

COURSERA CAPSTONE PROJECT

Car Accident Severity

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Problem and Background

- According to the Association for Safe International Road Travel (ASIRD) approximately 38,000 people die in road crashes in the United States each year.
- The fatality rate is 12.4 deaths per 100,000 inhabitants.
- An additional 4.4 million people are injured seriously enough to require medical attention.
- Road crashes are the leading cause of death in the U.S. for people aged 1-54.
- The ability to leverage available data to make predictions related to automobile accidents would be valuable to a wide range of industry groups.

Scope of Project

- Identification of factors (such as speed, time of day, and weather conditions) that contribute to accidents.
- Build regression classification models to predict severity of accidents with out of sample data.
- Use of regression classification modeling provides for measures of probability, given various conditions, that can be considered as risk of accidents.
- This information will be useful to those in the traffic safety industry for the purpose of implementing actions to reduce risks of accidents.
- Information will also be of use to the insurance industry.

Dataset Information

- Source data is the Seattle “Collisions – All Years” dataset produced by the Seattle SDOT Traffic Management Division, Traffic Records Group.
- Point of contact for the data is the SDOT GIS Analyst at DOT_IT_GIS@seattle.gov.
- Period covered by the data is January 2004 to 19 May 2020.
- There are 194,673 observations and 37 attributes.

Dataset Preprocessing

- Duplicate or unnecessary features were removed.

X	Y	INKEY
COLDKEY	REPORTNO	STATUS
SDOTCOLNUM	LOCATION	SEVERITYCODE.1
SEVERITYDESC	ST_COLDESC	EXCEPTRSNCODE
EXCEPTRSNDESC	ST_COLCODE	SDOT_COLCODE
SDOT_COLDESC	INTKEY	INCDATE
OBJECTID	SEGLANEKEY	CROSSWALKKEY

- The label , or target, for models is “SEVERITYCODE” which indicates the severity of the collision (“1” for property damage or “2” for injury).
- Label contains unbalanced data which required balancing to preclude bias in the model.

Dataset Preprocessing (Cont.)

- Attributes with missing values were identified.
- Analysis of each attribute was done to determine appropriate steps to resolve missing information.
- Replaced missing information with the most frequently occurring value.
- Replaced null values with “0”.

```
In [185]: #Look for Missing Values.
```

```
df.isnull().sum()
```

```
Out[185]: SEVERITYCODE      0
          ADDRTYPE        1926
          COLLISIONTYPE    4904
          PERSONCOUNT     0
          PEDCOUNT        0
          PEDCYLCOUNT       0
          VEHCOUNT        0
          INCDTTM          0
          JUNCTIONTYPE     6329
          INATTENTIONIND   164868
          UNDERINFL       4884
          WEATHER          5081
          ROADCOND         5012
          LIGHTCOND        5170
          PEDROWNOTGRNT    190006
          SPEEDING         185340
          HITPARKEDCAR      0
          dtype: int64
```

Dataset Preprocessing (Cont.)

- Categorical features were converted to numbers.

```
In [210]: #COLLISIONTYPE  
df['COLLISIONTYPE'].value_counts()
```

```
Out[210]: Parked Car    52891  
Angles        34674  
Rear Ended    34090  
Other         23703  
Sideswipe     18609  
Left Turn     13703  
Pedestrian     6608  
Cycles        5415  
Right Turn    2956  
Head On       2024  
Name: COLLISIONTYPE, dtype: int64
```

```
In [211]: df['COLLISIONTYPE'].replace(to_replace=['Parked Car', 'Angles', 'Rear Ended', 'Other', 'Sideswipe',\  
                                                'Left Turn', 'Pedestrian', 'Cycles', 'Right Turn', 'Head On',\  
                                                ], value=[0,1,2,3,4,5,6,7,8,9], inplace=True)
```


Dataset Preprocessing (Cont.)

