Assessment of the Impact of Namibian Rural Road Characteristics on Crash Incidence

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Road user perceptions and roadway design elements play a vital role in determining the crash risk level on the roads. The study investigated factors that play a prominent role in causing road traffic crashes on rural roads on the Namibian road network. The study found that animals and pedestrians were the highest cause of road traffic crashes on the study sections. The high volume of vehicles traversing the roads section combined with the lack of appropriate barriers to separate traffic from the high presence of animals and pedestrians along the study section contributed to the hazardous safety situation on the road. The study identified that drivers losing control of vehicles on the study sections was one of the highest cause of traffic crashes. Speeding combined with negative design of various road elements directly impacts driver perceptions of the road environment and misleads road users, thereby leading to human errors that influence the frequency and severity of road crashes on the study section. The study identified under-reporting and misinformation on road crashes as some of the factors impeding the development of a vivid picture on the actual scale of the road safety problem on Namibian rural roads. The analysis of the road crashes will assist and enable road safety stakeholders in identifying, developing and implementing appropriate safety measures to sustainably address the road safety issue on Namibian roads. In addition to the road safety assessment, a road design audit carried out on the study section found that the shoulder grade and lane widths did not comply with the Technical Recommendations for Highways 17 on the Geometric Design of Rural Roads in Namibia. The study therefore developed multivariate road crash models using Negative Binomial Regression to investigate the extent of the link between road crash rates of various severity and the road design elements. The models identified several interactive relationships between lane widths, shoulders widths, 85th operating speed and horizontal curve radii on the section that significantly influenced crash rates on the roads.

Keywords: *Driver Behaviour, Road Crash Modelling, Road Design Elements, Road Safety, Rural Roads.*

Introduction

The issue of providing a safe roadway environment within the rural road network is one of the fundamental principles governing engineering, traffic and transportation planning stakeholders. Gichaga (2017) describes road safety as the science of providing measures and methods that reduce the number of road crashes and injured road users involved in traffic crashes.

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Addressing road safety issues that relate to the three major traffic safety pillars; humans, vehicles and infrastructure, has been a crucial challenge for transportation engineers. An important aspect of road safety analysis is to locate hazardous road sections, to understand how the potential relationship between driver behaviour, driver perceptions and the road environment affects the safety of all road users.

Ambunda and Sinclair (2019) mention that road safety analysis can be useful in identifying road sections prone to high road crash rates and injury severities, while determining the factors significantly influencing the occurrence and frequency of road crashes. Information on factors significantly impacting road crash occurrence and frequency is vital for road safety stakeholders to identify appropriate remedial measures to combat and reduce the number of crashes and severity of injuries on the roadway. Road traffic safety is a multifaceted problem which encompasses numerous factors; human, vehicle and the road environment as shown in Figure 1.



Figure 1. Contributing Factors to Road Crashes

Source: Ambunda and Sinclair 2019.

Increased efforts in developing and enforcing traffic rules, educating road users on the importance of road safety and how perceptions are influenced by road design elements, coupled with improving the geometrical aspects of road infrastructure can positively influence traffic safety (Ambunda and Sinclair 2019).

The national rural road between Otjiwarongo and Okahandja (T0107) in Namibia, investigated in the paper was identified by Ambunda (2018) as one of ten national rural roads with the highest road crash rates, with an annual growth of 3.51% in road traffic volumes from 2011 (286,292 vehicles) to 2015 (374,710 vehicles). This paper examined the main causes of road crashes of various severity levels and carried out a road audit on T0107, through comprehensively analysing road crash data provided by the Namibian National Road Safety Council for the study period 2011 to 2015. Moreover, the paper investigated the relationship between the design elements on the study section and road crash rates through road crash predictive models.

Background

Road traffic crashes are a major socio-economic drawback for most developing countries (Ackaah and Salifu 2011). The World Health Organisation - WHO (2018) reports that every year, about 1.2 million road crash fatalities, and between 20 and 50 million road crash injuries of various severities are reported globally, with Duivenvoorden (2010) affirming road safety as one of the most significant issues in modern society. Dehuri (2013) cautions that road crashes are forecasted to be the third largest contributor to the global burden of injury and disease by the year 2020.

Despite the absolute number of road crashes and road fatality rates having steadied or declined in many high income countries in recent years, crash data suggests an increasing trend in the global epidemic of traffic injuries in most regions of the world (Peden et al. 2004). The WHO (2018) cautions that road crashes are forecasted to be the fifth leading contributor to mortalities globally by 2030, leading to an estimated 2.4 million road fatalities annually, mostly in developing countries, if current trends continue (Table 1).

