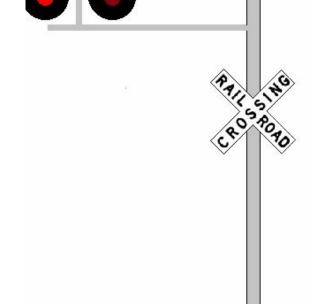
Forecasting Safety: The Meteorological Impact On Highway-Rail Grade

Crossing Safety



Chance Spurlin Math 111A WI24

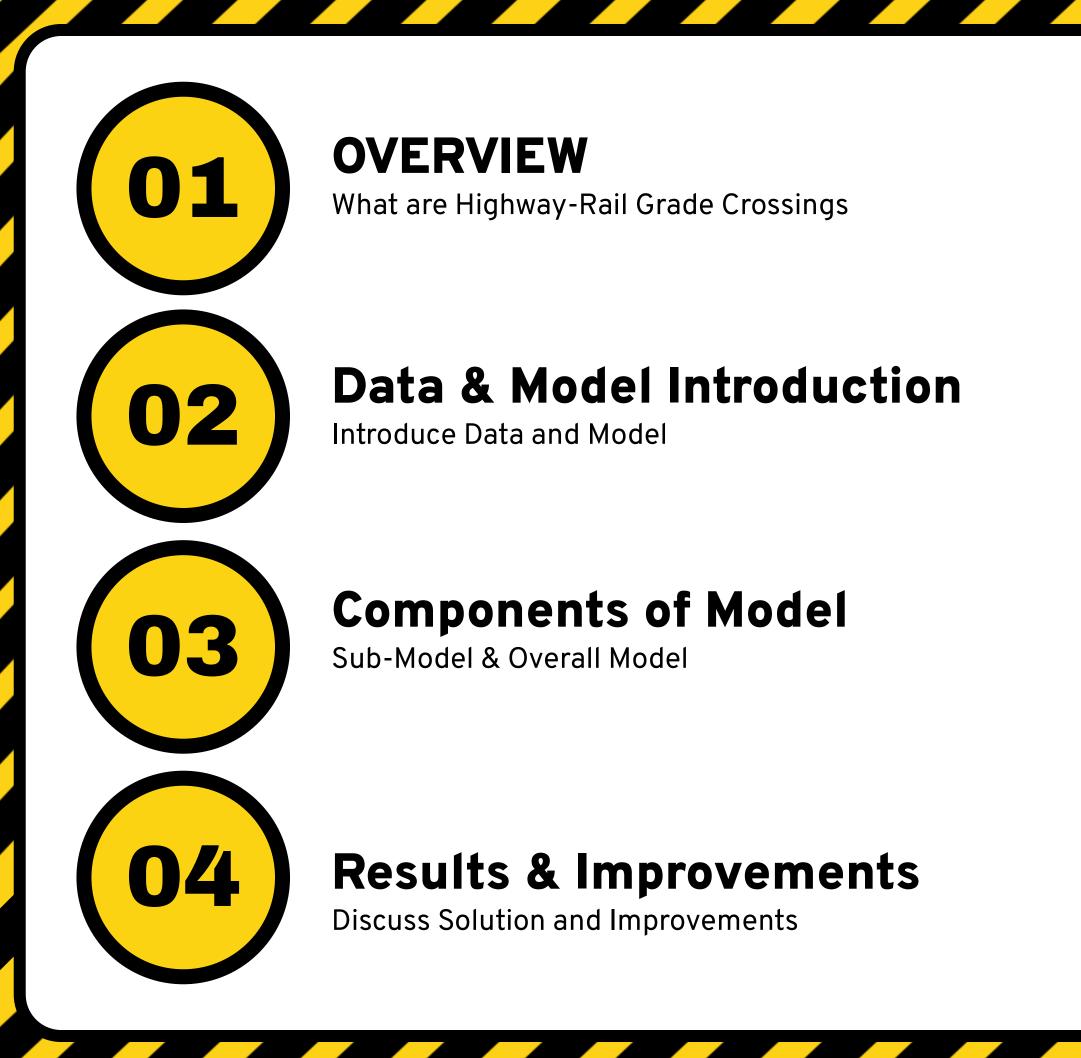


TABLE OF CONTENTS

What are Highway-Rail Grade Crossings?



