



Performance of Arch-Style Road Crossing Structures from Relative Movement Rates of Large Mammals

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In recent decades, an increasing number of highway construction and reconstruction projects have included mitigation measures aimed at reducing wildlife-vehicle collisions and maintaining habitat connectivity for wildlife. The most effective and robust measures include wildlife fences combined with wildlife underpasses and overpasses. The 39 wildlife crossing structures included along a 90 km stretch of US Highway 93 on the Flathead Indian Reservation in western Montana represent one of the most extensive of such projects. We measured movements of large mammal species at 15 elliptical arch-style wildlife underpasses and adjacent habitat between April and November 2015. We investigated if the movements of large mammals through the underpasses were similar to large mammal movements in the adjacent habitat. Across all structures, large mammals (all species combined) were more likely to move through the structures than pass at a random location in the surrounding habitat. At the species level, white-tailed deer (Odocoileus virginianus) and mule deer (O. hemionus) used the underpasses significantly more than could be expected based on their movement through the surrounding habitat. However, carnivorous species such as, black bear (Ursus americanus) and coyote (Canis latrans) moved through the underpasses in similar numbers compared to the surrounding habitat.

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INTRODUCTION

Over the past few decades, a range of negative effects of transportation infrastructure on wildlife populations have been well documented (e.g., Forman and Alexander, 1998; Spellerberg, 1998; Trombulak and Frissell, 2000; Coffin, 2007). Roads and traffic affect wildlife populations through direct mortality from vehicle collisions and indirect effects associated with habitat loss and degradation. Linear infrastructure can also be a barrier to wildlife movement as animals may avoid open habitat with an unnatural surface and the disturbance associated with roads (e.g., moving vehicles, noise, and light; D'Amico et al., 2016). Avoidance of roads decreases connectivity and can threaten population viability and genetic variability (Wang and Schreiber, 2001). At over 14 million lane-kilometers of paved roads in the United States alone (USDOT, 2017) and a forecast of an additional 25 million lane-km globally by 2050 (Dulac, 2013), road networks will continue as one of the largest, most direct impacts humans have on ecosystems.

Wildlife-vehicle collisions and the barrier effect of roads are typically mitigated through wildlife fences in combination with wildlife crossing structures (Glista et al., 2009; Grilo et al., 2010; Kociolek et al., 2015). In order to continue to justify these measures, researchers must prove that these measures are effective in both reducing wildlife-vehicle collisions and providing connectivity for wildlife, then formulate suggestions on how to improve their performance.

The size and cost of wildlife crossing structures makes experimental design and testing in controlled settings difficult. Consequently, we have a poor understanding of the relative importance of structural attributes (design) and locational attributes (placement) to crossing performance. Furthermore, most mitigation projects that involve wildlife fences and wildlife crossing structures primarily address an immediate problem (e.g., reducing wildlife vehicle collisions) and are not intended to contribute novel data (Rytwinski et al., 2015). Wildlife mitigation measures are usually considered late in the project planning process after limitations on design or placement have already been imposed (Cramer and Bissonette, 2007; Kroll, 2015). Even for large projects, the number of crossing structures that have similar dimensions is generally too low for a quantitative analysis of their performance.

Many studies have documented absolute use of crossing structures by recording the number of animals that cross through a structure. However, absolute use alone provides little information on a structure's performance, as local wildlife population density and the specific configuration of landscape elements influence wildlife use of individual structures. To date, there are only very few studies that have assessed the effectiveness of crossing structures based on a rigorous comparison to animal abundance in the surrounding habitat (Clevenger and Waltho, 2005; but see van der Ree et al., 2007; van der Grift et al., 2013).

In this study, we evaluated the effectiveness of wildlife crossing structures associated with the highway US 93 North through the Flathead Indian Reservation in western Montana, USA. We measured performance of structures by comparing large mammal movements through the structures to those in the immediate surroundings. We were interested in investigating the performance of underpasses for animals that were willing to come close to the highway as crossing structures cannot be expected to serve animals that avoid transportation corridors altogether. Therefore, we located control plots directly adjacent to the road, within the road effect zone (Forman, 2000).

We first investigated the corridor-wide performance from 15 wildlife passage structures of similar geometry and design by contrasting wildlife movement through the structure to those in the surrounding habitat. Our analysis focuses on four target species including white-tailed deer (*Odocoileus virginianus*), mule deer (*Odocoileus hemionus*), black bear (*Ursus americanus*), and coyote (*Canis latrans*), and composite groups (deer sp., carnivore sp., and large mammal sp.). Secondly, we compared the crossing performance of these species for each individual structure. Additionally, we investigated if mitigation measures were concentrating or funneling wildlife through the crossing structures. Finally, we used the observed performance to estimate the percentage of total road length that would require crossing

structures of the focal design in order to allow complete permeability for wildlife.