Rank	Leading Cause (2004)	Leading Cause (2030)		
1	Ischaemic Heart Disease	Ischaemic Heart Disease		
2	Cerebrovascular Disease	Cerebrovascular Disease		
3	Lower Respiratory Infections	Chronic Obstructive Pulmonary		
		Disease		
4	Chronic Obstructive Pulmonary Disease	Lower Respiratory Infections		
5	Diarrhoeal Diseases	Road Traffic injuries		
6	HIV/ AIDS	Trachea, Bronchus, Lung Cancers		
7	Tuberculosis	Diabetes Mellitus		
8	Trachea, Bronchus, Lung Cancers	ers Hypertensive Heart Disease		
9	Road Traffic injuries	Stomach Cancer		
10	Premature and Low Birth Weight	HIV/ AIDS		

Table 1. Leading Causes of Death in 2004 and in 2030

Source: https://www.who.int/healthinfo/global_burden_disease/GBD_report_2004update_part2.pdf.

Yannis et al. (2016) emphasise the importance of regular road safety assessments, as they are key to most countries addressing road safety problems. To enable countries to compare their road safety situation with other countries and to measure global progress, road safety assessments require a standardized methodology (Peden et al. 2004).

The safety of a roadway is influenced by an interplay of several factors and a combination various road design elements, which impact the perceptions and behaviour of drivers using the roadway (Dehuri 2013). Turner et al. (2015) state that, the ability of the roadway to communicate vital road information is important for drivers to be able to adjust and adopt their driving to road conditions, without risking the safety of other road users. In assessing the safety of roadway

infrastructure, road crash modelling has been a useful instrument in identifying hazardous road sections, whilst investigating the extent of the influence of road design elements on road safety (Peter Hollo 2006).

With the increase in roadway traffic volume, traffic safety has become a serious concern in Namibia, with the Namibian National Road Safety Council - NRSC (2012) reporting that the Namibian road injury fatality rate is higher than the African continental average by more than four fatalities per 100,000 population. The annual road fatality rate of 31 per 100,000 population translates to 600 to 700 fatalities in road crashes every year in Namibia (Namibia Statistics Agency - NSA 2015).

In Namibia, as reported by the Namibian Statistics Agency (2015), the number of road traffic crashes (RTC) per 100,000 population increased from 685.6 crashes in 2011 to 807.2 crashes in 2015, this represented an annual average increase of 4% over the study period, as illustrated in Figure 2.

Figure 2. Road Traffic Crashes per 100,000 Population in Namibia between 2011 to 2015



A similar increasing trend was observed in the road fatalities per 100,000 population for the past five years up until 2015 as shown in Figure 3, with an increase from 24.94 in 2011 to 31.22 in 2015 reported by the Namibian Statistics Agency (2015).

Figure 4 shows an increasing trend in the rate of road users injured in road crashes, from 267.8 in 2011 to 284.3 injuries per 100,000 population in 2015, as reported by the Namibian Statistics Agency (2015).

In this paper, the historical road crash database for the section T0107 between Otjiwarongo and Okahandja was analysed and mapped using QGIS. Additionally, a road audit (cross-sectional audit) was also carried out to ensure the compliance of the study section with the road design standards used in Namibia. The crash data and road audit were used to understand the causes of road crashes on the study section.

Figure 3. Road Fatalities per 100,000 Population in Namibia between 2011 to 2015



Figure 4. Road Injuries per 100,000 Population in Namibia between 2011 to 2015



Data and Method

Data

Existing road crash data was collected from the Namibian National Road Safety Council (NRSC), considering data quality and availability from 2011 to 2015. To ensure that no inconsistencies arose across the data, it was vital to ensure that no remedial geometric work or upgrades were carried out on the study section during the analysis period 2011 to 2015. The Technical Recommendations for Highways 17 (TRH 17) on the Geometric Design of Rural Roads (Committee of State Road Authorities - CSRA 1988a, b) was used to assess compliancy of the road section with design recommendations. Table 2 provides the recommendations for the study road section as a national rural road by the TRH 17.

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Road Design Element	TRH 17 Recommendation	
Horizontal curve radii (Min. curve radii)	530m	
Speed Limit	120km/h	
Lane width	3.5m 2.0m	
Shoulder Width		
Number of lanes	2	
Shoulder grade	4%	
Lane grade	2-3%	

 Table 2. TRH 17 Recommendations for the Study Section

Source: CSRA 1988a, b.

