# A Study of Riders' Noise Exposure on Bay Area Rapid Transit Trains

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ABSTRACT Excessive noise exposure may present a hazard to hearing, cardiovascular, and psychosomatic health. Mass transit systems, such as the Bay Area Rapid Transit (BART) system, are potential sources of excessive noise. The purpose of this study was to characterize transit noise and riders' exposure to noise on the BART system using three dosimetry metrics. We made 268 dosimetry measurements on a convenience sample of 51 line segments. Dosimetry measures were modeled using linear and nonlinear multiple regression as functions of average velocity, tunnel enclosure, flooring, and wet weather conditions and presented visually on a map of the BART system. This study provides evidence of levels of hazardous levels of noise exposure in all three dosimetry metrics.  $L_{eq}$  and  $L_{max}$  measures indicate exposures well above ranges associated with increased cardiovascular and psychosomatic health risks in the published literature. Lpeak indicate acute exposures hazardous to adult hearing on about 1% of line segment rides and acute exposures hazardous to child hearing on about 2% of such rides. The noise to which passengers are exposed may be due to trainspecific conditions (velocity and flooring), but also to rail conditions (velocity and tunnels). These findings may point at possible remediation (revised speed limits on longer segments and those segments enclosed by tunnels). The findings also suggest that specific rail segments could be improved for noise.

**KEYWORDS** Trains, Noise exposure, Auditory health, Cardiovascular health, Hypertension, Psychosomatic stress

## **INTRODUCTION**

Bay Area Rapid Transit (BART) is a regional rapid transit rail system connecting portions of San Francisco, Alameda, San Mateo, and Contra Costa counties. During a typical weekday, passengers take about 360,000 rides on the system.<sup>1</sup> While customer satisfaction with the transit system is generally high, noise on BART trains is consistently reported as one of the greatest factors leading to dissatisfaction,<sup>2</sup> as borne out by complaints reported to local news media.<sup>3–5</sup> Indeed, we have personally witnessed child and adult passengers covering their ears while riding BART, wearing ear protection such as earplugs or earmuffs, and pairs of individuals leaning close together and shouting at high volume in order to carry on a conversation. Excessive noise levels associated with other above- and belowground

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Electronic supplementary material The online version of this article (doi:10.1007/s11524-010-9501-1) contains supplementary material, which is available to authorized users.

mass transit systems have been documented.<sup>6,7</sup> Most recently, studies of the New York City subway system indicate that noise levels are sufficiently high to be injurious to the hearing health of some portion of the ridership.<sup>8,9</sup>

Noise exposure is a concern on BART for several reasons. As a nuisance, noise inhibits conversation and can be an unpleasant sensory experience. More concerning, however, are the known and suspected physiological effects of noise on humans. Chronic exposure to high levels of noise is well established as contributing to hearing loss. <sup>10–12</sup> Mounting recent evidence suggests that chronic noise provokes the hypothalamic–pituitary–adrenal axis, activating negative endocrine and vascular outcomes, as seen in the association between chronic noise exposure and increased risk of hypertension, <sup>13–16</sup> increased risk of myocardial infarction, <sup>10,13</sup> and psychosomatic stress. <sup>10,17</sup> Findings have also shown that children living amid chronic noise have elevated levels of stress-induced hormones as well as elevated blood pressure. <sup>18,19</sup> There is also evidence of negative behavioral outcomes of noise exposure as well, <sup>10,20</sup> including negative behavioral effects of noise on children's cognition, concentration and memory, <sup>17,19–21</sup> and on school performance. <sup>22</sup>

The level of noise on trains results from many interacting factors,<sup>23</sup> including wheel roundness (i.e., deviation from perfectly circular) and wheel trueness (side-to-side wobble in shape), rail condition (e.g., "corrugation," banking, points, etc.), the speed of a train, whether a particular line segment is in open air or in a tunnel, and the points and curves of a specific line segment among other factors.

This study attempts to quantify BART passengers' potential exposures to hazardous levels of noise using a convenience sample of line segments central to the transit system. We also ask whether different measures of noise exposure are explained by average velocity, tunnel enclosure, flooring, and wet weather conditions.