At-grade (versus Grade Separated)

What's significant about these crossings?

Essential Intersections

- Used by heavy and light rail to provide passenger transportation, large cargo shipments, military usage, etc.
- Many Historic Railroads from 1800's still in use today "Santa Fe Depot"
- Efficient Transportation Network =
 less traffic + more \$\$

Safety Concern

- Highway-rail at-grade crossings account for 30 percent of all rail related fatalities.
- Vehicles at train crossings and pedestrians walking on tracks account for 95 percent of all rail-related deaths.





Question: How do different meteorological conditions impact the safety and volume of traffic at rail grade crossings in San Diego County?

How can this help?



ACCIDENT PREVENTION



REDUCE EMERGENCY RESPONSE TIMES



INCREASED TRAFFIC FLOW

DATA COLLECTION

U.S. Department of Transportation & Federal Railroad Administration

- Crossing Inventory Data (Form 71)
- Highway-Rail Grade Crossing Accident Data (Form 57)
 - 10 years
- Updated Monthly
- Reported Incident

Railroar - In	icident - Grade C -1	Date - T	ime 🕝	Nearest - County I -	Tempera - Visib	ility - Visibility -	Weathe - Weathe	- Fauinme -	Train Ma - AAD	T - TDT	- (rossine -	Crossine *	Crossing - Cr
NCTC	43 026813M	5/23/2018	- Industrial	OCEANSIDI SAN DIEGO	65	3 Dusk	1 Clear	Passenger 1	- Install	8000	67	536000	1	
ATK	45 026813M	8/15/2018		OCEANSIDI SAN DIEGO	80	2 Day	1 Clear	Passenger 1		8000	67	536000	1	
ATK	48 026813M	4/24/2018	7:46 PM	OCEANSIDI SAN DIEGO	70	3 Dusk	1 Clear	Passenger 1	90	8000	67	536000	1	. 2
ATK	68 026813M	2/29/2020	11:05 PM	CP SHELL SAN DIEGO	59	4 Dark	2 Cloudy	Passenger 1	90	8000	67	536000	1	. 2
ATK	62 026816H	4/18/2019	3:55 PM	OCEANSIDI SAN DIEGO	70	2 Day	1 Clear	Passenger 1		6300	138	869400	1	3
BNSF	84 026817P	7/17/2021	11:58 PM	SAN DIEGO SAN DIEGO	72	4 Dark	2 Cloudy	Freight Trai	55	5566	260	1447160	1	. 3
NCTC	3 026818W	7/12/2013	8:10 PM	CPLONGB(SAN DIEGO	60	4 Dark	1 Clear	Commuter	90	9200	53	487600	1	3
ATK	19 026818W	3/16/2015	8:15 AM	OCEANSIDI SAN DIEGO	66	2 Day	1 Clear	Passenger 1	90	9200	53	487600	1	. 3
ATK	37 026818W	#######	2:41 PM	CPLONGB(SAN DIEGO	68	2 Day	1 Clear	Passenger 1	90	9200	53	487600	1	. 3
ATK	79 026818W	4/2/2020	4:50 PM	CP LONGB(SAN DIEGO	0	2 Day	1 Clear	Passenger 1	90	9200	53	487600	1	
ATK	8 026820X	7/1/2013		OCEANSIDI SAN DIEGO	72	4 Dark	2 Cloudy	Passenger		6688	59	394592	1	
BNSF	13 026820X	8/7/2014		CARLSBAD SAN DIEGO	60	4 Dark	2 Cloudy	Freight Trai		6688	59	394592	1	
ATK	54 026820X	9/26/2019		CP CARL SAN DIEGO	71	4 Dark	1 Clear	Passenger		6688	59	394592	1	
ATK	72 026820X	6/15/2020		CP CARL SAN DIEGO	69	2 Day	1 Clear	Passenger		6688	59	394592	1	
