3rd NF by definition as no stand alone entities are to be found in this entity, while requiring the other data categories to normalize as well. It is notable, that while such design choices should be reflected by leaving out case as an entity in the conceptual model in part 3 and then include it as part of the logical model, but case is so pivotal to the functioning of the database in its purpose, that we will consider it along the way a a valid entity.

Entity 2: Crime Type Every Case requires a crime to be a valid instance. The raw data provides the IUCR, which identifies each unique combination of primary (e.g. homicide) and secondary crime category (e.g. first degree). Generally, most headlines only consider the primary type of crime, such as homicides, and generally disregard the secondary description of the data, such as first, second, or third degree in this case **CITE SOME EXAMPLE NEWSPAPERS**. However, while this assignment might not need the information regarding secondary description; it is also the task of a FAIR database to enable future users to differentiate between different types of general crimes. Furthermore, it might be the case, that certain subcategories of crimes tend to be more prevalent than others. As such, the crime type entity contains both the primary category and the secondary description of the crime committed. It is notable that it does not make sense to further normalize this category, as the primary type column, though repeating, would be an entity of one dimension; thus, superfluous. **It is notable that the secondary description, while unique to the IUCR in most cases does not suffice to be the primary key due to some duplication (not unique) in addition to being long for some crime types.**

Entity 3 & 4: Location The first entity identified in this case pertains to (police) district. Following hierarchically, beats are below district; one district containing multiple beats. Thus, a natural hierarchy is being identified, resolving any issues regarding normalization when connecting case to district and then to beat.

It is notable, that the choice of splitting district from beat is a design choice meant to improve clarity and demonstrate knowledge of the 3rd NF. The existstence of beat as an entity technically removes the need for a district entity due to all information being included in the case and beat entity at the same time. If we were to remove the leation from district to case, the resulting queries would be more complex than needed. **MAYBE WE SHOULD REMOVE THE CONNECTION OF DISTRICT AND CASE!!!**

The reason to exclude block as a entity of analysis is threefold. 1) blocks overlap to some extend with different districts and beats increasing the level of analysis unnecessarily. 2) Beats and districts are administrative units, while blocks require local knowledge. 3) The information regarding the location of the case happening is already included in the lat-lon information in entitiy one as block only pertains to a reducted version of the address making the lat-lon information more informative when plotted (also: no map regarding blocks in chicago is available).

Logging & Master Table Finally, a small master table will be included which tracks any information regarding formatting the data, data retrieval, and restrictions/ triggers called (not included in part 3 due to relevancy).

Conclusion Due to the fundamental nature of the data, with the case itself being fundamental to the entire structure, all issues regarding normalization and inadvertently many-to-many relationships are solved as will be demonstrated in the next section.

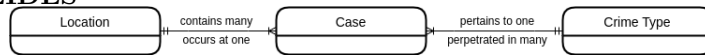
VERY IMPORTNAT: regarding the crime type YOU CAN USE THE PRIMARY TYPE AND SECONDARY TYPE BOTH TOGETHER IN ONE TABLE USING IUCR IN THE

¹I will not further elaborate on this; this is a logical conclusion; in order to reach 2nd normal form this is a required step which is obvious

CRIME - THEN YOU CAN SIMPLY USE THE DESCRIPTION FOR ONE INTERESTING QUESTION AND ARGUE THAT THIS IS LEFT OVER SO THAT PEOPLE CAN DISTINUGSH FURTHER LATER DOWN

3 Part 3: ERD

IMPORTANT!!!! DESCRIBE IN THE CONCEPTUAL MODEL ETC WITH TEXT THAT EG CRIME TYPE "HAS MANY" CASES ABOVE THE LINES LIKE ON THE SLIDES



3.1 Conceptual Model

As mentioned in part 2, the individual case instance is central to the database design. Contemporaneously, the case entity resolves all problems regarding normal form and many-to-many relationships. Subsequently, the conceptual model describes the relation of the three entities described in part 2:

- Location
- Case
- Crime Type

As can be seen in Figure 1, Location contains polygon information regarding where which administrative area the crime instance allocated to. Location is related to case utilizing beat as a foreign key in case (see Figure 3). This necessitates that this relation is directional from location to case; i.e. in one beat one or many cases can be instantiated. However, one case can only relate to one beat and district.