### **METHODS**

During January, February, and March of 2009, line segments (i.e., the portions of a BART line in a specific direction between one station and the next) were sampled by convenience. The number of samples for the reported segments ranges from 1 to 10.

#### Measures

Noise dosimetry measurements were made using a Quest Q 300 logging noise dosimeter clipped to the belt, with its microphone clipped to the top of the left shoulder approximately 10 cm from the left ear. Measurements were made separately for each direction in any particular line segment; measurements began with the closing of train doors and ceased with their opening. The dosimeter's calibration was checked using a QC-10 Calibrator (114 dB at 1,000 Hz) a few minutes before the first measurement on each day that measurements were made, and the dosimeter was recalibrated 2 months before measurements commenced. The dosimeter was set to integrate sound levels over 1-minute intervals with a 3-dB exchange rate, an 80-dB threshold, an 85-dB criterion, and a 115-dB upper limit. We collected average ( $L_{\rm eq}$ ), maximum ( $L_{\rm max}$ ), and peak ( $L_{\rm peak}$ ) sound levels.  $L_{\rm eq}$  and  $L_{\rm max}$  were A-weighted (dBA) and  $L_{\rm peak}$  was unweighted (dB).

In addition, the presence of newer hard composite flooring (versus older carpeting), rainwater on the ground, and full or partial enclosure of a line segment by a tunnel were recorded and coded as indicator variables. Average velocity (km/h) was constructed using line segment lengths from BART GIS data and duration as measured by recorded start and stop times. For two records made when boarding at

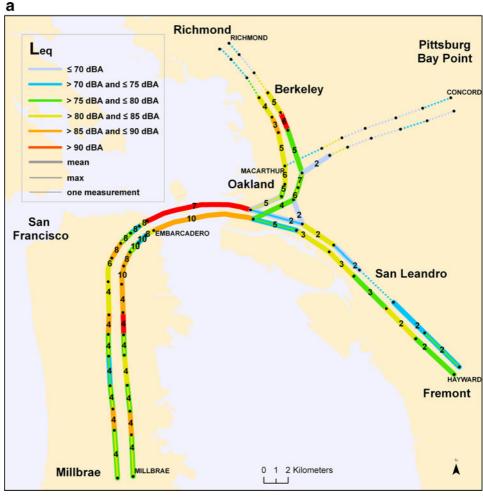
the Millbrae station, there was a wait of several minutes from the time the doors shut to the time the train commenced moving, and both records were excluded in the analyses of average velocity. In all but three cases, measurements were made from the bicycle/wheelchair seat, and in those other three cases were made from the bicycle/handicap/elderly seating.

## **Descriptive Statistics**

Unpresented histograms (see Electronic Supplementary Material [ESM]) characterized the overall distributions of our three dosimetry measures.  $L_{eq}$  was massed at about 82 dBA and was skewed somewhat below the mean, with low measures likely resulting from the threshold of 80 dB, which thus are likely to be slightly understating the true  $L_{\rm eq}$  level. Of the 268 noise dosimetry measurements of  $L_{\rm eq}$ , 60 (22%) were above 85 dBA. Measures of  $L_{\text{peak}}$  massed around 112 dB, but skewed several standard deviations above the mean. Six recorded  $L_{\text{peak}}$  levels exceeded 120 dB, the World Health Organization's (WHO) guideline threshold for hearing impairment in children,  $^{24}$  and three reported  $L_{\text{peak}}$  levels exceeded 140 dB, the threshold for hearing impairment in adults used by both the National Institute of Occupational Health and Safety and the WHO; 24,25; the maximum recorded  $L_{\text{peak}}$ level was above 147 dB (this level was slightly over the upper end of the dosimeter's listed range, but a sensitivity analysis limiting this value of 144 gave substantively the same results in Table 4, with difference in the restricted model estimate appearing at the  $5^{\rm th}$  significant figure).  $L_{\rm max}$  was massed just under 90 dBA, but is slightly skewed to the right. One hundred forty-one measurements of  $L_{\text{max}}$  were >90 dBA, four measurements of  $L_{\text{max}}$  were >100 dBA, and the maximum was >105 dBA. These are very high levels, well exceeding the levels cited in the US Environmental Protection Agency's<sup>26</sup> examination of maximum allowable exposures. We considered the effects of time of day as a proxy for passenger noise on all three noise measures using multiple nonparametric smoothing regressions (presented in ESM), but found no relationship in each case. Figures 1a, b, and c illustrate the average and maximum recorded values for all three metrics along each line segment for which there were two or more measures in order to visually characterize the noise exposure of particular rides (color maps annotated with measurements are available in ESM). These maps were generated using the numbers in Table 1, which associates average and maximum recorded for each dosimetry measure.