ATK	36 026827V	3/15/2017		SOLANA BE SAN DIEGO	65	2 Day	1 Clear	Passenger		13200	59	778800	1	
ATK	59 026827V	########		CP PONTO SAN DIEGO	58	4 Dark	1 Clear	Passenger		13200	59	778800	1	
ATK	34 026830D	########		OCEANSIDI SAN DIEGO	54	4 Dark	1 Clear	Passenger		9000	53	477000	1	
NCTC	21 026834F	3/12/2015		CP DEL MAI SAN DIEGO	60	4 Dark	1 Clear	Passenger		4100	59	241900	1	
ATK	28 026834F	2/4/2017		SOLANA BE SAN DIEGO	64	2 Day	1 Clear	Passenger		4100	59 59	241900	1	
NCTC ATK	35 026834F 49 026834F	2/4/2017 4/8/2018		SOLANA BE, SAN DIEGO SOLANA BE, SAN DIEGO	74 68	2 Day	1 Clear 1 Clear	Commuter Passenger	65 65	4100 4100	59	241900 241900	1	
NCTC	2 026838H	2/7/2013		SORRENTO SAN DIEGO	55	2 Day 3 Dusk	1 Clear	Commuter	60	27500	53	1457500	1	
ATK	7 026838H	2///2013		SAN DIEGO SAN DIEGO	75	2 Day	1 Clear	Passenger 1		27500	53	1457500	1	
NCTC	97 026838H	9/6/2022		SORRENTO SAN DIEGO	65	4 Dark	1 Clear	Passenger 1		27500	53	1457500	1	
ATK	57 026852D	#######		OLD TOWN SAN DIEGO	69	2 Day	1 Clear	Passenger 1		22000	203	4466000	1	
NCTC	98 026852D	*******		OLD TOWN SAN DIEGO	62	2 Day	1 Clear	Passenger 1		22000	203	4466000	1	
ATK	67 026856F	2/18/2020		CP CONVALSAN DIEGO	60	2 Day	1 Clear	Passenger 1		3000	209	627000	1	
NCTC	18 026857M	10/5/2015		OLD TOWN SAN DIEGO	66	2 Day	3 Rain	Commuter	65	17000	209	3553000	1	
ATK	23 026857M	8/28/2015		SAN DIEGO SAN DIEGO	72	2 Day	1 Clear	Passenger 1		17000	209	3553000	1	
NCTC	44 026857M	6/20/2018		SANTA FE D SAN DIEGO	65	2 Day	1 Clear	Passenger 1		17000	209	3553000	1	
ATK	51 026857M	3/21/2019		SAN DIEGO SAN DIEGO	57	4 Dark	1 Clear	Passenger		17000	209	3553000	1	
NCTC	85 026857M	11/9/2021		OLD TOWN SAN DIEGO	53	2 Day	1 Clear	Passenger 1		17000	209	3553000	1	
ATK	90 026857M	7/18/2021		CP CONVAL SAN DIEGO	77	2 Day	1 Clear	Passenger 1		17000	209	3553000	1	
NCTC	104 026857M	9/3/2023		OLD TOWN SAN DIEGO	75	2 Day	1 Clear	Commuter	65	17000	209	3553000	1	
ATK	25 026861C	9/16/2015	6:05 AM	SAN DIEGO SAN DIEGO	70	1 Dawn	1 Clear	Passenger		3673	209	767657	1	
ATK	32 026861C	6/14/2016	9:25 AM	SAN DIEGO SAN DIEGO	70	2 Day	2 Cloudy	Passenger	50	3673	209	767657	1	. 2
ATK	33 026861C	#######	8:25 AM	SAN DIEGO SAN DIEGO	70	2 Day	1 Clear	Passenger		3673	209	767657	1	
ATK	55 026861C	9/27/2019	9:00 PM	CP CONVAL SAN DIEGO	70	4 Dark	1 Clear	Passenger 1	50	3673	209	767657	1	. 2
NCTC	4 026866L	8/2/2013	10:30 PM	SAN DIEGO SAN DIEGO	65	4 Dark	1 Clear	Commuter	50	24000	59	1416000	1	. 2
ATK	11 026866L	1/21/2014	10:10 AM	SAN DIEGO SAN DIEGO	68	2 Day	1 Clear	Passenger	50	24000	59	1416000	1	2
ATK	26 026866L	1/18/2016	1:45 PM	SAN DIEGO SAN DIEGO	64	2 Day	1 Clear	Passenger 1	50	24000	59	1416000	1	. 2
