The Gun Violence Database: A new task and data set for NLP Supplementary Material

Ellie Pavlick¹ Heng Ji² Xiaoman Pan² Chris Callison-Burch¹

¹Computer and Information Science Department, University of Pennsylvania ²Computer Science Department, Rensselaer Polytechnic Institute

Time and Place
City
State
Other details (home, school, etc.)
Date (DD/MM/YYYY)
Clock Time (HH:MM)
Time of day (e.g. morning/afternoon/night)
Alleged Shooter(s)
Name
Gender
Age
Race
Victim(s)
Name
Gender
Age
Race
Was the victim injured?
Was the victim hospitalized?
Was the victim killed?
Circumstances of shooting
Type of gun
Number of shots fired
Answer Yes/No/Not able to determine
The shooter and the victim knew each other.
The incident was a case of domestic violence.
The firearm was used during another crime.
The firearm was used in self defense.
Alcohol was involved.
Drugs (other than alcohol) were involved.
The shooting was self-directed.
The shooting was a suicide or suicide attempt.
The shooting was unintentional.
The shooting was by a police officer.
The shooting was directed at a police officer.
The firearm was stolen.
The firearm was owned by the victim/victim's family.

Table 1: The full list of questions we ask annotators to answer about each article.

Read the text of the article carefully. Afterward, please answer the questions about the information in the article. You will be asked two types of questions:

1. Yes/No questions about the circumstances of the shooting described in the article. For these questions, please base your answers only on the information in the article. You should answer "Not mentioned" unless the answer to the question is explicitly given, or you can very confidently infer the answer from the text.

2. <u>Descriptive information</u> about people and places. For these questions, you will be asked to highlight a span in the text which contains the answer to the question.

Tips and examples:

* For yes/no questions, use your best judgement when making inferences. If unsure, you should choose "Not mentioned". For example, in most cases, you should answer "Not mentioned" for the question "Was alcohol involved in the shooting?" unless the article explicitly says that alcohol was involved. However, if the article describes a 5 year old boy would accidentally fires a gun while playing, it would be okay to answer "No" for the question "Was alcohol involved in the shooting?" since it is reasonable to infer that the 5 year old was not under the influence of alcohol.

* For highlighting questions, you should try to highlight the smallest span possible that contains a complete answer to the question. For example, the article may contain the sentence "The shooting took place at 11:30 am in the parking lot of the school." When asked to indicate clock time, you should highlight <u>11:30 am</u> and NOT The shooting took place at 11:30 am. If you can't find the answer, leave the input blank.

* "Clock time" refers to the exact time of the shooting, e.g. 11:30 am. "Time of day" refers to the approximate time of the shooting, e.g. "afternoon" or "after dark."

Table 2: Instructions given to annotators at the start of each article.

INFORMATION EXTRACTION

+MORE INFORMATION

Read the text carefully. Please highlight the parts of the text that correspond with the below information, if they exist. For example, if the text mentions that the shooting was on the afternoon of Saturday May 26th, please highlight "afternoon" and select "time of day". PLEASE READ THE INSTRUCTIONS BEFORE YOU START WORKING ON THIS HIT: SHOW DETAILED INSTRUCTIONS

publication date: December 7, 2015 Man, 27, shot twice in Meatpacking District after fender bender with minivan: officials A fender bender in the Meatpacking District left a 27-year-old motorist in the hospital early Tuesday, but not in a way one would expect, officials said. The motorist was shot in the arm and the hip after he got into a fiery exchange with a man in a grey minivan. The minivan driver slammed into his car as he pulled out of a spot on Gansevoort and W. 13th Sts., officials said. The victim had just pulled out onto the street when he	Before you start working on this HIT, please read article carefully and decide whether it's related to gun violence. you decide that this article is not related to gun violence, will be replace with another article. There is also a possibility that even if article is related to gun violence it doesn't describe a single event or for some other reasons you are not able to work on this HIT, then please check th answer that says the article is beyond the scope of this HI and explain why.
collided with the minivan about 4:15 a.m., cops said. But, instead of getting out of their cars to exchange information, the two exchanged curses and insults, cops were told. As the argument became more and more heated, the minivan driver pulled a gun and started blasting away, striking the victim twice before	Not Related To Gun Violence Continue To Work On This Article Gun Violence Article But Beyond The Scope Of This H Confirm

Figure 1: Before extracting information from an article in order to populate the database, workers confirm that the article is/is not describing a specific incident of gun violence.

A fender bender in the Meatpacking District left a 27-year-old motorist in the hospital early Tuesday, but not in a way one would expect, officials said. The motorist was shot in the arm and the hip after he got into a fiery exchange with a man in a grey minivan. The minivan driver slammed into his car as he pulled out of a spot on Gansevoort and W. 13th Sts., officials said. The victim had just pulled out onto the street when he collided with the minivan about 4:15 a.m., cops said. But, instead of getting out of their cars to exchange information, the two exchanged curses and insults, cops were told. As the argument became more and more heated, the minivan driver pulled a gun and started blasting away, striking the victim twice before speeding off, cops said. Although he was injured, the victim also jumped into his car and sped off, police were told. He ultimately stopped two blocks away on Washington St. near W. 14th St., where he called 911. He was recovering at Bellevue Hospital Tuesday, officials said. Cops were looking for the shooter Tuesday morning.