These data can be used to describe exposure to transit noise on BART cars under different plausible transit scenarios. We present three such commute scenarios corresponding to actual weekday round-trip commutes of two of the authors during the study period. The average time of these commute scenarios ranged from 58 to 73 minutes, and each scenario comprised 24 line segments round-trip. The minimum mean  $L_{\rm eq}$  exposure at different levels by mean time in transit for these three commute scenarios is detailed in Table 2. On average, riders experience a minimum exposure between 54 and 61 min/day at  $L_{\rm eq} \geq 70$  dBA and between 19 and 23 min/day at  $L_{\rm eq} \geq 85$  dBA due to noise while BART cars are in motion. Riders on the MacArthur to Daily City commute experience a minimum exposure of 7 min/day at  $L_{\rm eq} \geq 95$  dBA.

The number of line segments where mean  $L_{\rm max}$  exceeds specific levels for these three commutes is detailed in Table 3. Riders in the commute scenarios experience a minimum of between 20 and 22 exposures per day at mean  $L_{\rm max} \ge 85$  dBA, between 10 and 14 exposures per day at mean  $L_{\rm max} \ge 90$  dBA, and between 2 and 5 exposures per day at mean  $L_{\rm max} \ge 95$  dBA. Riders on the two commute scenarios



**FIGURE 1.** a Map of mean and maximum  $L_{\rm eq}$  (dBA). b Map of mean and maximum  $L_{\rm peak}$  (dB). c Map of mean and maximum  $L_{\rm max}$  (dBA). The number of observations is overlaid on each line segment, except those with a single measurement. The shape and position of line segments have been distorted to facilitate visual discrimination and should be interpreted as schematic.

including MacArthur station experienced at least one exposure per day to mean  $L_{\rm max}{\ge}100$  dBA.

#### **Data Analysis**

We explained our three noise dosimetry measures by velocity, tunnel enclosure, flooring type, and weather conditions using multiple regression frameworks. We began with a full model, removing predictors stepwise according to the highest p value. Preliminary multivariate nonparametric smoothing regression<sup>27,28</sup> of all three dosimetry measures (Eqs. 1a–1c) suggested that only the relationship between average velocity and  $L_{\rm eq}$  was nonlinear (Figure 2), with the linear main effect of velocity virtually saturating at about 53 km/h. Our preliminary nonparametric additive running-line smoothing regressions were fit using the running package 2.0.0 in Stata (these models used centered average velocity). Such nonlinearities are both substantively interesting and violate the assumption of linearity, which may bias

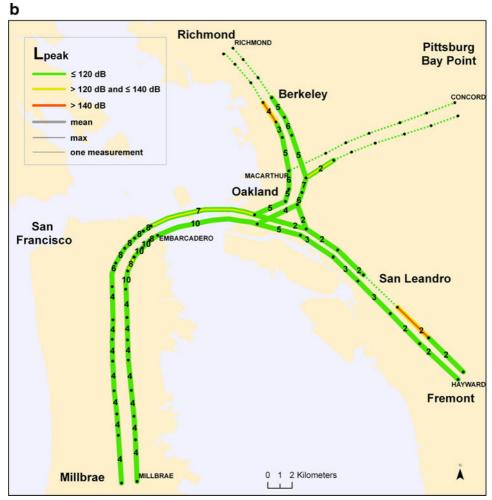


FIG. 1 continued.