ATK	39 026866L	6/24/2017	11:35 PM	SAN DIEGO SAN DIEGO	64	4 Dark	1 Clear	Passenger 1	50	24000	59	1416000	1	. 2
ATK	50 026866L	7/26/2018	11:47 AM	SAN DIEGO SAN DIEGO	74	2 Day	1 Clear	Passenger 1	50	24000	59	1416000	1	. 2
ATK	1 026867T	#######	10:42 PM	SAN DIEGO SAN DIEGO	62	4 Dark	1 Clear	Passenger 1	50	28000	59	1652000	1	. 2
ATK	99 026867T	9/13/2023	11:10 PM	CP ASH SAN DIEGO	64	4 Dark	2 Cloudy	Passenger 1	50	28000	59	1652000	1	
ATK	96 026869G	7/16/2022	2:15 PM	SAN DIEGO SAN DIEGO	7	2 Day	2 Cloudy	Passenger 1	20	2000	209	418000	1	. 2
NCTC	75 026870B	#######	4:26 PM	SANTA FE D SAN DIEGO	50	3 Dusk	1 Clear	Passenger 1		10100	209	2110900	1	
BNSF	24 026875K	6/11/2015		SAN DIEGO SAN DIEGO	68	4 Dark	1 Clear	Freight Trai		9300	1	14900	1	
SDTI	66 026878F	9/4/2019		GASLAMP Q SAN DIEGO	73	1 Dawn	1 Clear	Passenger 1		9300	1	9300	1	
BNSF	61 026890M	4/9/2019		SAN DIEGO SAN DIEGO	67	2 Day	1 Clear	Yard/switc		9387	1	9387	1	
BNSF	30 026897K	6/24/2016		NATIONAL (SAN DIEGO	76	2 Day	1 Clear	Yard/switc		1	1	1		
BNSF	52 026902E	#######		NATIONAL (SAN DIEGO	60	1 Dawn	1 Clear	Yard/switc		2707	1	2707	1	
BNSF	6 027062B	1/18/2013		OCEANSIDI SAN DIEGO	62	4 Dark	1 Clear	Freight Trai		9206	67	616802	1	
BNSF	10 027062B	6/25/2013		OCEANSIDI SAN DIEGO	68	4 Dark	1 Clear	Freight Trai		9206	67	616802	1	
CAX	53 027062B	12/8/2019		OCEANSIDI SAN DIEGO	61	2 Day	2 Cloudy	Commuter	55	9206	67	616802	1	
ATK .	78 027062B	9/22/2020		CP SHELL SAN DIEGO	77	2 Day	1 Clear	Passenger		9206	67	616802	1	
NCTC	58 027562Y	6/12/2019		COLLEGE B SAN DIEGO	70	2 Day	1 Clear	DMU	55	49000	70	3430000	1	
NCTS	29 027576G	7/28/2016		PALOMAR C SAN DIEGO	73	4 Dark	1 Clear	DMU	55	30700	70	2149000	1	
ICTC	80 027590C	1/19/2022		NORDAHL SAN DIEGO	65	2 Day	1 Clear	DMU	55	4000	70	280000	1	
NCTS	100 027590C	1/18/2023		NORDAHL SAN DIEGO	50	3 Dusk	1 Clear	DMU	55	4000	70	280000	1	
NCTS	83 027593X	2/17/2021		NORDAHL SAN DIEGO	54	3 Dusk	1 Clear	DMU	55	9000	70	630000	1	
SDTI	76 661797E	11/1/2020		BARRIO LOI SAN DIEGO	68	4 Dark	1 Clear	Passenger Passenger		1900	418	794200	1	
SDTI	31 661800K	3/9/2016	5:42 AM	SAN DIEGO	62	4 Dark	1 Clear	Passenger		3200	418	1337600	1	
DTI	95 661800K	12/9/2022		BARRIO LOI SAN DIEGO	60	4 Dark	1 Clear	Passenger		3200	418	1337600	1	
SDTI	101 661801S	3/24/2023		HARBORSII SAN DIEGO	67	3 Dusk	1 Clear	Passenger		3250	418	1358500	1	
SDTI	47 661802Y	#######		25TH AND (SAN DIEGO	63	2 Day	1 Clear	Passenger		16500	424	6996000	5	
SDTI	74 661802Y	8/2/2020		25TH AND (SAN DIEGO	66	2 Day	1 Clear	Passenger		16500	424	6996000	5	
SDTI	88 661802Y	9/8/2021		25TH & COLSAN DIEGO H STREET SAN DIEGO	74 64	4 Dark 2 Day	1 Clear 1 Clear	Commuter	55 50	7000	424 418	6996000 2926000	3	
SDTI	9 661808P													