METHODS

Study Area

We collected data along US 93 in the Flathead Reservation between Evaro and Polson, Montana (**Figure 1**). The road runs north-south through the Flathead Valley, a heterogeneous landscape comprised of shrub, grassland, forests, wetland habitat, and agricultural lands. This section of highway received an annual average of 7,059 vehicles per day (MDT, 2014). The roadway design includes both undivided and divided, four-, three-, and two-lane highway accommodating a maximum speed limit of 70 mph (113 km/h), reducing to 25–45 mph (40–72 km/h) in towns.

Reconstruction of the 90.6 km section of highway began in 2004 to improve traffic flow and safety. The Confederated Salish Kootenai Tribes and the Federal Highway Administration agreed that the reconstructed highway must be respectful to the communities and people, but also to the land and wildlife that are considered both natural and cultural resources for the Tribes (Marshik et al., 2001; Kroll, 2015). Wildlife fences and crossing structures were an integral part of this "context-sensitive design" (Marshik et al., 2001).

The US 93 project is unique in the diversity of structure designs employed and in the number of replicates of select designs across a variety of habitat types. To date, the project includes 39 wildlife crossing structures of various designs from small concrete box culverts to a vegetated overpass and disjointed wildlife fencing (Huijser et al., 2016a).

Experimental Design

In this study, we address two primary questions: how does wildlife movement through crossing structures compare to wildlife movement in the immediate surrounding, and what is the effect of location, independent of structure design, on promoting wildlife passage. To investigate the first question, we used a control-impact study design (van der Grift et al., 2015). By selecting only congruent structures for the controlimpact assessment, we were able to hold the effect of structure design constant and investigate only the effect of the structures' locations.

Selection of Wildlife Crossing Structures

While other studies have investigated the performance of structural attributes across multiple design types (e.g., Yanes et al., 1995; Clevenger and Waltho, 2000; Ng et al., 2004), this study is unique in selecting 15 structures of nearly identical design. These structures are the most common design included in the US 93 reconstruction (18 of 39) and they are used by a wide array of medium and large mammal species (Huijser et al., 2016a).

All structures are elliptical, corrugated metal arch-style underpasses with soil substrate, primarily built for large mammal passage. The structures have an average width of 7.32 m (range = 6.86-7.95 m), height of 5.55 m (range = 3.65-5.55 m), and length of 26.5 m (range = 14.6-40.0 m; **Table 1**). All structures



114.052525°W. Retrieved: 20 November 2016. Available at: http://www.google.com/earth/index.html.

include concrete retaining walls that extend out from the structure at an \sim 35° angle to the road and extend to \sim 10 m. Wildlife exclusion fencing (height 2.4 m) is associated with some structures (**Table 1**).

Monitoring Scheme and Sampling Methodology

We installed motion-sensing trail cameras (HyperFire PC900 ReconyxTM; Holmen, WI) with infrared illumination to record

wildlife. Two cameras were installed at each structure—one at each entrance. Ten additional cameras were installed at randomly generated locations within a 300 by 300 m control plot adjacent to each side of an underpass and the highway (five cameras on each side; **Figure 2**). We chose a control plot size of 300 m because this is the most restricted daily active movement radius of the most common species (White-tailed deer; Dusek et al., 1989). We assumed that animals willing to approach the road at this distance were likely to interact with the structure at a TABLE 1 Structural and locational attributes of the elliptical, corrugated metal wildlife crossing structures monitored in the study including dimensions, presence of associated wildlife exclusion fencing, distance to nearest crossing alternatives*, percent difference in development and cover in surrounding habitat on either side of the road**, and year of construction.

Site name	Site code	Width (m)	Height (m)	Length (m)	Fencing	Distance to nearest crossing alternative (m)	$\Delta\%$ Cover	$\Delta\%$ Developed	Year constructed
North Evaro	NEV	7.75	5.10	25.8	Ν	1	8.9	6.7	2010
Finley Creek #1	FC1	7.95	5.55	32.0	Υ	1	61.1	22.0	2010
Finely Creek #2	FC2	7.95	5.55	21.9	Υ	102	0.3	0.3	2010
Finely Creek #3	FC3	7.75	5.10	24.7	Υ	298	6.8	6.8	2010
Ravalli Curves #1	RC1	6.86	4.78	22.0	Υ	935	6.4	57.4	2006
Ravalli Curves #2	RC2	6.86	4.78	25.6	Υ	1	36.3	7.3	2006
Copper Creek	COPC	7.75	5.10	18.3	Υ	181	43.5	2.2	2006
Ravalli Hills #1	RH1	7.30	5.20	39.0	Υ	434	0.0	26.9	2007
Ravalli Hills #2	RH2	7.30	5.20	31.2	Υ	434	0.0	36.6	2007
Pistol Creek #1	PIC1	7.30	5.20	40.0	Ν	1	0.0	41.3	2007
Pistol Creek #2	PIC2	7.30	5.20	40.0	Ν	1	0.0	20.8	2007
Sabine Creek	SABC	7.32	3.65	14.6	Y	45	60.9	60.9	2007
Post Creek #1	POC1	7.32	4.75	28.8	Υ	29	29.8	29.8	2007
Post Creek #2	POC2	7.32	4.75	22.0	Υ	40	21.3	21.3	2007
Post Creek #3	POC3	7.32	3.90	19.5	Y	37	39.1	39.1	2007