linear regression estimates. Accordingly, we modeled the effect of average velocity on  $L_{\rm eq}$  using nonlinear least squares regression to model a break point in the linear relationship (Eqs. 2a and 2b).  $L_{\rm peak}$  and  $L_{\rm max}$  were modeled using multiple ordinary least squares regression. All regression analyses were conducted in Stata, <sup>29</sup> and average velocity was centered. Full regression models included all predictor variables, plus multiplicative interaction terms for centered average velocity and degree of tunnel enclosure. We estimated full models which included all predictors and interactions (Eqs. 3a and 4a) and restricted models which retained only predictors at the  $\alpha$ =0.05 level (Eqs. 3b and 4b).

$$L_{\rm eq} \sim f_{\nu}(\nu) + f_T(T) + f_{\nu T}(\nu T) + f_f(f) + f_{\omega}(\omega)$$
 (1a)

$$L_{peak} \sim g_{\nu}(\nu) + g_T(T) + g_{\nu T}(\nu T) + g_f(f) + g_{\omega}(\omega)$$
 (1b)

$$L_{max} \sim h_{\nu}(\nu) + h_{T}(T) + h_{\nu T}(\nu T) + h_{f}(f) + h_{\omega}(\omega)$$
 (1c)

C

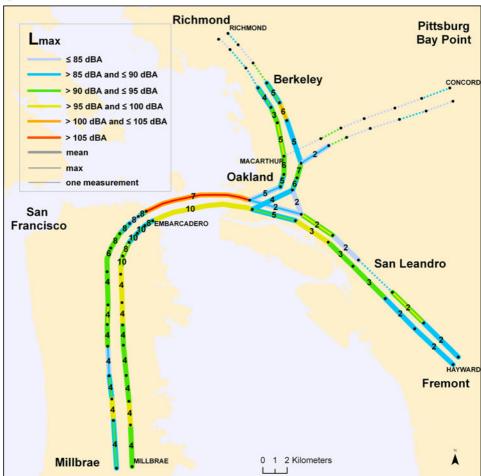


FIG. 1 continued.

$$L_{eq} = \alpha_0 + \alpha_{\nu} v^{c} + \alpha_{\nu_b} v_b + \alpha_T T + \alpha_{\nu^c T} v^{c} T + \alpha_{\nu_b T} v_b T + \alpha_{f} f + \alpha_{\omega} \omega + \varepsilon_{L_{eq}}^*$$
(2a)

$$L_{eq} = \alpha_0 + \alpha_v v^{c} + \alpha_{v_b} v_b + \alpha_T T + \alpha_f f + \varepsilon_{L_{eq}}^*$$
(2b)

$$L_{peak} = \beta_0 + \beta_v v^c + \beta_T T + \beta_{v^c T} v^c T + \beta_f f + \beta_\omega \omega + \varepsilon_{L_{book}}^*$$
(3a)

$$L_{\text{peak}} = \beta_0 + \varepsilon_{L_{\text{peak}}}^* \tag{3b}$$

$$L_{\text{max}} = \gamma_0 + \gamma_v v^c + \gamma_T T + \gamma_{v^c T} v^c T + \gamma_f f + \gamma_\omega \omega + \varepsilon_{L_{\text{max}}}^*$$
(4a)

$$L_{max} = \gamma_0 + \gamma_\nu v^c + \gamma_T T + \gamma_{\nu^c T} v^c T + \gamma_f f + \varepsilon_{L_{\max}}^*$$
(4b)

where  $v^c$  is centered average velocity (in km/h);  $v_b$  is the change in slope of average velocity at the break, modeled by max(average velocity— $\theta_v$ , 0);  $\theta_v$  is the