DATA COLLECTION

December 2023 — Sun in San Diego

4:42 pm (244°) 4:42 pm (244°)

4:42 pm (244°) 4:42 pm (244°)

4:42 pm 🛩 (243°)

4:42 pm (243°)

4:43 pm (243°) 4:43 pm (243°)

4:43 pm (243°

4:43 pm (243°) 4:44 pm (243°)

4:44 pm 🛩 (243°)

4:45 pm (242°)

4:45 pm (242°) 4:46 pm (242°)

4:47 pm - (242°)

10:06:57

10:05:26 -0:44

10:04:05 -0:39

10:01:29 -0:25

10:00:05 -0:11

9:59:53

5:19 am

WBAPS

Web

Based

Accident

Prediction

System

or blee	.,,,,,,,,,																	
CROSSING	RR	STAT	E COUNTY	CITY	ROAD	NUM	OF C	COLI	ISIO	NS	DATE	W	TOT		TTBL			AADT
						22*	21	20	19	18	CHG	D	TRN	TRK	SPD	PVD	LNS	
026857M	NCTC	CA	SAN DIEGO	SAN DIEGO	WASHINGTON ST	0	2	0	1	1		GT	209	4	65	YES	5	17,000
661802Y	SDTI	CA	SAN DIEGO	SAN DIEGO	28TH ST	0	1	1	0	1		GT	424	2	55	YES	5	16,900
026813M	NCTC	CA	SAN DIEGO	OCEANSIDE	SURFRIDER WY	0	0	1	0	3		GT	67	1	90	YES	2	8,000
661829H	SDTI	CA	SAN DIEGO	SAN DIEGO	21ST ST	0	1	0	0	1	07/19	SS	294	2	30	YES	2	2,000
661827U	SDTI	CA	SAN DIEGO	SAN DIEGO	19TH ST	0	1	0	0	0	07/19	SS	294	2	30	YES	2	2,000
026852D	NCTC	CA	SAN DIEGO	SAN DIEGO	TAYLOR ST	1	0	0	1	0		GT	203	4	40	YES	5	22,000
661903K	SDTI	CA	SAN DIEGO	SAN DIEGO	EUCLID AVE	0	1	0	0	0	11/19	GT	294	2	55	YES	4	17,000
662048E	SDTI	CA	SAN DIEGO	SAN DIEGO	SMYTHE ST	0	1	0	0	1		GT	565	2	55	YES	2	10,640
027062B	NCTC	CA	SAN DIEGO	OCEANSIDE	MISSION AVENUE	0	0	1	1	0		GT	67	2	55	YES	4	9,206
661926S	SDTI	CA	SAN DIEGO	LA MESA	UNIVERSITY AVE	0	0	1	0	0		GT	294	2	50	YES	7	18,000
661892A	SDTI	CA	SAN DIEGO	SAN DIEGO	COMMERCIAL ST	0	1	0	1	0		SS	120	2	30	YES	2	1,360
662036K	SDTI	CA	SAN DIEGO	CHULA VISTA	L ST	0	0	0	1	0		GT	418	2	55	YES	5	15,984
662047X	SDTI	CA	SAN DIEGO	CHULA VISTA	DAIRY MART RD	0	0	1	0	0		GT	418	2	55	YES	5	14,700
661899X	SDTI	CA	SAN DIEGO	SAN DIEGO	FRANCIS ST	0	0	1	0	0		GT	294	2	30	YES	4	10,000
027562Y	NCTS	CA	SAN DIEGO	OCEANSIDE	COLLEGE BL	0	0	0	1	0		GT	70	2	55	YES	4	49,000
026820X	NCTC	CA	SAN DIEGO	CARLSBAD	GRAND AV	0	0	1	1	0		GT	59	1	90	YES	2	6,688
026838H	NCTC	CA	SAN DIEGO	SAN DIEGO	SORRENTO VALLE	Ξ 1	0	0	0	0		GT	53	3	60	YES	6	27,500
026870B	NCTC	CA	SAN DIEGO	SAN DIEGO	W ASH ST	0	0	1	0	0		GT	209	5	15	YES	4	10,100
661797E	SDTI	CA	SAN DIEGO	SAN DIEGO	BEARDSLEY ST	0	0	1	0	0	11/19	GT	418	3	55	YES	2	1,900
662035D	SDTI	CA	SAN DIEGO	CHULA VISTA	MOSS ST	0	1	0	0	0		GT	418	3	50	YES	2	7,000
661884H	SDTI	CA	SAN DIEGO	SAN DIEGO	OCEAN VIEW BLVD	0	0	0	0	0	07/19	XB	294	2	30	YES	4	6,000
661824Y	SDTI	CA	SAN DIEGO	SAN DIEGO	14TH NATL AVE	0	0	0	0	0	07/19	SS	294	2	30	YES	4	5,000