*The distance to the nearest crossing opportunity was measured as: the distance to the next suitable crossing structure if fencing was continuous, distance to fence end if discontinuous, or 1 m if no fence was associated with the structure.

**ArcGIS was used to calculate percent cover and habitat type from the National Land Cover Data for Montana (USGS, 2014). In calculating percent cover, land types: deciduous forest, evergreen forest, mixed forest, and woody wetlands were considered presence of cover and all others were considered absence of cover. Habitat type was assigned as a percentage distribution of natural and non-natural habitat. Land types: low intensity residential, high intensity residential, commercial/industrial/transportation, pasture/hay, and row crops were considered non-natural/developed and all others were considered natural/undeveloped.

daily timescale. To simplify terminology, hereinafter we refer to the crossing structure simply as "structure" and refer to the 300 by 300 m control areas on each side of the crossing structure as "surroundings." We use the term "site" to refer to both the surroundings and structure at a given crossing structure location.

We chose to use the same sampling method to record wildlife movements at both the structure and surroundings in order to control for species-specific detection rates that contribute bias to studies using multiple detection methods (Ford et al., 2009). All cameras were set to capture a rapid succession of 10 images per trigger event. In order to standardize the observation range, we placed a stake 10 m from the camera. Only individual animals that crossed within 10 m and associated conspecific animals in a group were considered for analysis. The infrared illumination from the trail cameras is effective up to 15 m. By restricting our observations to 10 m we reduced the possibility of false negatives. The entrances to the structures are generally slightly narrower than 10 m. To maintain consistent measurements, we moved cameras at structures out from the entrance along the angled retaining wall until a 10 m viewing distance parallel to the road was reached (usually 1–2 m from the entrance). Remote monitoring by camera traps was carried out in accordance with the approval of University of Montana Instructional Animal Care and Use Committee.

We were not able to reliably identify individual animals from camera images; therefore, we treated an observation of a unique movement as our sampling unit. A movement was defined as any animal recorded within 10 m of the camera separated by at least 5 min from the next observation. Allen (2011) found that, in the same study area, for groups of the three most common species (white-tailed deer, mule deer, and black bear), either all or none of the individuals in a group crossed through underpasses. Because underpasses are flanked by retaining walls, all animals that enter must cross within the 10 m observational distance of the camera. Therefore, in order to compare observations between the structures and surroundings, for obvious conspecific groups in the surroundings, all animals in the group were recorded as individual movements if at least one animal in the group crossed within 10 m viewing window.

The 12 cameras at a site (10 in surroundings, 2 at the structure) remained in place for \sim 2 weeks before we moved them to another site. The order in which sites were sampled was randomly assigned to reduce correlation between the effect of location and season. However, the order was also subject to our ability to obtain landowner permission to access the site. In cases where we could not immediately access a site, that site was skipped until permission could be obtained.

Analysis of Structure Performance

Total movements recorded in a 24 h period from cameras at a site were summed and divided by the number of cameras deployed at the structure or in the surroundings, respectively, to get observed and expected daily movement rates. Only cameras that operated for all sampling days at a site, and only full 24-h days were considered in analysis. Rates recorded in the surroundings and at the structure from the same 24 h period were compared to control for within-day temporal variability. Prior to statistical



FIGURE 2 | Camera placements in relation to a wildlife highway crossing structure (not to scale). Twelve HyperFire PC900 ReconyxTM trail cameras (dark blue squares indicate cameras, light blue cone indicates approximate 40° sampling window) were installed at each site for ~2 weeks at each site. Ten cameras were installed at randomly generated points at least 50 m apart within a 300 m by 300 m area adjacent to each side of the structure (red lines represent concrete retaining walls associated with all crossing structures). Two cameras were installed at each entrance to the structure. Cameras were installed ~3 m from the ground and a stake was placed to demarcate a 10 m viewing distance commensurate with the viewing distance of the cameras at the structure entrance.

analysis, we tested daily performance measures for temporal autocorrelation between days, finding none.