- Object data types were converted to integers.

```
In [223]: #Check Data Types.
```

```
df.dtypes
```

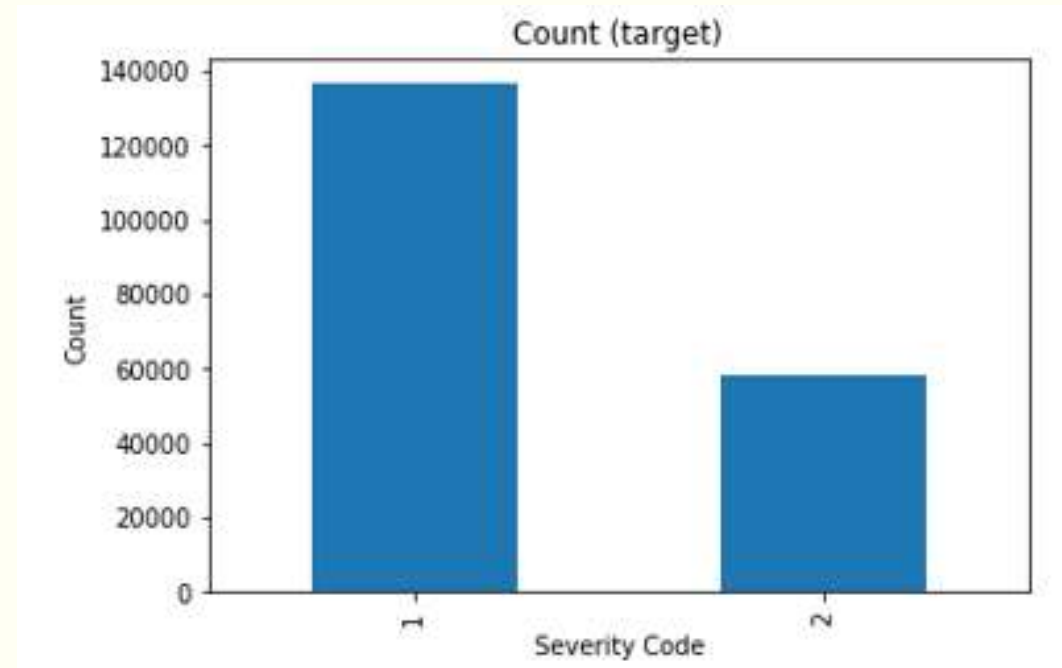
```
Out[223]: SEVERITYCODE      int64  
ADDRTYPE      int64  
COLLISIONTYPE  int64  
PERSONCOUNT  int64  
PEDCOUNT     int64  
PEDCYLCOUNT   int64  
VEHCOUNT      int64  
INCDTTM       object  
JUNCTIONTYPE  int64  
INATTENTIONIND int64  
UNDERINFL     object  
WEATHER       int64  
ROADCOND      int64  
LIGHTCOND     int64  
PEDROWNOTGRNT int64  
SPEEDING      int64  
HITPARKEDCAR  object  
dtype: object
```

```
In [224]: #Convert Objects to Integers.
```

```
df['UNDERINFL'] = pd.to_numeric(df['UNDERINFL'])  
df['WEATHER'] = pd.to_numeric(df['WEATHER'])  
df['HITPARKEDCAR'] = pd.to_numeric(df['HITPARKEDCAR'])
```