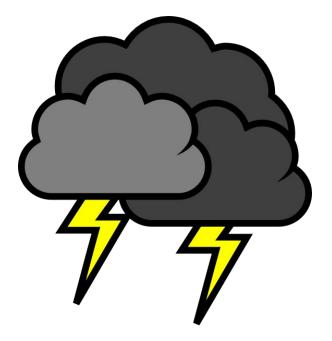
TimeAndDate AS

Historical Collision Data & Physical Characteristics

My Model Approach:

Two Models:

- Meteorological Impact Score (MIS) Sub-Model
 - Assess the impact of meteorological conditions on safety
- Meteorological-Adjusted Risk Calculator (M.A.R.C) Model
 - Integrate the MIS sub-model into the overarching risk assessment model
 - Accounting for the MIS impact on physical features and traffic volume (CROSSING EXP) in real time



Meteorological Impact Score (MIS) Sub-Model:

- Model the IMPACT of different weather conditions and sunlight levels

Variables used: Visibility, Weather Condition

- Visibility (V_{rating}):
 - Categorized into Four Ranks:
 - Dawn, Day, Dusk, and Dark
 - Assigned a score
 - Time of Day & Month

$$V_{\text{Illuminated}} = \begin{cases} 0 & \text{if } I = 1 \text{ (Crossing Illuminated),} \\ V_{\text{rating}} & \text{if } I = 0 \text{ (Crossing NOT Illuminated).} \end{cases}$$

- Weather (W):
 - Categorized into Three Conditions:
 - Clear, Cloudy, Rainy
 - Assigned score based on perceived & analyzed impact.

Meteorological Impact Score (MIS) = $V_{\text{illuminated}} + W$

Meteorological Adjusted Risk Calculator (M.A.R.C) Model:

- Dynamically calculates the risk at highway-rail grade crossings by integrating the MIS sub-model along with physical safety features and traffic volume

Variables used: MIS, Crossing Exposure (CE_M), Max Speed of Train (M), Baseline Speed(B), Cross Warning Type (W)

a,b,c coefficients determined through model calibration

 x_1, x_2, x_3 coefficients used to calibrate weather impact by regional data (San Diego County)

- Crossing Exposure (CE)
 - Quantifies the potential interaction between vehicles and trains

$$CE_M = (AADT \times TDT) \cdot (1 - \frac{MIS}{x_2})$$

- Cross Warning Type (W):
 - Categorized into Four Groups: **High Effect:**
 - Gates

Moderate Effect:

- Cantilever, Standard FLS, Hwy Traffic Signal

Minimal Effect:

- Crossbucks, Stop Signs

No Effect:

No Warning Device.

$$MARC = e^{((a(1+MIS\cdot x_1)\cdot (M-B))+b(CE_M)-c(W\cdot (1-MIS\cdot x_3)))}$$

Meteorological Impact Score (MIS) Sub-Model Results:

Meteorological Conditions:

Weather:

Clear

Cloudy

Rainy

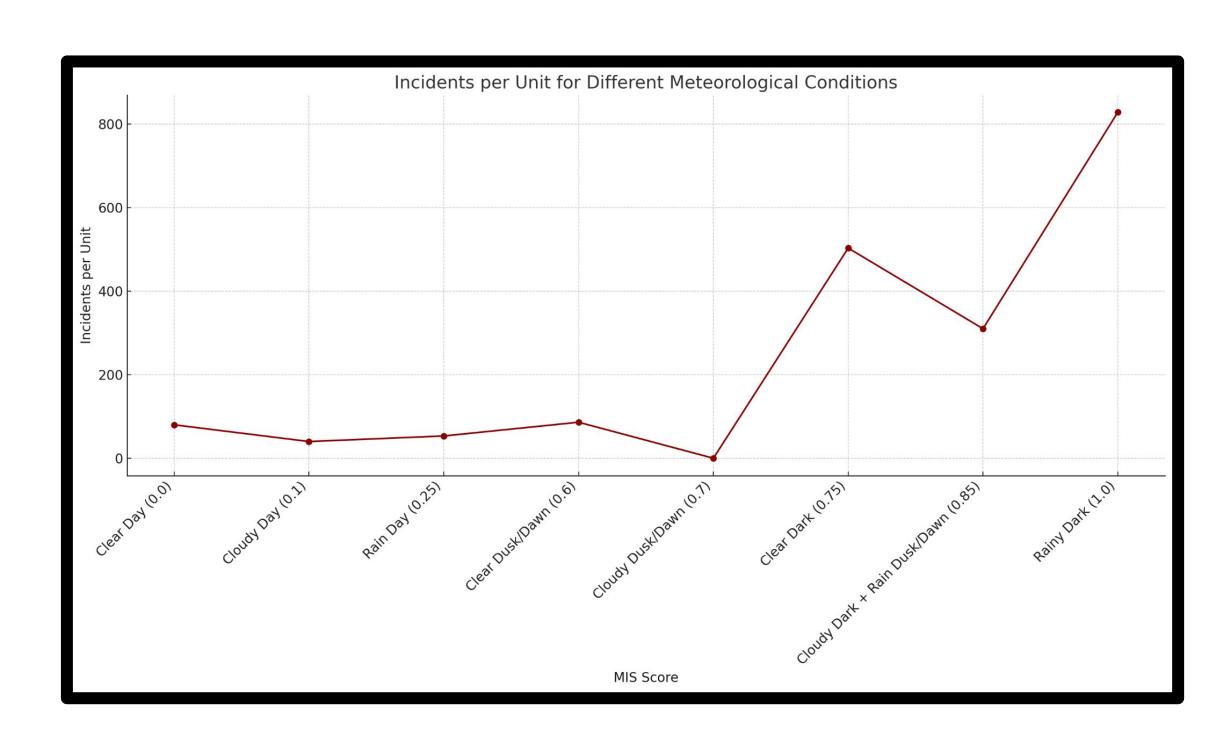
Visibility:

Dusk

Day

Dawn

Dark



Incident Rate of each Meteorological Condition in past 10 years normalized by frequency of each meteorological condition.

Meteorological Adjusted Risk Calculator (M.A.R.C) Model Results

Meteorologically Adjusted Crossing Exposure (CE_M)