In order to assess a structure's effectiveness, we calculated performance differentials for each structure, broken down into species and species groups. We also calculated an overall effectiveness of all structures collectively for each species and species group. To calculate performance differentials, expected crossing rates from the surroundings were subtracted from observed crossing rates at the structure. We treated the movement rates in the surrounding habitat as an expected crossing frequency as this is the movement rate we would expect if no road barrier existed. Therefore, a positive differential indicated that animals moved through the structure more than expected, whereas negative differentials indicated that animals avoided the crossing structures.

While useful for determining effectiveness, differentials are less useful for biological interpretation as the difference of one individual may be more or less important given the size of the population or rarity of the species. Therefore, we also calculated a percentage difference between rates at the structure and in the surrounding by dividing the differential by the expected rate from the surroundings then multiplying by 100. If the ratio was the undefined value zero over zero, we defined this as a percent difference of zero, since this case represents the same crossing rate at the structure as expected from the surrounding. The percent difference centered at zero, and positive values indicated positive performance while negative values indicated structure avoidance.

We estimated average performance measures (differential and percentage difference) for each structure from the data and used nonparametric bootstrap resampling procedures over 100,000 iterations to construct bias corrected and accelerated (BCa) 95% confidence intervals at each structure using the *boot* package in R (Canty and Ripley, 2016). Values were calculated for the four most common species (white-tailed deer, mule deer, black bear, and coyote) and groups of animals. Groups included a deer group (*Odocoileus* sp.), a carnivore group (order *Carnivora*), and a large mammal group (all large mammals observed; **Table 2**). Observation rates decreased as the large mammal group was split into subsets and then into species. We excluded subset or species with fewer than two observations per structure over the sampling period.

We calculated an overall measure of performance across all structures to determine the total effectiveness for each species and group by taking the mean performance of each structure weighted by the number of observation days at each site, then used a weighted one-sample *t*-test to test if the overall differential was zero, along with Bonferroni corrections. In order to construct confidence intervals for these estimates, we employed a multistage, nonparametric bootstrapping procedure, first resampling daily performance within structures with 10,000 iterations, then resampling average performance between structures with 10,000 iterations to yield an overall BCa 95% CI for each species and group. Structures that were excluded from the previous analysis by structure were also excluded from the overall analysis.

In order to assess the impact of wildlife exclusion fencing on structure performance rates, we conducted a linear regression analysis on the relationship between fencing length and structure performance, weighted by the number of full 24-h days of observation recorded at the location. For this analysis, we defined the fence length associated with a structure as the road-wise distance to the nearest alternative crossing. Alternative crossing opportunities included the next suitable crossing structure if

Site name	Site code	Days (n)	Obs. Location	Large mammal	Deer	Carnivore	O. virginianus	O. hemionus	U. americanus	C. latrans	
			Movements recorded (n)								
North Evaro	NEV	14	Struct.	16	16	0	16	0	0	0	
			Surr.	39	38	0	38	0	0	0	
			Total	55	54	0	54	0	0	0	
Finley Creek #1	FC1	14	Struct.	179	177	2	177	0	2	0	
			Surr.	100	94	4	94	0	1	2	
			Total	279	271	6	271	0	3	2	
Finely Creek #2	FC2	20	Struct.	36	31	5	31	0	5	0	
			Surr.	274	249	21	249	0	17	3	
			Total	310	280	26	280	0	22	3	
Finely Creek #3	FC3	13	Struct.	23	21	2	21	0	2	0	
			Surr.	40	36	3	36	0	3	0	
			Total	63	57	5	57	0	5	0	
Ravalli Curves #1	RC1	20	Struct.	145	127	18	59	68	0	17	
			Surr.	171	161	10	41	120	1	9	
			Total	316	288	28	100	188	1	26	
Ravalli Curves #2 RC2	RC2	14	Struct.	217	216	13	0	214	0	0	
			Surr.	162	146	1	112	30	7	6	
			Total	379	362	14	112	244	7	6	
Copper Creek	COPC	12	Struct.	6	0	6	0	0	6	0	
			Surr.	28	18	10	13	5	6	2	
			Total	34	18	16	13	5	12	2	
Ravalli Hills #1	RH1	14	Struct.	44	41	3	0	41	3	0	
			Surr.	80	72	7	0	72	1	5	
			Total	124	113	10	0	113	4	5	
Ravalli Hills #2 RH	RH2	13	Struct.	3	3	0	0	3	0	0	
			Surr.	30	23	7	0	23	0	7	
			Total	33	26	7	0	26	0	7	
Pistol Creek #1 PIC1	PIC1	13	Struct.	4	2	1	2	0	0	1	
			Surr.	43	35	7	35	0	0	7	
			Total	47	37	8	37	0	0	8	
Pistol Creek #2	PIC2	12	Struct.	4	4	0	4	0	0	0	
			Surr.	35	24	11	24	0	0	11	
			Total	39	28	11	28	0	0	11	
Sabine Creek	SABC	13	Struct.	22	22	0	22	0	0	0	
			Surr.	259	252	7	252	0	3	4	
			Total	281	274	7	274	0	3	4	
Post Creek #1	POC1	12	Struct.	52	52	0	51	0	0	0	
			Surr.	196	195	1	195	0	0	1	
			Total	248	247	1	246	0	0	1	