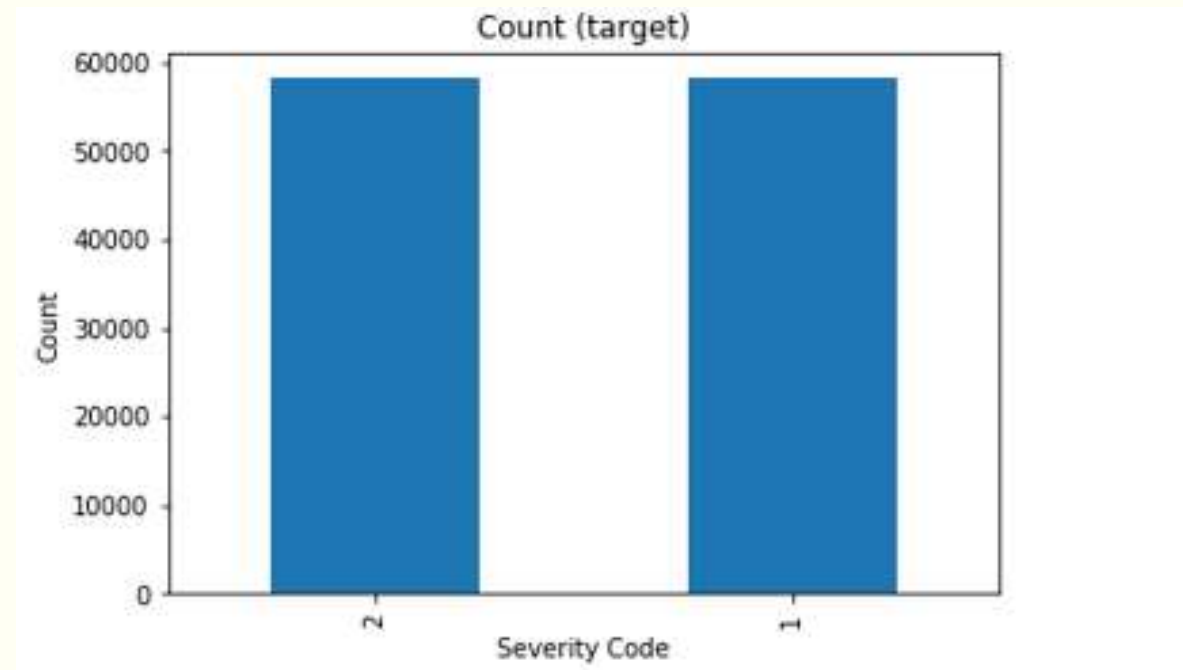
Dataset Preprocessing (Cont.)

- Target for models was Severity Code.
 - 1 – Property Damage
 - 2 – Injury
- Target data was unbalanced.
- Would create bias in models if not adjusted.



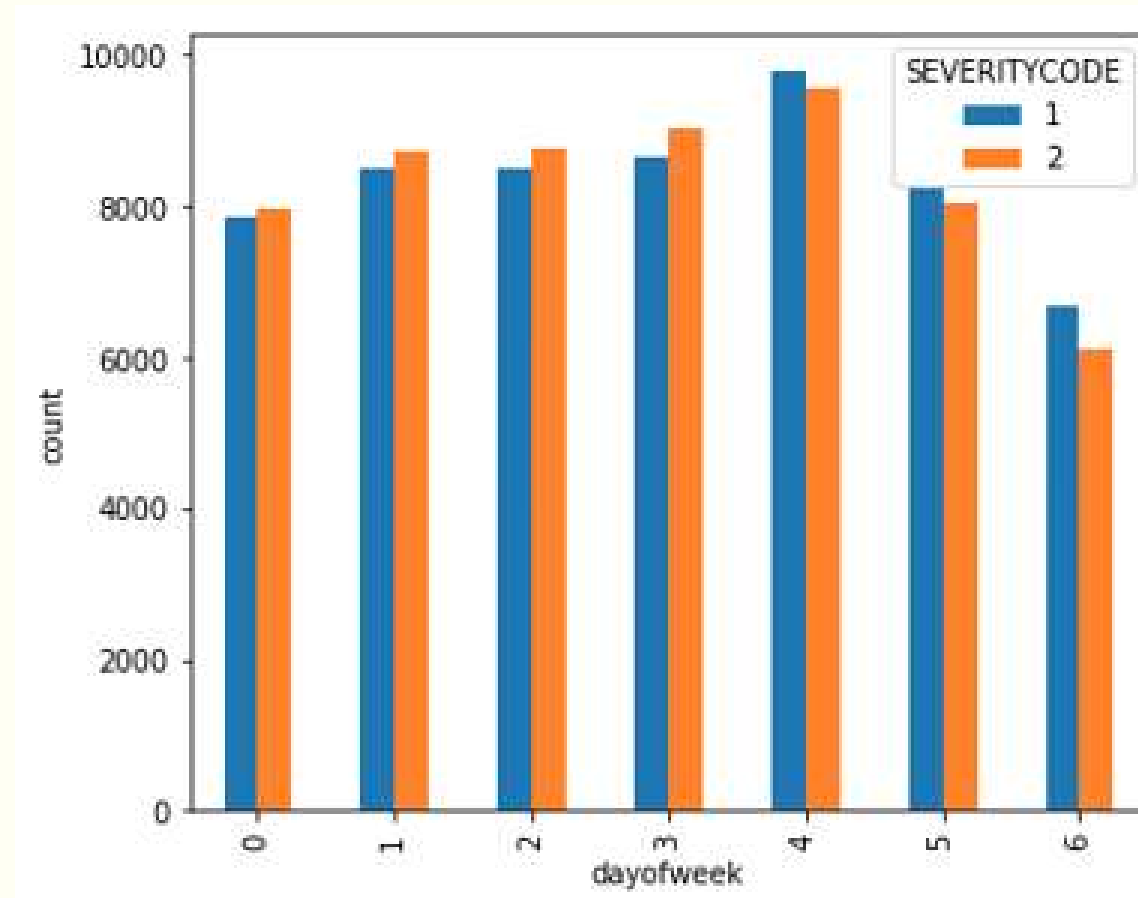
Dataset Preprocessing (Cont.)

