# Data

#### 2023-06-19

### Data

### **Data Sources**

The main sample is a daily-level panel (2016-2022) constructed using several administrative data sets obtained through Freedom of Information Act requests including Chicago Police Department (CPD) 911 call dispatches, officer shifts, and ShotSpotter activation dates.<sup>1</sup> Additionally, these data are supplemented with reported incidents of crime, gun victimization, and ShotSpotter alerts downloaded from Chicago's Open Data Portal.

The CPD 911 call dispatch data encompasses all 911 calls that led to the dispatch of a CPD officer. This administrative data is rich, containing information on the time of the 911 call, the time an officer is dispatched to the scene of the crime, and the time the officer arrives on-scene—each recorded at the seconds level and capturing details including the priority, description, location, and whether an arrest is made.

Based on this information, we construct the two main outcome variables: the time from a 911 call to an officer dispatch (call-to-dispatch) and the the time from a 911 call to an officer's arrival (call-to-on-scene). Notably, while call-to-dispatch contains no missing data, approximately 52% of the call-to-on-scene information is missing due to officers failing to report when they arrive at the scene. However, we address this potential limitation in Appendix BLANK where we find little evidence of significant changes in the frequency of officers failing to report their on-scene time due to ShotSpotter's rollout.

The police shift data contains information on every shift start time, end time, and district/beat assignment worked by CPD staff in the sample period. We restrict the shift data to include only police officers that are present for duty, excluding administrative positions and higher level managerial roles such as police lieutenents and police chiefs. To assess officer availability, we construct the number of officer hours within a police district-day. By using on the number of officer hours rather than the number of shifts, we account for the possibility of overtime or early-leave.

The ShotSpotter activation dates indicate when each police district is equipt with ShotSpotter technology. However, since the exact activation day is missing, we rely on ShotSpotter alert data, which provides minute-level alerts. This allows us to determine the specific activation day for each police district. Nonetheless, we observe several discrepancies in the activation dates when comparing to the number of alerts in districts 6, 9, 10, and 15. In particular, these districts have no ShotSpotter alerts until several months after their official activation date. Therefore, we adjust these four dates of activation to align with the onset of ShotSpotter alerts. This adjustment ensures that the effects observed are accurately attributed to police officers responding to ShotSpotter alerts. However, as a robustness check, we estimate our results using the official dates in Section BLANK and find that our results remain consistent.

Figure BLANK shows the monthly trend of ShotSpotter alerts in addition to the activation dates as displayed by the dashed line. Each police district exhibts an increase in ShotSpotter alerts as time progresses. This is likely due to ShotSpotter's machine learning algorithms refining with time.

<sup>&</sup>lt;sup>1</sup>We restrict officer shifts to only sworn police officers who are present for their shift.

# Sample Restrictions

10% We restrict the sample to only 911 call dispatches of priority 0 (emergency assistance), priority 1 (immediate dispatch), priority 2 (rapid dispatch), and priority 3 (routine dispatch). Priorities 4 and 5 are omitted as these are reserved for special cases and administrative designations such as a police beat-meeting. These exclusions account for approximately  $\sim 0.04\%$  of the total number of 911 dispatches. By including only priorities 0-3, the analysis focuses only on the call types that are most commonplace or require the most time-sensitive responses.

Three further restrictions are implemented to reduce sensitivity of the estimates. First, all observations that exhibit a negative call-to-dispatch or call-to-on-scene time are removed, accounting for approximately 0.03% of the data. Second, for each priority level, call-to-dispatch and call-to-on-scene outliers that exceed three standard deviations from the mean are omitted. This is done to mitigate the impact of outliers on the ordinary least squares estimator which is sensitive to extreme values. We relax this restriction in Section BLANK to verify the consistency of the results. Last, specific dates including January 1, July 4, and December 31 are excluded from the analysis. These dates coincide with celebratory gunfire and fireworks that may generate many false-positive ShotSpotter alerts.

### **Descriptive Statistics**

Each data source is aggregated to the police district-day and matched by police district and date. Importantly, both call-to-dispatch and call-to-on-scene times are averaged, and hence, these outcomes are interpreted as average daily response times within a police district-day. Conversely, officer hours, ShotSpotter alerts, crimes and arrests are aggregated as counts and therefore represent the number of occurrences within a police district-day.

Table ?? shows summary statistics of the main outcome variables and corresponding control variables, all presented at the police district-day level. Panel A shows that the time to dispatch a police officer to the crime scene for priority 1 911 calls (Call-to-Dispatch) is approximately four minutes, while it takes police officers an additional six minutes on average to arrive on-scene. We additionally plot the distribution of both of these outcome variables in Figure ?? which shows that the average daily call-to-dispatch and call-to-on-scene times are centered around their mean, although their right tails are rather large. Priority 1 calls are the most frequent as shown in Panel B, and police officers are dispatched approximately 150 times a day within a district. Moreover, for every 100 police dispatches, there are approximately 14 arrests made (Arrest Rate). Considering the high level of crime in the South and West locations of Chicago, the presence of officers varies considerably across districts, ranging from as little as 200 officer-hours or as high as 3431 officer-hours. We later analyze this heterogeneity in officer hours in Section BLANK where we find longer response times when there are fewer officers.