TABLE 1 Dosimetry measures for 51 BART line segments with two or more measures

Segment	N	Duration	$L_{\rm eq}$ (dBA)	$L_{\rm peak}$ (dB)	$L_{\text{max}}$ (dBA)
12th St-19th St	6	64 (3.4)	88 (4.1) 93	77 (8) 82	109 (4.2) 118
12th St-West Oakland	5	264 (51.3)	84 (2.9) 89	69 (7.4) 80	111 (0.7) 112
16th St–24th St	6	101 (2.1)	92 (0.7) 93	82 (1.2) 83	114 (0.7) 115
16th St-Civic Center	8	119 (7.8)	94 (1.5) 96	87 (1.7) 90	119 (10.6) 140
19th St-12th St	5	65 (8.3)	87 (3) 90	79 (3.3) 82	110 (1.7) 111
19th St-MacArthur	7	222 (104.1)	91 (2.1) 94	79 (2.7) 82	116 (0.9) 117
24th St-16th St	10	103 (7.5)	92 (1.7) 95	86 (2) 90	115 (2.6) 120
24th St-Glen Park	4	143 (4)	93 (0.7) 93	84 (0.6) 85	111 (0.7) 112
Ashby–MacArthur	5	167 (5.9)	95 (1.4) 97	82 (1.4) 84	113 (0.9) 114
Ashby–Berkeley	6	127 (8.3)	98 (1.9) 101	90 (1.9) 93	113 (1.7) 115
Balboa Park-Daly City	4	216 (54.8)	92 (1) 94	80 (2.5) 83	115 (1.3) 116
Balboa Park-Glen Park	4	117 (3.3)	97 (1.1) 98	91 (1.2) 92	115 (1.3) 116
Bay Fair-Hayward	2	218 (2.8)	87 (2.5) 89	77 (3) 79	113 (1.5) 114
Bay Fair-San Leandro	2	272 (81.3)	91 (9.6) 97	73 (3) 75	129 (25.9) 147
Civic Center–16th St	8	117 (2)	92 (1.9) 94	86 (1.6) 88	111 (1.7) 114
Civic Center–Powell	10	70 (3.9)	89 (3) 94	78 (2.8) 82	111 (1.5) 114
Coliseum–Fruitvale	2	173 (5.7)	84 (1.5) 85	68 (5.2) 72	110 (3) 112
Coliseum-San Leandro	3	221 (4)	90 (2.4) 93	79 (1.8) 80	111 (1.6) 113
Colma-Daly City	4	187 (16.1)	93 (1) 94	81 (1.7) 83	112 (1.2) 114
Colma-South San Francisco	4	156 (4.8)	89 (1.2) 90	78 (2) 80	111 (1.4) 113
Daly City-Balboa Park	4	183 (5.4)	91 (2.8) 93	80 (3.8) 83	114 (1.4) 115
Daly City-Colma	4	216 (5.4)	84 (1.6) 86	73 (3.7) 77	112 (1.1) 113
Berkeley–Ashby	3	118 (3.1)	94 (1.6) 95	86 (1.7) 87	112 (2.7) 115
Berkeley–North Berkeley	5	124 (0.7)	88 (2.3) 91	81 (2.3) 85	113 (1.7) 115
Embarcadero–Montgomery	8	59 (1.4)	89 (1.5) 91	82 (1.1) 84	114 (1.4) 116
Embarcadero-West Oakland	10	394 (9.5)	97 (1.8) 100	87 (1.1) 89	114 (1.3) 117
Fruitvale–Coliseum	3	172 (8.1)	92 (1.2) 93	82 (0.7) 83	114 (1.3) 114
Fruitvale–Lake Merritt	2	234 (2.1)	94 (3.7) 96	82 (1.7) 83	112 (1.2) 113
Glen Park-24th St	4	139 (3.5)	96 (0.7) 96	86 (0.8) 87	115 (1) 116
Glen Park–Balboa Park	4	120 (7.8)	95 (1.1) 96	87 (0.8) 88	113 (1.1) 114
Hayward-Bay Fair	2	219 (9.2)	85 (2.5) 87	74 (3.4) 76	112 (2.6) 114
Lake Merritt-12th St	2	154 (2.1)	81 (0.1) 81	62 (0.7) 63	111 (2.4) 113
Lake Merritt-Fruitvale	3	207 (3.8)	95 (1.4) 97	83 (0.8) 84	116 (3.7) 120
Lake Merritt-West Oakland	2	317 (39.6)	85 (0.7) 85	68 (5.7) 72	111 (0.6) 112
MacArthur-19th St	6	179 (28.3)	90 (1.6) 93	80 (1.9) 84	116 (1.2) 118
MacArthur–Ashby	5	180 (16.3)	87 (2.3) 89	75 (3.4) 79	109 (1.7) 111
MacArthur-Rockridge	2	116 (5.7)	83 (3) 85	66 (3.5) 69	117 (7.2) 122
Millbrae-San Bruno	4	490 (300.7)	91 (1.1) 92	79 (2.1) 81	113 (0.4) 113
Montgomery–Embarcadero	8	65 (7.4)	89 (2.2) 93	81 (3) 84	113 (1.4) 115
Montgomery–Powell	8	66 (3.9)	84 (2.3) 88	73 (4.5) 80	106 (1.4) 108
North Berkeley–Berkeley	4	134 (20.1)	90 (0.5) 90	82 (1.4) 84	120 (15.4) 143
Powell–Civic Center	8	75 (10)	87 (3.1) 93	78 (2.7) 83	109 (1.3) 112
Powell–Montgomery	10	73 (13.3)	86 (3.7) 94	73 (5.6) 78	107 (1.9) 111
San Bruno–Millbrae	4	351 (111.5)	88 (3) 92	76 (5) 81	111 (1.4) 113
San Bruno–South San Francisco	4	179 (8.3)	96 (1.3) 97	86 (1.2) 87	114 (1.2) 115
San Leandro–Bay Fair	2	193 (2.1)	89 (1) 90	81 (1.7) 82	116 (3.3) 118
South San Francisco–Colma	4	172 (16.3)	92 (0.9) 93	80 (1.8) 81	112 (0.7) 113
South San Francisco–San Bruno	4	179 (9.9)	95 (0.6) 96	87 (1.4) 88	112 (0.8) 113
West Oakland–12th Street	4	211 (24.7)	86 (2) 88	75 (2.5) 77	111 (0.9) 112
West Oakland–Embarcadero	7	380 (15.6)	101 (3.1) 105	92 (1.7) 94	118 (6.8) 133
West Oakland-Lake Merritt	5	315 (33.9)	89 (2.1) 91	74 (2) 76	112 (2.4) 115