The study section T0107 is a single carriageway surfaced with bitumen, with a posted speed limit of 120km/h. The study section has 13 horizontal curves. The locations of the 13 horizontal curves are shown in Figure 5.



Figure 5. Horizontal Curve Location on Study Section

Table 3 shows the horizontal curve radii for the 13 curves on the study section.

Horizontal curve	Curve radius (m)		
1	1,850		
2	1,710		
3	2,900		
4	3,500		
5	1,717		
6	770		
7	1,126		
8	1,920		
9	2,300		
10	3,000		
11	1,400		
12	780		
13	2,200		

Table 3. Horizontal Curve Radii on the Study Section

The road has a lane crossfall of 2.3% and a ground shoulder crossfall of 2.5%. A combination of channelizing, dividing and no overtaking road markings are used on the road section. Figure 6 shows the cross-section design of the study sections.

Additional design information for section T0107 as collected from the road section is provided in Table 4.

RL (km)	165
PSL (km/h)	120
85 th Percentile Traffic Speed (km/h)	120.30
AADT (Bi-Directional)	1,973
PT	В
Lanes	2
Lane Width (m)	3.3
GSF (m)	2.50
GSB (m)	2.55
SSF (m)	0
SSB (m)	0
No. of HC	13
AC	10

Table 4. Road Design Information for Section T0107

RL represents the length of the road section in km; PSL represents the Posted Speed Limit of the road section in km/h; PT represents the pavement type (B represents bitumen); GSF represents the width of the forward unsurfaced shoulder; GSB represents the width of the backward unsurfaced shoulder; SSF represents the width of the backward surfaced shoulder; HC represents the number of horizontal curves; AC represents the level of access control on the road section.

Figure 6 and Table 4 indicate that the study section was not fully compliant with the Technical Recommendations for Highways 17 (TRH 17) on the Geometric Design of Rural Roads (CSRA 1988a, b) with regard to shoulder crossfalls and lane widths. The study section complied with ground shoulder

widths, lane crossfall, horizontal curve radii and the posted speed limits recommendations by TRH 17, influenced by the AADT and road classification.



A total of 95 950 traffic crash cases were collected nationally, with 711 road traffic crash cases observed on the identified national rural road during the selected five-year study period. Traffic information on the Annual Average Daily Traffic (AADT) was collected from the Road's Authority of Namibia for the study period

Method

under consideration.

The two-lane two-way road between Otjiwarongo and Okahandja (T0107) with a road length of 165km was identified as one of the ten most hazardous national rural roads on the Namibian road network. Three road sections on T0107 were identified (heat map rating ≥ 3.85) for analysis using QGIS, with a bandwidth of 500m. Equation (1) was used to determine the crash rates for the identified study sections.

$$CR = \frac{RTC \times 10^{6}}{AADT \times 365 \times T \times L}$$
(1)

Where: CR = Crashes per million vehicle kilometres travelled
RTC = A collision event involving a mechanically propelled vehicle involving an element of causality.
AADT = Average Annual Daily Traffic
L = Length of study sections (km)
T = Duration of study period (years)
365 = Number of days/ year

Table 5 provides road crash information on T0107 sections from Otjiwarongo to Okahandja. The majority of the RTCs occurred on Section 1 from Otjiwarongo, which represented 51.2% (311) of the total crashes during the study period. Section 2 recorded the second highest RTCs with 32.6% (198) of the total road crashes. 16.1% (98) of the total RTCs were recorded on Section 3 in the proximity of Okahandja.

T0107 Sections	Road Length (km)	RTCs per section	Crash Rate
Section 1	55	311	2.30
Section 2	46	198	1.68
Section 3	22	98	2.39
Total	123	607	

 Table 5. Road Crash Information on the Study Section

Figure 7 shows a heat map of the crashes on the Namibian national rural road network over the study period 2011-2015, with the study section T0107 encircled in red. A minimum average threshold of 5km on the single carriageway from an urban setting is recommended as a starting point for road safety assessments on national rural roads (Joanne 2013).



Figure 7. Road Traffic Crashes in Namibia from 2011 to 2015

Individual mean differences were analysed using the Analysis of Variance (ANOVA) as shown in Table 6, to ascertain whether a statistically significant difference exists at 5% level (p<0.05) for the different crash rates determined. While the number of RTCs varied for the four road sections, the study sections crash rates determined were not found to be statistically different from each other (p=0.5 > 0.05).