Please read th for all question information th inferred from t	e text carefully, ns. Please base y at is explicitly sto the text of the ar	and then select an answer rour answers only on ated or can be confidently ticle.
Alcohol was inv	olved.	
Yes	No	 Not Mentioned
Drugs (other th	an alcohol) were	e involved.
Yes	No	 Not Mentioned
The shooting w	as self-directed.	
Yes	O No	ONot Mentioned
The shooting w	as a suicide or s	uicide attempt.
Yes	O No	ONot Mentioned
Back	Task	2/7 Next

Figure 2: Annotators first answer a series of yes/no questions about the circumstances of the shooting described in the article.

Man, 27, shot twice in Meatpacking District after fender bender with minivan: officials A fender bender in the Meatpacking District left a 27-year-old motorist in the hospital early Tuesday, but not in a way one would expect, officials said. The motorist was shot in the arm and the hip after he got into a fiery exchange with a man in a grey minivan. The minivan driver slammed into his car as he pulled out of a spot on Gansevoort and W. 13th Sts., officials said. The victim had just pulled out onto the street when he collided with the minivan about 4:15 a.m., cops said. But, instead of getting out of their cars to exchange	First, try to figure out the date of the described event, and select it by clicking on the calendar icon. The publication date and the day of week mentioned in article are helpful in determining the date of the shooting. Next, click on parts of the text that correspond to the other information listed below, if that information is present in the article. When you highlight a passage of text in the article, you will get a dropdown menu that lets you select which question it answers.
information, the two exchanged curses o Clear this highlight a nent became more and more heated, the minivan driver pulled control of the victim twice before speeding off, cops said. Although he was clock Time (1p.m., 2:37a.m) car and speed off, police	Date 2015-12-08
were told. He ultimately stopped two blo Time Of Day (Morning, Evening) th St., where he called 911. Additional Location Details City: Clock Time (1p.m., 2:37a.m): Time Or Day (worning, Evening):	Stote NH - New Hampshire \$
Additional Location Details:	City Meatpacking District
	Clock Time (Ip.m., 2:37a.m)

Figure 3: Annotators then highlight specific spans of text in the article which correspond to specific pieces of information about the incident, e.g. the name of the shooter. When an annotator highlights a span, they are given a choice of which field the span corresponds to. The annotators can not enter answers directly as free-text.

Time Of Day (Morning,

publication date: December 7, 2015 Aan, 27, shot twice in <mark>Meatpacking District</mark> after fender bender with minivan: officials	Fill out t and che multiple the "Ad them b
, fender bender in the Meatpacking District left a <mark>27-year-old</mark> motorist in the hospital early Tuesday, but not n a way one would expect, officials said. The motorist was shot in the arm and the hip after he got into a	also a v out info
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nore heated, the minivan driver pulled a gun and started blasting away, striking the victim twice before	Age
ne: Age: Race:	Gende
	Race
	Victim

Victim #1		
Name		
Age	27-year-old	×
Gender	Male	\$
Race		
Victim wa	5:	
🗌 🗆 Kill	ed 🔽 Injured	 Hospitalized

Figure 4: The annotators populate the database by hilighting spans and selecting the corresponding field, rather than entering information as free text. This ensures a clear mapping between information in the database and natural language text in the article, and makes it easier to train automated systems to reproduce the extracted information.

Memphis Officer Shot During Traffic Stop National News - WCVB Home	Police Identify Suspect In Memphis Officer's Killing
CRAWLED DATE: 8/3/2015	CRAWLED DATE: 8/3/2015
Authorities say Officer Sean Bolton died after he was shot during a traffic stop in Memphis Saturday night. Authorities say Officer Sean Bolton died after he was shot during a traffic stop in Memphis Saturday night.	Police in Memphis identified a 29-year-old convicted bank robber as the man who allegedly killed a city cop during a traffic stop on Saturday. Police director Toney Armstrong on Sunday evening told reporters that officer Sean Bolton apparently interrupted a drug deal and that after "some type of physical altercation," Bolton was shot and killed by a passenger in the car. Armstrong said police were searching for 29-year-old Tremaine Wilbourn and had issued a warrant for his arrest. Wilbourn had

Figure 5: Annotation interface for soon-to-come event coreference annotation. Workers view two articles and determine whether or not they describe the same event.

ch people from the firs	st article with people from the second artic	cle.	
d the article ┛		Read article 🗐	
Victim #1a	✓ No match	Victim #2a	
NAME: Sean Bolton	Victim #2a Officer Sean Bolton	NAME: Officer Sean Bolton	
AGE: unknown		AGE: 33	
RACE: unknown		RACE: unknown	
GENDER: Male		GENDER: Male	
VICTIM WAS: killed		VICTIM WAS: killed	

Figure 6: Annotation interface for soon-to-come cross-document entity coreference annotation. Workers view profiles of two entities from two different articles and determine whether or not they describe the same person.