- Steps were taken to balance the dataset.
- Balanced dataset consists of 116,376 records.



Dataset Preprocessing (Cont.)

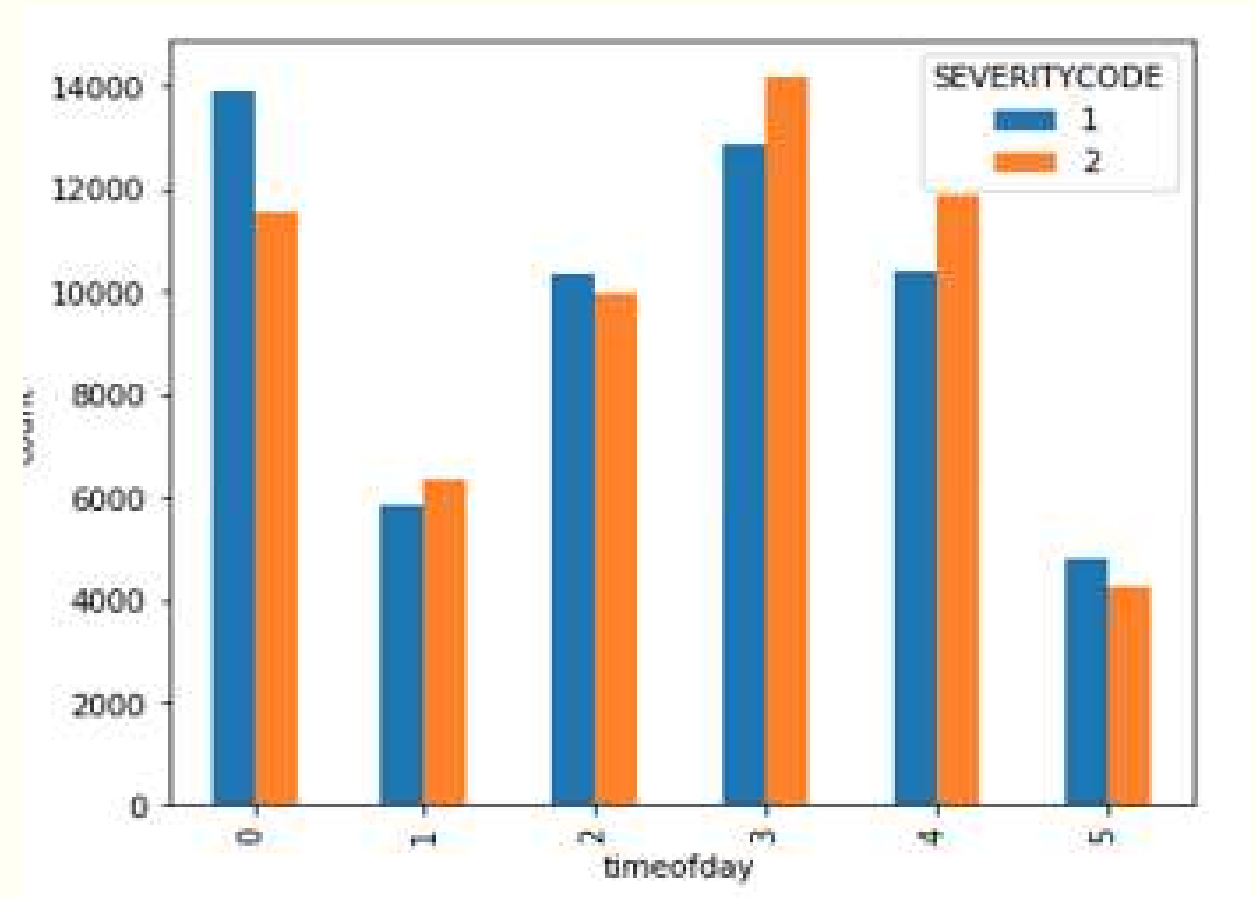
- Incident date time feature (INCDTTM) was an object.
- Conversion to date time format allowed for calculations.
- Day of week analysis shows mostly minor variations in accidents by day.
- Noticeable drop in number of accidents on Saturdays.