ANOVA					
CR					
	Sum of Squares	df	Mean Square	F	P (Sig).
Between Groups	0.000	2	0.000	1.500	0.500
Within Groups	0.000	1	0.000		
Total	0.000	3			

Table 6. Analysis of Variance (ANOVA) of the Crash Rates on the Study Sections

Using Negative Binomial Regression (Generalized Linear Models), the study developed multivariate road crash prediction models to assess the extent of the link between road crash rates determined by the study and the road design elements investigated in the road audit. The crash model consisted of the following three components (Oppong 2012):

- 1. A **random component**, which specifies the conditional distribution of the response variable, Y_i given the exploratory variables, x_{ii}
- 2. A linear function of the regression variables, called the linear predictor,

$$n_i = \alpha + \beta_1 X_{i1} + \dots + \beta_k X_{i1} = x'_i \beta$$
(2)

The expected value μ_i of Y_i depends on the linear predictor in the linear function.

3. An invertible link function,

$$g(\mu_i) = \eta_i$$
(3)

4. The invertible link function transforms the expectation of the response to the linear predictor. The inverse of the link function is sometimes called the mean function:

$$g^{-1}(\eta_i) = \mu_i$$
(4)

Results and Discussion

Road safety is a complex multidisciplinary global problem. The study showed that Namibia is faced with high crash rates, and the lack of or inadequate implementation of the following systems exacerbates the road safety issue:

- I. The absence of appropriate road safety policies.
- II. The lack of an efficient and reliable collision information management system.

- III. The lack of coherent traffic safety management strategies.
- IV. The lack of consistent and aggressive road user education programmes.

Crash Data Assessment

A total of 607 of 711 road traffic crashes on T0107 were evaluated from the crash database provided by the NRSC during the study period 2011 to 2015. Figure 8 shows the classification and evaluation of the road crash causes on the study Section 1 to Section 3.

Figure 8. Road Traffic Crashes Causes on T0107 from 2011 to 2015



The study found that animals and pedestrians were the cause of the majority of RTCs on all the study sections, representing 49.8%, 57.1% and 37.8% of the crashes on Section 1, Section 2 and Section 3 respectively. In contrast, head on collisions were the least cause of traffic crashes on all the study sections, contributing less than 5% of all crashes on all Sections.

Drivers losing control of vehicles on the roads was the second highest contributor to RTCs on Sections 1 to Section 3, contributing 19%, 13.6% and 21.4% of all crashes on the study sections respectively. A study by Bamdad Mehrabani and Mirbaha (2018) found that drivers tend to be involved in single vehicle crashes as the road length increases.

RTCs reported as "Unknown" by the Namibian National Road Safety Council were the third highest contributor to crashes on all the study sections. Butchart and Mikton (2014) stress the importance of reliable and accurate data on RTCs in assessing the scope of the road crash problem, in order to target preventive measures, monitor and evaluate the effectiveness of the measures implemented. Lautrédou (2007) mentions that a huge gap remains in the coverage and quality of data countries collect and report on RTCs. This is particularly worrying that slightly less than 15% of all traffic crash causes on Section 1 and Section 2 and slightly more than 15% of crashes on Section 3 were reported as "Unknown".

Rear-end collisions constituted 3.5% of crashes on Section 1, 4.5% on Section 2 and 8.2% on Section 3. RTCs caused by foreign objects on the road surface constituted less than 10% of crashes on Section 1 to Section 3, with 5.5%, 3.5% and 5.1% of all crashes respectively. RTCs caused by conditions categorized as

"Other" constituted approximately 6.8% of crashes on Section 1. The study also found that 5.6% and 4.1% of the crashes on Section 2 and Section 3 respectively were caused by conditions reported as "Other".

Road Design Elements Assessment

The design of the study sections was assessed for compliancy with road design standards (TRH 17 on the Geometric Design of Rural Roads) used to develop Namibian national rural roads. It was therefore vital in addition to the assessment of the crash data, to establish the extent of the link between the road crash rates (independent variables) and the road design elements (covariates).

The study developed multivariate crash prediction models that analysed the impact of the road design elements on road crash rates of various severity on the study section using Negative Binomial Regression methods. The study found that the simultaneous combinations of several road design covariates in the models were statistically significantly impacting the road crash rates at 95% confidence level.