TABLE 2 | Details on animal movements observed at underpass sites and number of full, 24-h days recorded at each site.

(Continued)

TABLE 2 | Continued

Site name	Site code	Days (n)	Obs. Location	Large mammal	Deer	Carnivore	O. virginianus	O. hemionus	U. americanus	C. latrans	
				Movements recorded (n)							
			Surr.	248	241	7	241	0	0	7	
			Total	306	299	7	299	0	0	7	
Post Creek #3	POC3	13	Struct.	106	99	0	99	0	0	0	
			Surr.	181	175	4	175	0	0	4	
			Total	287	274	4	274	0	0	4	

At each site, the location of the observations is indicated as those recorded at the structure (Struct.), those recorded in the surrounding control plots (Surr.), and total observations at the site.

fencing was continuous or the fence end if discontinuous. If no fence was associate with a structure, or if the fence extended only from one side of a structure, we assigned a value of 0 m as the distance to nearest alternative crossing (**Table 1**).

Although structures were specifically selected for their similarity, the total length of the structures varied with the road width (Table 1). We tested for a relationship between structure performance and structure length by conducting a linear regression analysis weighted by observation days similar to the above analysis of fencing distances.

Finally, we used the average percent difference in movement rates to estimate the requisite percentage of road length that must be permeable in order to allow similar movement rates through the road corridor as in the immediate surroundings (**Table 3**). This is the total road length that must include structures of the design considered here, in order to maintain connectivity for those animals willing to come close to the highway.

RESULTS

Wildlife Observations

Each structure and associated control plot was monitored for a median of 14 days (range = 12-20 days) between April and November 2015 (**Table 2**). A total of 2,798 unique large mammal movements were recorded. Twenty-five animal species were observed (**Table 4**). The cameras recorded mountain lions (*Puma concolor*) on two occasions, however they fell on non-24 h days, and thus, were not included in the analysis.

Of the total movements, 886 (30.3%) were recorded at structure entrances and 2,040 (69.7%) were recorded in control plots. The number of movements recorded varied among sites (mean = 193, max = 381, min = 34), as did the number of movements per day (mean = 1.22, SD = 0.84).

Structure Performance

Overall, structures exhibited significantly positive performance with all species and species groups moving through the crossing structures more often than expected based on movement rates in the surrounding habitat (**Figure 3**). Of the 15 total structures, 11 exhibited positive performance measures for large mammals, six of which were significant. Performance for large mammals was significantly negative at only 1 structure (SABC). On average, we observed 146% more large mammal movements per day

TABLE 3 Performance measures (average daily differential and percentage
difference) for each species and species group and estimated percentage of road
permeability required for 100% connectivity through the road corridor compared
to movement rates in immediately surrounding habitat.

Species	Sites (n)	Δ	Δ%	<i>p</i> -value (Bonferroni corrected)	Permeability (%)	Permeability (95% BCa Cl) (%)
Large mammals	15	1.38	146	< 0.001	40.67	28.81, 78.33
Carnivores	14	0.05	89	0.052	52.94	25.85, 100
Deer	15	1.32	150	0.000	40.04	25.69, 70.50
White-tailed deer	12	0.74	88	< 0.001	53.12	22.86, 61.46
Mule deer	5	1.86	472	0.001	17.49	7.65, 53.85
Black bear	7	0.05	112	0.351	47.22	35.24, 100
Coyote	13	0.03	75	0.702	57.07	17.54, 100

at the structures than would have been expected based on movements in the surrounding habitat (BCa 95% CI [27.7, 254.8]) corresponding to 1.38 more movements per day (BCa 95% CI [0.26, 2.40]) (**Table 3**).