$$CE_M = (AADT \times TDT) \cdot (1 - \frac{MIS}{50})$$

Average Max Speed (M)= 55 MPH

Cross Warning Type (W) = Gates

```
Percentage changes for MIS=0.1:

CE= 0 | Base Y=1.2523 | Y with MIS=1.3172 | Change=5.18%

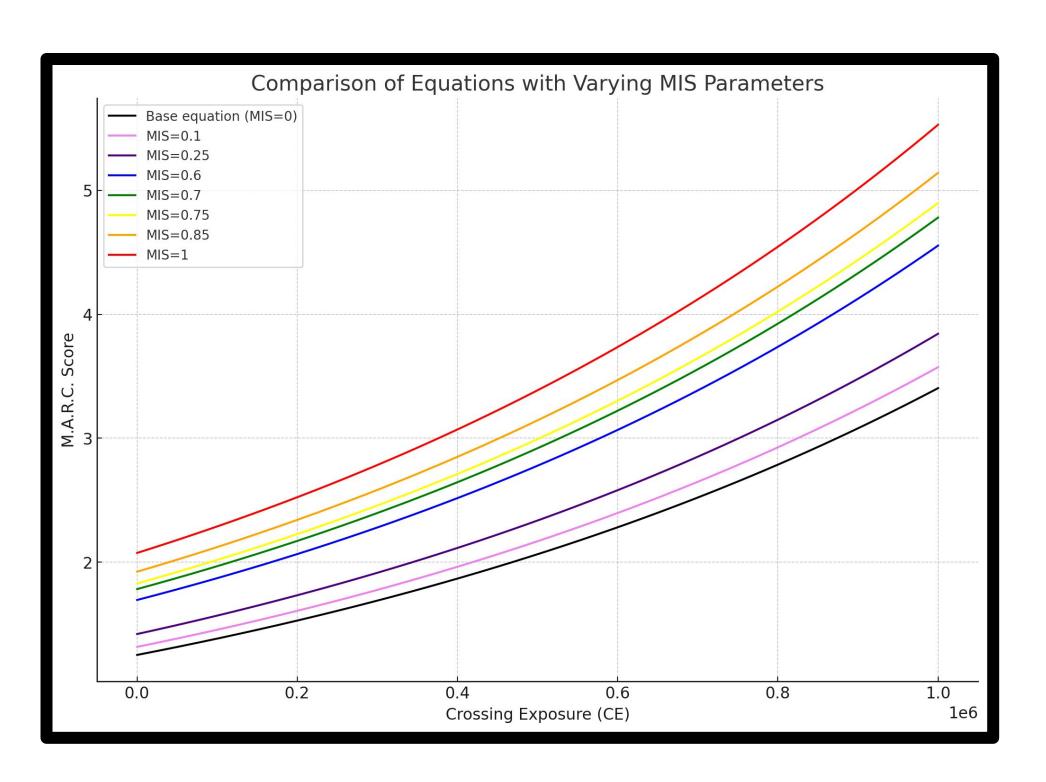
CE= 200000 | Base Y=1.5296 | Y with MIS=1.6082 | Change=5.14%

CE= 400000 | Base Y=1.8682 | Y with MIS=1.9634 | Change=5.10%

CE= 600000 | Base Y=2.2819 | Y with MIS=2.3972 | Change=5.05%

CE= 800000 | Base Y=2.7871 | Y with MIS=2.9268 | Change=5.01%

CE=1000000 | Base Y=3.4042 | Y with MIS=3.5733 | Change=4.97%
```



$$MARC = e^{((0.005(1+MIS\cdot(2))\cdot(M-5))+0.000001(CE_M)-0.05(W\cdot(1-\frac{MIS}{5})))}$$

Simulation Example:

Scenario One:						
Visibility (V _{rating}):	0.00					
Weather:	0.10					
MIS Score:	.10					
Max Speed:	90 M.P.H.					
ADT:	8000					
TDT:	67					
Crossing Exp:	536,000					
Warning Type:	GATE					
M.A.R.C. Score:	2.77					

Scenario Two:	
Visibility (V _{rating}):	0.75
Weather:	0.25
MIS Score:	1.0
Max Speed:	80 M.P.H.
ADT:	9000
TDT:	53
Crossing Exp:	477,000
Warning Type:	GATE
M.A.R.C. Score:	4.818

Scenario Three:	
Visibility (V _{rating}):	0.0
Weather:	0.0
MIS Score:	0.0
Max Speed:	65 M.P.H.
ADT:	17,000
TDT:	209
Crossing Exp:	3,553,000
Warning Type:	GATE
M.A.R.C. Score:	45.97

Results:

Under Normal Meteorological Conditions, the M.A.R.C score increases along with the growth of CE indicating that as the crossing exposure increase so does the risk of incidents at the crossing

Adjusting MIS Values: As MIS increases, worsening weather conditions, the M.A.R.C. score significantly increases for the same CE level. This suggest adverse weather conditions exacerbate safety concerns.

Lower MIS scores which are indicative of mild weather, shows only a moderate increase in M.A.R.C scores, suggesting that mild to moderate meteorological conditions have discernible but controlled impact on safety.

While, higher MIS scores which are reflective inclement weather shows a substantial increase in M.A.R.C Scores indicating that severe weather conditions greatly exacerbate safety risks at highway-rail grade crossing.

Improvements:

- Collect data related to the fluctuations in traffic volume throughout the day by hour to determine "high-risk" times for certain highway-rail grade crossings.
- Include additional meteorological impact variables such as sea fog
- Use machine learning to improve predictive accuracy using forecasted weather data
- Include pedestrian traffic volume and variables
- Better simulations (Mass Simulations) & better manipulation of data

Questions?





Resources

https://www.cleanpng.com/png-rail-transport-level-crossing -train-crossbuck-sign-890924/

https://www.deviantart.com/willm3luvtrains/gallery/66520 563/animated-gifs?page=4

https://www.pinterest.com/pin/trains-video--1351086761554

https://www.cleanpng.com/png-thunderstorm-lightning-cloud-clip-art-transparent-615865/preview.html