INTERMEZZO It may be notable that the model shows mandatory relationships for Crime Type and location. Technically correct would be to use non mandatory relationships for location and crime type. For example a district or crime may not have been perpetrated and, thus, would not have a record. This research does not consider this case as the goal of this data base is to use the existing data for analysis. As such, in order for a district/crime to be included in the database, a crime instance must have been created for these instances. As such, the choice was made to include a mandatory relationship.

Following, case is related to crime type. Crime type describes the crime perpetrated. This is why, the IUCR is included as a foreign key in case. Consequently, the cardinality reads as one case only pertaining to one crime type being perpetrated. Contrarily, one crime type can be represented in many cases.

3.2 Logical Model

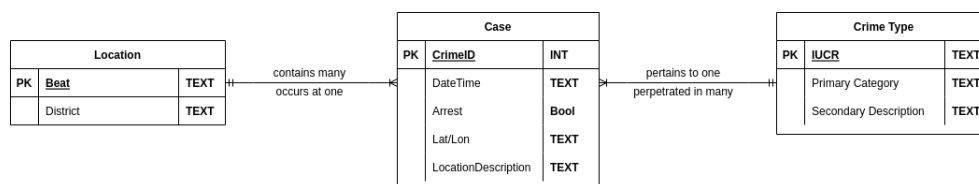
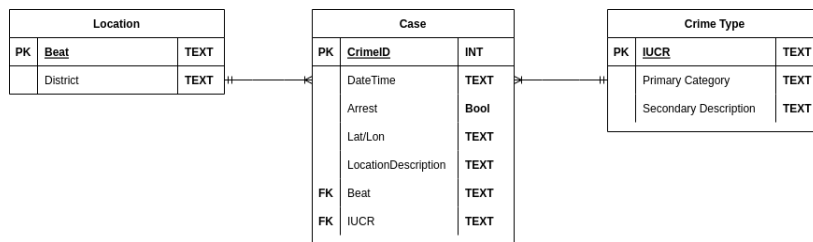


Figure 2 describes the logical model. For location, "beat" is chosen as primary key because if we were to normalize this relation to 3rd NF, beat (as an entity) would be hierarchically below District; one district - many beats. As such, each district is uniquely identifiable by its beat in case we want to aggregate, which is why beat is the most suitable primary key. As argued in part 2, there is no reason to normalize to 3rd NF in this case. More importantly, the primary key beat is in TEXT form. The reason for this is that beats are defined in the first two characters by their district and the latter two describe the beat. Thus, a beat instance may start with a "0". In many scripting languages and some databases, this leads to problems and the removal of the "0", as the underlying software does not interpret the "0". As such, TEXT was chosen for data quality reasons. Please note that the same argument applies to crime type and IUCR. Following, CrimeID was chosen to be the primary key of case, due to it being a natural primary key. This is a standard auto-incremental integer key and can, thus, be treated as an integer; though care should be applied when reading the data into scripting languages. Finally, crime type's primary key is the IUCR key, a natural primary key. It uniquely identifies each crime category plus its secondary description.

3.3 Physical Model



As mentioned in part 2, the inclusion of case as a full entity through the entire process automatically removes any many-to-many relationships. Moreover, the usage of the appropriate foreign keys was discussed in section 3.1 in accordance to the cardinalities. As such, the logical model described in section 3.2 also corresponds to the physical model by definition with the exception of the foreign keys. The choice of foreign keys was made due to the direction of the cardinalities in Figure 3; beat and IUCR are natural keys for their respective entities and are, thus, unique.