The study found that the combination of lane widths (LW) and shoulder widths (SW) had a statistically significant (p=0.000<0.05) impact on the crash rates, accounting for 84.1% of the variance in the crash rates, with the NBR model indicating a negative significant correlation of B= -13.2577 between lane widths and the crash rates on the study sections.

The interactive relationship between lane widths, 85^{th} percentile operating speed (OpSpeed) and shoulder widths, statistically significantly (p= 0.000< 0.05) accounted for 87.3% of the variance in the crash rates, with the lane width and 85^{th} percentile speed showing significant correlations of B= -3.254 and B= 0.341 respectively.

The combination of horizontal curve radii (HCRAD) and road length had a significant influence (p=0.0024 < 0.05) on crash rates, accounting for 75.4% of the variance in crash rates on the study section. Despite the interactive relationship between the covariates, the NBR model developed found that only the horizontal curve radii on the study section had a significant correlation of B= -1.2454 on crash rates on the study section.

Table 7 shows the results of the interactive relationships between covariates on crash rates (fatal, serious, slight and damage only) as identified by the NBR models developed.

Covariates	Model P value	Model Adjusted R ²	Significant model variable	Variable P value	Variable B value
LW & SW	0.0000	0.8411	LW	0.0002	-13.2577.
LW,		0.8732	LW	0.0012	-5.7231
OpSpeed & SW	0.0000		OpSpeed	0.0000	1.2431
HCRAD & road length	0.0023	0.7547	HCRAD	0.0020	-1.2454

Table 7. Multivariate Road Crash Model Information

Conclusions

Crash Data Assessment

The study examined and carried out a road traffic crash assessment on the road T0107 between Otjiwarongo and Okahandja on the Namibian rural road network.

The study identified three road sections on T0107 for investigation from Otjiwarongo towards Okahandja; Section 1 starts 5km from Otjiwarongo and spanning a distance of 55km (60km marker), Section 2 spans a distance of 46kms from the 60 km marker. Section 3 starts 5km from Okahandja and spans a distance of 22km.

The majority of the road traffic crashes were found to have occurred on Section 1 on T0107, which is much closer to the town of Otjiwarongo and had the longest distance (55km) investigated, whereas the least number of crashes occurred on Section 3 in the proximity of Okahandja, with the highest crash intensity on the heat map and the shortest distance (22km) investigated.

The study found that the majority of road traffic crashes on the study sections on T0107 were caused by the presence of animals and pedestrians on the roads. The Non-Motorised Users were the cause of approximately half of the crashes on Section 1 and slightly less than three fifths and two fifths on Section 2 and Section 3 respectively. The study sections have a precarious history of wild and domestic animals being stranded on the road and the chances of drivers hitting one of them are immense. The study identified, head on collisions were found to be the least cause of crashes on all road sections investigated.

The study found that approximately a sixth of the road traffic crashes on the study sections were reported as "unknown" due to under-reporting. Under-reporting hampers road safety stakeholders in providing a vivid picture of the magnitude of the road safety issue. Furthermore, the multiplicity of the different information that is recorded on road crashes hardens the task of making exact comparisons of road safety situations between multiple institutions and countries.

Road Design Elements Assessment

The Negative Binomial Regression models developed by the study investigated the extent of the relationship between road design elements on the study section and the crash rates (All severities and damage only).

The study found that the interaction between lane widths and shoulder widths had a statistically significant influence on road crash rates on the study section, with the lane width variable showing a significant negative correlation on road crash rates with every one unit increase in the variable reducing the log count of road crashes.

The interactive relationship between lane width, 85th percentile operating speeds and shoulder width was found to significantly influence crash rates, with significant correlation between the crash rates, lane widths and operating speeds

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on the study section. Also, the study found that road hard shoulder widths and types on the section did not significantly impact the crash rates.

The study findings demonstrated that the interaction between the horizontal curve radii and road length was significant in influencing crash rates on the study section, with one unit increase in the horizontal curve radii indicating a significant negative log count in the crash rates. An inverse relationship was found to exist between crash risk levels and the horizontal curve radii, with a radius considered critical at radii less than 350m.

The study has demonstrated that significant multivariate correlations exist between road design elements and crash rates on the study section. The study has also shown that further investigations into the causation factors that impact the influence crash risk level on undivided rural roads and the crash data collection methods used by the road safety authorities, especially with the high percentage of crashes recorded as "unknown". Moreover, the study has indicated that an investigation into the feasibility of Non-Motorised Users infrastructure and safety barriers on the study section is necessary for the safety of the section.

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