Numbers given are mean (SD) maximum. N is the number of observations made on each line

TABLE 2	Minimum	mean	$L_{eq}$	exposure	times	for	three	round-trip	commute	scenarios
(h:mm:ss)										

	24th street and North Berkeley	24th street and Hayward	MacArthur and Daly City
Round-trip mean transit duration	0:57:57	1:13:06	1:02:25
Mean $L_{eq}$			
≥70 dBA	0:53:33	1:01:13	0:53:33
≥75 dBA	0:51:14	0:45:28	0:51:14
≥80 dBA	0:36:27	0:35:44	0:36:27
≥85 dBA	0:22:38	0:18:33	0:22:38
≥90 dBA	0:08:27	0:06:20	0:08:27
≥95 dBA	0:00:00	0:00:00	0:06:34

estimated breakpoint at which centered average velocity changes slope, T is the presence of a tunnel longer than three cars on the line segment (1 = tunnel present);  $v^cT$  is the multiplicative interaction between  $v^c$  and T; f is the presence of newer hard floor instead of older carpet (1 = with hard floor); w is the presence of rainwater on the ground during the ride (1 = water on ground); and  $\varepsilon_{L_{qq}}$ ,  $\varepsilon_{L_{peak}}$ ,  $\varepsilon_{L_{max}}$  are the model error terms, adjusted for clustering by line segment, assumed normal.