As groups, performance across all structures was positive for both deer and carnivores with 149.8% (BCa 95% CI [41.8, 289.2], p < 0.001) and 88.9% (BCa 95% CI [-38.7, 227.3]) more movements than expected, respectively (**Table 3**). However, the relationship was not significant for the carnivore group after Bonferroni corrections (p = 0.052). For deer, performance was positive at 10 structures, and negative at five (**Figure 3**). Carnivores were present at 14 structures, of which 6, a minority, exhibited positive performance (**Figure 3**).

When considered for each species, performance was positive and of similar magnitude for white-tailed deer ($\Delta\% = 88.2$, BCa 95% CI [62.7, 337.4], p < 0.001], black bear ($\Delta\% =$ 111.8, BCa 95% CI [-49.0, 183.8], p = 0.35), and coyote ($\Delta\% = 75.2$, BCa 95% CI [-73.4, 470.2], p = 0.70]; however, the differential was not significantly different from zero for either carnivore species (**Table 3**). Performance for mule deer showed the most highly positive difference with 471.7% more movements through the structures than expected (BCa 95% CI [85.7, 1207.8], p = 0.001; **Table 3**].

Performance for all species was considerably variable across structures (Figure 3). Performance for coyotes was the most consistent with negative performance at 12 of 13 structures.

Species	Number of observations	Percent of wild animal observation (%)	Percent of large mammal observations (%)	Percent of deer observations (%)	Percent of Carnivore observations (%)
White-tailed deer	2047	70.0	73.2	77.8	
(Odocoileus virginianus)					
Mule deer	576	19.7	20.6	21.9	
(Odocoileus hemionus)					
Deer sp.	7	0.2	0.3	0.3	
(sp. undetermined)					
Moose	2	0.1	0.1		
(Alces alces)	_				
Elk	1	0.0	0.0		
(Cervus canadensis)		0.0	0.0		
Black bear	57	1.9	2.0		34.5
	01	1.5	2.0		04.0
(Ursus americanus)	4	0.0	0.0		0.6
Bear sp.	1	0.0	0.0		0.6
(sp. undetermined)					50.4
Coyote	86	2.9	3.1		52.1
(Canis latrans)					
Bobcat	6	0.2	0.2		3.6
(Lynx rufus)					
Raccoon	10	0.3	0.4		6.1
(Procyon lotor)					
Skunk	4	0.1	0.1		2.4
(Mephitis mephitis)					
American badger	1	0.0	0.0		0.6
(Taxidea taxus)					
Mountain cotton-tail rabbit	23	0.8			
(Sylvilagus nuttallii)					
Red squirrel	3	0.1			
(Tamiasciurus hudsonicus)					
Bat	2	0.1			
(sp. undetermined)					
Ring-necked pheasant	47	1.6			
(Phasianus colchicus)					
Turkey	13	0.4			
(Meleagris gallopavo)	10	011			
Grouse	1	0.0			
(sp. undetermined)		0.0			
Magpie	10	0.3			
(Pica hudsonia)	10	0.0			
Great Blue Heron	4	0.0			
	1	0.0			
(Ardea herodias)	4	0.0			
Western meadowlark	1	0.0			
(Sturnella neglecta)		c =			
Starling	15	0.5			
(Sturnus vulgaris)					
Red-tailed hawk	1	0.0			
(Buteo jamaicensis)					
Canada goose	2	0.1			
(Branta canadensis)					
Great-horned owl	1	0.0			

TABLE 4 | Total observations and group percentages of animal movements at both structure and control plots (combined total) in the study along US93 within the Flathead Indiana Reservation, Montana for April through November 2015.

Species	Number of observations	Percent of wild animal observation (%)	Percent of large mammal observations (%)	Percent of deer observations (%)	Percent of Carnivore observations (%)
(Strix nebulosa)					
Bird sp.	8	0.3			
(sp. undetermined)					
Data collector	63				
Human	54				
Cow	1783				
Dog	31				
Cat	31				
Total Obs.	4888	2926 (100%)	2798 (95.6%)	2630 (89.9%)	165 (5.6%)
(Percent of wild animal observations)					

TABLE 4 | Continued

Performance was generally positive for white-tailed deer (seven of 13 structures), black bear (five of seven structures), and mule deer (three of five structures). Performance for mule deer showed the greatest range with 3110% more crossing than expected at RC2 and 100% fewer crossings at COPC. Only one structure, RC1 showed consistently more crossings than expected for all species. Three structures, RH2, PIC1, and SABC showed consistently less crossings than expected. At most structures, performance was split by species.