Dataset Preprocessing (Cont.)

- Time of day grouped into 6 bins for analysis.
- Fewer number of accidents during the periods 0400-0800 and 2000-0000.

Time of Day	Bin
0000 to 0400	0
0400 to 0800	1
0800 to 1200	2
1200 to 1600	3
1600 to 2000	4
2000 to 0000	5



Dataset Preprocessing (Cont.)

- 15 features were selected for use in the models from the initial attributes.
- 2 additional features were derived from the INCDTTM field:
 - dayofweek
 - timeofday

ADDRTYPE	COLLISIONTYPE	PERSONCOUNT
PEDCOUNT	PEDCYLCOUNT	VEHCOUNT
JUNCTIONTYPE	INATTENTIONIND	UNDERINFL
WEATHER	ROADCOND	LIGHTCOND
PEDROWNOUTGRNT	SPEEDING	HITPARKEDCAR
dayofweek	timeofday	

Modeling

- Objective of models is to predict severity of accidents; thus Classification models were used.
- K Nearest Neighbor
- Decision Tree
- Support Vector Machine
- Logistic Regression

Modeling (Cont.)

- Since all data was manually converted to numerical, uncertain if sklearn preprocessing to further standardize data would have an impact.
- Models were run with and without preprocessing – variances were minor.
- Data was split into Train and Test groups
 - Train set: (93,100, 17) (93,100,)
 - Test set: (23,273, 17) (23,276,)

Model Evaluation

- Accuracy of models was evaluated using sklearn metrics library:
 - Jaccard
 - F-1
 - LogLoss
- Models were run with and without sklearn preprocessing resulting in minor differences.
- In both cases, decision tree and logistic regression models produced slightly better scores.

	Jaccard	F1-Score	LogLoss
Algorithm			
KNN	0.66	0.68	17.31
Decision Tree	0.71	0.68	17.31
SVM	0.66	0.68	17.31
Logistic Regression	0.71	0.68	17.31