4 Part 4- Data Quality checks and preparation

DATA TRIANGLE in lecture!!! ALSO THE META DATA AND ETHICAL CONSIDERATIONS!! REGARDING GDPR that data quality is important to be complied by!!! This is also important for fair wrt interpretability and reusability

After the setup of the data management plan in part 1 to 3, the implementation requires data preparation and data quality check. **In this context, the data triangle was used.** Generally, the data quality of the provided sample is very good; less than 0.01% of observations display any abnormality. This is attributable to the origin of the data being of administrative nature by public offices. The operations performed specifically relate to the relevant data for this endeavour mentioned in part 3. Firstly, 3 instances contained no casenumbers. These records were broken overall and were, thus, removed. Secondly, 16 instances missed date. As date is a central to the analysis, these records have to be removed. Moreover, 79 instances had non-correspondent beats and districts. While it would have been possible to impute the missing data based on the block or lat-lon information, one must assume that all location related information wrt. these observations is compromised. Similarly as before, location quality is central to answering the questions in this assignment; thus, these instances were removed. Finally, 149 perfectly duplicate items were removed.

In terms of data transformations, date was transformed into SQL castable form to run functions on date. Moreover, beat and district instances were repaired wrt. the preceding "0" filler, creating instances of length four and two respectively. Finally, arrest ("true", "false") was cast into boolean form.

Regarding non-crucial abnormality, 15 instances miss arrest; but this information is only used for one subquery once. Additionally, seven records of casenumbers display noncompliance. However, CaseID is a perfect reflection for this issue. Considering CaseID, set-tests were made to warrant that no IDs were missing (see appendix) beyond the removed records. Further, one instance of lat-lon showed an extreme outlier which was converted to NaN, due to the beat and district information appearing properly. **All instances with minor problems were marked, which will be represented in the MasterTable of this project.** It may also be notable that the absence of information is still information; i.e. financial crime might not have a location.

Overall, the consequences of removing these observations will be minimal. Of a total of 730900 observations, we were left with 730654 records.

Considering the IUCR, there are some duplication values. It must be noted that most instances contain typos in the description; as such, the IUCR is always compliant. Thus we use a right join to remove all duplications of IUCR which will not change the data

5 Part 5

ENCRYPTION OF DATABASE!!!!!!!

NOT: ALSO ADD THE DISTINCT IUCR TO THE CRIME TYPE TABLE! CHANGE THE TABLENAMES IN THIS ENTIRE FILE!!!

Notes: - reading data

6 Part 6

Note: the goal of this assignment is to do most if not all data transformation in SQL and let python handle only minor conversions such as into the right dtype object (eg GEOPANDAS)

IMPORTANT! READ DATABASE INTO PYTHON HERE LIKE YOU DID AT VYTAL!!!

Note: Sadly in order to create an index, one cannot use subqueries due to SQLLITE (this feature is present in other versions of SQL tho); as such, the index that increases speed for arrest heavy crimes does not work here.

Please note that many queries, particularly those meant for visualization were read into python immediately (so they use queries to get the results needed and then let python do the rest). Additionally, the database was not saved directly in the repository due to security concerns (.gitignore). Moreover, no virtual environment was set up to facilitate the project

6.1 Question 1:

The first question considered how overall crime patterns are distributed with respect to the temporal component. To this end the following queries were constructed

- Distribute Total Crimes per year to see the overall trend of crimes committed. This is relevant for policy makers such as attorneys generals which are responsible for crime levels in the city and their persecution.
- Further, this analysis is then extended to primary crime-categories by year and month in order to provide a more drilled down perspective to this question regarding overall specific crime. This is relevant as certain crimes are more relevant in the public eye, such as homicides.
- these crimes are then subsectioned into resource intensive crimes compared to non resource intensive crimes; this is decided on whether the crime type overall leads to a more than 50% arrest quota in addition to more than 500 total arrests for this category over the entire timeframe
- bad crimes by time of day are also addressed
- Finally, a window function is used in order to find the yearly change in crime by primary crime type

Moreover, in order to ease the analysis, a view with transformed date attributes (i.e. year, month, day, hour of day) for each crime was created.²

- How do crime types (e.g. homicides) patterns distributed by a temporal component? How do certain crime types (homicide) patterns distribute by seasonality patterns, by time of day?