The distance to the nearest crossing alternative, due to exclusion fencing, was the one variable that we would expect to affect all species similarly as it is a physical barrier intended to funnel animals to the crossing structures (Huijser et al., 2016b). However, a regression weighted by observations days to test the association between mean performance of large mammals and the distance to the nearest crossing alternative was insignificant ($\beta = 0.08, R^2 = 0.004, p = 0.17$; **Figure 4**). In fact, removing one site with high leverage (RC1) produces a significantly negative, although very weak, slope ($\beta = -0.35, R^2 = 0.05, p = 0.001$). Similarly, the association between structure length and mean performance of large mammals was insignificant ($\beta = 1.42, R^2 = 0.002, p = 0.50$; **Figure 5**).

Permeability of Road Corridor

We estimate that in order to allow full connectivity for large mammals, the road corridor must include crossing structures of the design considered in this study along 40.7% of the total road length (**Table 3**). To illustrate this point, consider an example wherein large mammals are observed in the surroundings at a rate of 2.460 per unit time vs. 1 per unit time at the structure. This is a percent difference of 146% (corresponding to the observed Δ % in performance for large mammals found in this study). Since both the rate at the structure and in the surroundings were calculated for the same observational distance (10 m), each unit of crossing width permits the same connectivity as 2.460 units of distance in the surrounding; or, inversely, every 0.407 unit of crossing structure width allows the same movement rate as 1 unit distance in the surrounding. Thus, if the goals is to allow enough connectivity to maintain the same movement rates through the

structure as in the immediate surroundings, 40.7% of the total road length must be permeable.

We estimate that including structures of this design along 28.2 to 78.6% of the total road corridor would allow full connectivity for all four of the focal species considered in this study (**Table 3**).

DISCUSSION

Wildlife crossings can provide conservation value in many ways and at many scales; however, determining the success of a given project depends on the intended purpose of the crossing structure(s) (Clevenger and Waltho, 2005). In the case of the US 93 highway upgrade project, mitigation efforts had two goals: minimize wildlife-vehicle collisions and maintain or improve habitat connectivity for wildlife by providing safe crossing opportunities (Marshik et al., 2001; Hardy et al., 2007; Huijser et al., 2016a). For this study, we defined success as performance differentials greater than or equal to zero, meaning that animals were at least as likely to move through a crossing structure as adjacent habitat and did not avoid traveling through the structures.

Overall, for large mammals as a community and all individual species, structures exhibited positive performance, or at least, did not exhibit significant evidence that performance was negative. This suggests that the structures were successful in one of their intended purposes: to maintain or improve habitat connectivity for wildlife by promoting movement across the road corridor through crossing structures. It should be noted that this project-wide analysis applies only to sampled road lengths that necessarily include underpasses. This is only a fraction of the total road length in the study area. In other words, the project may be successful in reducing fragmentation where crossing structures have been installed, but not necessarily over the entire road length. For example, if no animals cross the road at-grade, one would still need to make 40.7% of the road length permeable to eliminate the barrier effect for large mammals willing to come close to the road. In the context of the 90 km US 93 project, that would translate to an installation density of 3.7 10 m wide



structures per kilometer of road. Currently, the total width of all crossing structures on this section of US 93 is 573 m (Huijser, *unpublished data*), resulting in just 0.6% permeability. Granted, other structure designs included in the US 93 project may permit more or less large mammal connectivity. Performance data are needed for the other structure designs in order to calculate true percentage permeability permitted along the entire road corridor.

Many studies have shown the importance of crossing structure size/design on passage rates (e.g., Yanes et al., 1995; Clevenger and Waltho, 2000; Ascensão and Mira, 2007) while others have demonstrated that location is most important (Foster and Humphrey, 1995; Land and Lotz, 1996). To help illuminate

this question, we investigated the effects of location when such structural design parameters are fixed. Although performance was positive for all scales analyzed from community to individual species, the performance of individual structures for species passage was highly variable. This demonstrates that even congruent structures of the same design can yield very different performance, suggesting that location may be more important than design.

Very few wildlife-focused road projects include multiple structures of similar designs to adequately compare as replicates (van der Ree et al., 2007). Given the variability demonstrated by our structure type, this highlights the need for caution in extending conclusions about performance of structure or



FIGURE 4 | Linear regression on weighted average percent difference in performance against the distance an animal must travel away from the crossing structure at the site to access the nearest alternative crossing opportunity. There is no evidence ($\beta = 0.08$, $R^2 = 0.004$, p = 0.17) that the distance (in meters) an animal must travel to find an alternative crossing associates with performance. Gray band indicates 95% confidence interval and point size indicates number of days of observation at the site. The data point for site Ravalli Curve #1 (RC1) exhibited high leverage. When removed, the slope becomes significantly negative ($\beta = -0.35$, $R^2 = 0.05$, p = 0.001).

location attributes from studies of a single structure or groups of unreplicated structure designs.