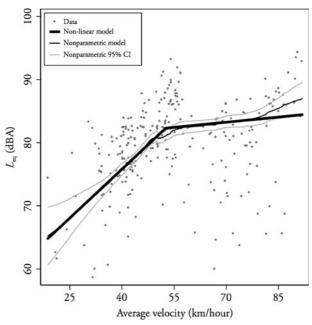
Despite the fact that our sample was by convenience, our study obtains very high statistical power (>0.95) with respect to Cohen's<sup>30</sup> post hoc analysis of power to detect a change in the sample correlation coefficient ( $R^2$ ) due to the inclusion of the independent variables. We also have very high power (>0.90) using Kelley and Maxwell's method<sup>31</sup> in our restricted models of both  $L_{\rm eq}$  and  $L_{\rm max}$ , but are underpowered for the unrestricted models and for  $L_{\rm peak}$  generally (see ESM).

#### **RESULTS**

Clustered regression results are presented in Table 4. We found that average velocity had different effects on our three dosimetry measures.  $L_{\rm eq}$  increased linearly with average velocity by 0.52 (95% CI = 0.36–0.67) dBA km<sup>-1</sup> h<sup>-1</sup>, with that effect

TABLE 3 Line segments with mean  $L_{\rm max}$  at different levels for three round-trip commute scenarios

	24th street and North Berkeley	24th street and Hayward	MacArthur and Daly City
Total number of segments round-trip	24	24	24
No. of segments with mean $L_{\text{max}}$			
≥70 dBA	24	22	24
≥75 dBA	24	22	24
≥80 dBA	24	22	24
≥85 dBA	22	20	21
≥90 dBA	12	10	14
≥95 dBA	4	2	5
≥100 dBA	1	0	1



**FIGURE 2.** Effect of average velocity on  $L_{\rm eq}$  modeled with a nonlinear breakpoint in the effect of average velocity at 52 km/h (*thick black line*) overlaid on top of a restricted nonparametric smoothing model of  $L_{\rm eq}$ — $L_{eq}$   $\sim f_v(v) + f_T(T) + f_J(f)$ —(*thick black line*) with 95% point-wise confidence intervals (*thin gray lines*) and the raw data.

almost completely saturating to 0.05 dBA km<sup>-1</sup> h<sup>-1</sup> (95% CI = -0.34–0.45) above approximately 53 km/h as illustrated in Figure 2.  $L_{\rm peak}$  was not found to be significantly related to average velocity.  $L_{\rm max}$  was found to decrease linearly by -0.11 dBA (95% CI = -0.32–0.09) in cars running on line segments without tunnels, but to increase linearly by 0.19 dBA (95% CI = 0.15–0.24, calculated as described in Figueiras et al.,  $^{32}$ , p. 2100) in cars running on segments with tunnels.

 $L_{\rm eq}$  increased by 5.1 dBA (95% CI=3.7–6.4) on line segments enclosed by tunnels.  $L_{\rm max}$  increased by 2.5 dBA (95% CI=-1.7–6.7), with the above described significant interaction with average velocity.

Presence of the newer composite flooring was associated with an increase of 1.8 dBA (95% CI=0.58–3.1) in  $L_{\rm eq}$  and was associated with an increase of 1.5 dBA (95% CI=0.69–2.3) in  $L_{\rm max}$ . Flooring was not associated with  $L_{\rm peak}$ .

The presence of water on the ground was not associated with any of our three noise dosimetry measures.

#### **DISCUSSION**

This small study provides evidence of potential noise exposures that may be deleterious to the health of BART passengers. The  $L_{\rm eq}$  and  $L_{\rm peak}$  levels reported here are comparable, although somewhat louder, to in-car noise levels recently reported in the New York Metro subway system. <sup>8,9</sup> The reported  $L_{\rm eq}$  exposure durations  $\geq$ 85 dBA in the three commute scenarios translate to 40–48% of the maximum daily noise exposure levels set by the EPA to broadly protect population hearing. <sup>24,26</sup> This implies compounded noise-related risks for those riders who reside or work in very noisy environments. Our  $L_{\rm eq}$  and  $L_{\rm max}$  measures indicate

TABLE 4 Parameter estimates for full and restricted and nonlinear least squares models ( $L_{eq}$ ) and ordinary least squares models ( $L_{peak}$  and  $L_{max}$ )