Very simple: -report how total crimes went down - then report the resource intensive crimes how they behaved (500 total arrests needed because 100 per year minimum) - then mention the crime category that showed the largest reduction among all crimes - then report one drill down into homicides for the secondary category to be used (report how each secondary category evolved)

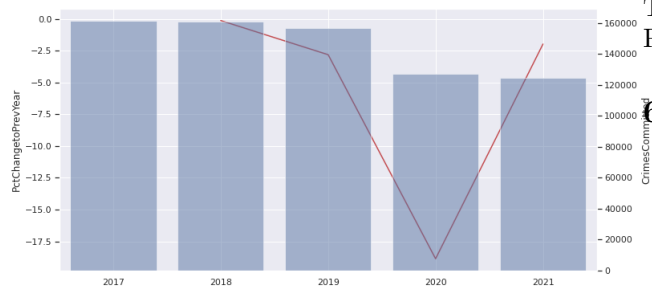
Figure 4 contains the overall analysis of the time component by crime. Primarily, these graphics are focused on providing policy makers of Chicago information regarding the overall crime level of the city

Part 1 As can be seen in **Figure 4 a)** overall crime levels reduced during the observation time-frame of 2017 to 2021. In 2017, the overall level of crimes recorded was at 161304, which gradually reduced to 124558 crimes committed. Overall, this resulted in a reduction of 22.78% in total crimes recorded.

6.2 Question 2:

- Do certain crime patterns (e.g. for homicides) persist by location such as certain districts/ beats/ blocks?

²Please note that views should only be used for frequently used queries and converted variables



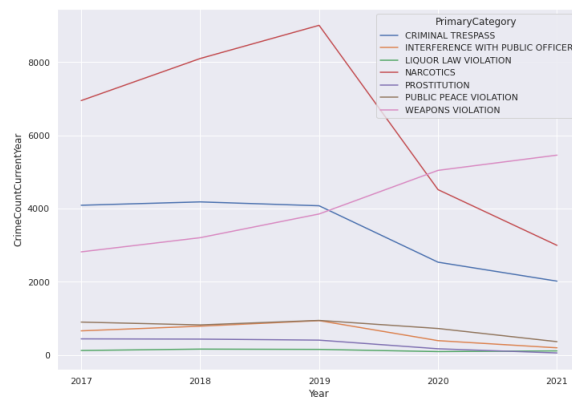
(a) Total Crimes Recorded

PUT AN INDEX ON RESOURCE INTENSIVE CRIMES (WHERE ARREST PROPORTION ABOVE 50%)

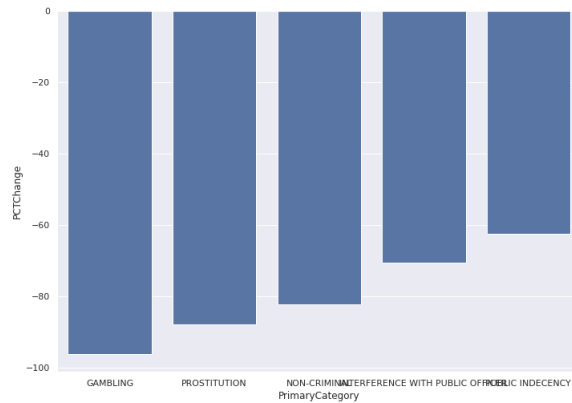
6.3 Question 3:

- Triangulating time, crime-type, and location which areas persists in certain crimes wrt. time? In order to prevent homicides; which "beats" are the most prevalent among homicides? During which time of day (for effective allocation of policing resources)?

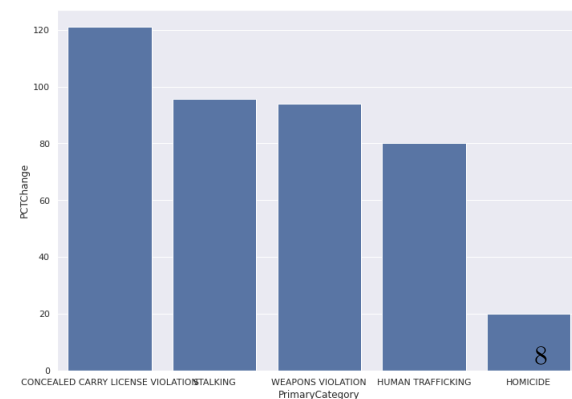
6.4 Conclusion



(b) Resource intensive Crimes Annual Change



(c) Crime Categories with the greatest Reduction



(d) Crime Categories with the greatest Increase