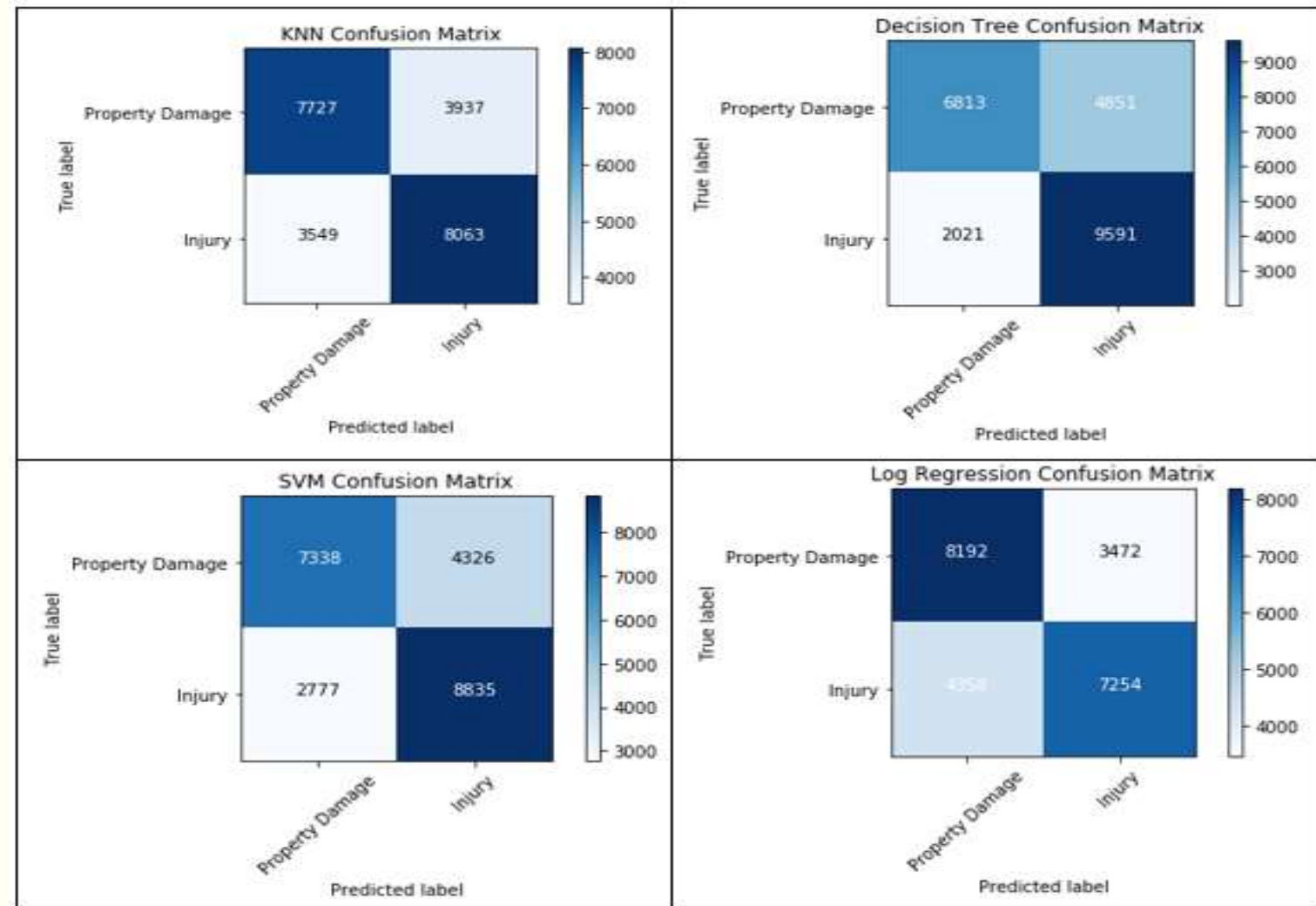
Scores Without Preprocessing

	Jaccard	F1-Score	LogLoss
Algorithm			
KNN	0.68	0.67	17.31
Decision Tree	0.71	0.67	17.31
SVM	0.69	0.68	17.31
Logistic Regression	0.71	0.67	17.31

Scores With Preprocessing

Model Evaluation (Cont.)

- Confusion matrices for each model.
- Confirm decision tree and logistic regression best results.
- Decision tree better predicting accidents with injuries.
- Logistics Regression better predicting accidents with property damage.



Conclusion

- Using Seattle accident information dataset we processed the data and built classification models that predicting accident severity with reasonable accuracy.
- We noted a noticeable drop in number of accidents occurring on Saturdays.
- We also noted significantly fewer accidents occurred during the time periods 0400-0800 and 2000-0000.
- There is room for improvement in accuracy of models.
- Future efforts could perform more feature evaluation to determine best features for use in models.
- Additional datasets could be added to include information such as nationwide data and population information.
- Categorical target data could be expanded to additional classifications such as fatality information.