A persistent concern in wildlife crossing design is the potential for underpass structures to act as prey traps causing prey species to avoid structures utilized by predators (Little et al., 2002). If prey species had learned to avoid structures with high predator concentration we would have expected to see opposite performance between prey and predators at individual structures. We did not see this trend; in fact, at half of all structures used by both carnivores and deer, the sign of the performance measure was the same for both groups. It is possible that prey species have coordinated underpass use to time periods when predators are absent, a pattern that would not be resolved at the daily timescale recorded in this study. However, Ford and Clevenger (2010) specifically tested for this type of behavioral assortment and found no such temporal correlation of use between predator followed by prey and the converse for either <8 or <48 h intervals. Interestingly, some of the highest performance values for both black bear and white-tailed deer were observed at FC1, granted black bears are not the most significant predator for adult deer. Multiple alternative crossing, including one vegetated overpass and three elliptical, arch-style wildlife underpasses, are located within just a few hundred meters of FC1. Despite ready alternative crossings, these species did not appear to selectively assort into different crossing preferences.



Similarly, FC1 was the only structure through which livestock regularly passed, whereas the four proximal alternative crossings exclude livestock but permit deer and bear. Although more data is needed, this suggests that at certain sites, the coincident use of a structure by livestock may not be a significant deterrent to some species of large mammals as is often assumed (Ruediger and Jacobson, 2013).

When performance for large mammals overall is considered in association with only fence length (represented as distance to nearest alternative crossing), there is no evidence of an effect. If wildlife fencing is truly funneling wildlife to the structures, we would have expected to find higher crossing numbers through the structures with increasing fence length. Huijser et al. (2016b) found that wildlife fencing along US93 shorter than about 5,000 m was less effective than longer fencing at reducing wildlife vehicle collisions. The maximum fenced length to the nearest crossing alternative in our study was under 1,000 m. It should be noted that, Huijser et al. (2016b) considered total fencing length, whereas our study only considered distance to the nearest alternative crossing point. It may be that animals were selecting alternative structure designs instead of the structures in this study, or that animals have become habituated to cross the road corridor less in sections where fencing is a barrier. It is also worth noting that Huijser et al. (2016b) included only isolated structures in their analysis whereas this study includes both isolated structures and those connected by fencing to other structures, many of different design than considered here. Until a similar performance analysis has been conducted on the other structure designs connected to the focal structures, it is impossible to determine the absolute effect of fencing length on performance. For instance, site RC1 in this study has the greatest distance to an alternative crossing (935 m), almost double that of any other site. RC1 also exhibited the highest leverage in the regression analysis, and when removed, led to an opposite result. Analyzing more structure with a range of fencing lengths, or experimentally manipulating fencing length may help to isolate the effect of fencing length for structure performance.

Generally, the results from this association study should be interpreted in context. No observational study can assign causation, and correlation may be confounded because structures are not placed at random in a road. Planners use wildlife vehicle collision, carcass counts, biological surveys, and biological inference to determine the best placement of structures (Huijser et al., 2008). Political and physical limitations further refine where a structure is ultimately placed. As such, the intentional placement of structures invariably correlates structures with locational attributes.

While the use of camera traps as a method of recording animal movements afforded an understanding of general trends within the focal large mammal populations, it did not allow for tracking of individual animal behavior. As such, we were not able to conclusively determine if a particular specie's behavior, such as, a proclivity to forage in a single location, influenced our estimates. Although, we believe that the 5 min threshold between observations of conspecifics mitigated most of this potential error.

The strength of this study comes from controlling for relative abundance, spatial and temporal variability, and variability of structure design. Furthermore, replication allowed for strong statistical inference. Using identical cameras to record both observed and expected crossing frequencies negated any detection variability. Sampling immediately adjacent to the road controlled for habitat variability between the crossing structure and surroundings. This pilot study suffered from limited sampling periods at each site as a trade-off in favor of rapid assessment of many structures. This disallowed strong conclusions about more cryptic taxa like black bear, bobcat, elk, moose, and mountain lion. Longer sampling periods with replicate sampling of the same structure in different seasons would strengthen a future study.

In the absence of large-scale, manipulative experiments to test structure design and locational attributes in controlled settings,

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the field of road ecology must utilize rigorous observational, control-impact design. More replicates of structure variables will translate to greater power to detect associations with performance. With every new wildlife-friendly road construction project, new potential data points enter the field. In order to ensure that these new data points can be utilized as replicates in statistical analysis of the effectiveness of structure design, we suggested that subsequent crossing structure assessments utilize sampling methodology similar to this study that controls for temporal and spatial variability and variability in detection rates.

AUTHOR CONTRIBUTIONS

AA designed, collected data, analyzed, and wrote up this study. MH designed and wrote-up this study. LB designed this study.

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