	Full model		Restricted model		
	Parameter estimate (SD)	p value <sup>a</sup>	Parameter estimate (SD)	p value <sup>a</sup>	
y: L <sub>eq</sub> (dBA)					
$lpha_0$	82.9 (1.05)	< 0.001	83.0 (1.04)	< 0.001	
$lpha_{v^c}$	0.489 (0.070)	< 0.001	0.516 (0.077)	< 0.001	
$\alpha_{v_{\rm b}}$ (break at 53 km/h)	-0.430 (0.124)	0.001	-0.462 (0.122)	< 0.001	
$\alpha_T$	6.78 (2.00)	0.001	5.06 (0.680)	< 0.001	
$lpha_{v^cT}$	0.260 (0.145)	0.094			
$lpha_{v_hT}$	-0.278 (0.193)	0.169			
$\alpha_f$	1.98 (0.658)	0.004	1.81 (0.856)	0.003	
$lpha_\omega$	-0.706 (1.06)	0.503			
RMSE	5.030		5.095		
$R^2$	0.479		0.457		
y: L <sub>peak</sub> (dB)					
$\beta_0$	118 (5.98)	< 0.001	113 (0.507)	< 0.001	
$eta_{v^c}$	-0.352 (0.297)	0.351			
$\beta_T$	-5.92 (5.96)	0.387			
$\beta_{v^cT}$	0.425 (0.298)	0.305			
$eta_f$	1.07 (0.517)	0.118			
$eta_{\omega}$	-0.121 (0.889)	0.889			
RMSE	4.632		4.766		
$R^2$	0.073		0.000		
y: L <sub>max</sub> (dBA)					
$\gamma_0$	88.2 (2.07)	< 0.001	88.2 (2.07)	< 0.001	
$\gamma_{v^c}$	-0.115 (0.102)	0.310	-0.114 (0.107)	0.258	
$\gamma_T$	2.51 (2.12)	0.310	2.50 (2.11)	0.258	
$\gamma_{v^c}$ $_T$	0.309 (0.104)	0.006	0.309 (0.104)	0.005	
$\gamma_f$	1.56 (0.104)	< 0.001	1.52 (0.412)	0.001	
$\gamma_\omega$	-0.375 (0.858)	0.660			
RMSE	3.505		3.499		
$R^2$	0.4708		0.462		

All models accounted for clustering in line segments, thereby estimating robust standard errors. N=266 for all models. Both the full and restricted nonlinear least squares models of  $L_{eq}$  converged in 11 iterations

exposure to very loud noise for periods somewhat comparable to the daily ranges associated with increased cardiovascular and psychosomatic health risks.  $^{10,12,15,17,18,20,33-37}$  However, we warn that these studies generally treated periodic exposures throughout the day, such as those due to proximity to rail systems or traffic. Most BART trips are likely to extend beyond one line segment; for round-trip commuters, such exposure will double in the course of a day. This implies chronic exposure to persistent levels of noise during the workday and may present a threat of hypertension and other health problems associated with chronically heightened psychosomatic stress.  $L_{\rm peak}$  levels indicate acute exposures potentially damaging to adult hearing on about 1% of rides from one station to the very next station and acute exposures potentially damaging to children's hearing on about 2%

 $<sup>^{</sup>a}$ All p values were corrected for multiple comparisons using the false discovery rate<sup>41</sup>, using p.adjust() in R version 2.9

of such rides.<sup>24</sup> Hearing may also be threatened by BART noise indirectly as many people employ headphones while riding BART (e.g., for digital musical players), and BART noise may drive riders to raise headphone volume to damaging levels.

While recognizing that passenger exposures to loud noises on BART are unlikely to exceed an hour or two per day and thus likely to present only a small health risk to individuals, we also consider this from a population perspective; small increases in individual risk for health problems caused by chronic exposure, when multiplied across large populations—such as the hundreds of thousands of riders each weekday—may amount to large public health concerns. Moreover, from a vulnerabilities perspective, populations already under stress suffer greater extremes and greater uncertainty in health outcomes as a result of stresses; because BART serves the elderly, school-age children, and socioeconomically marginalized communities, we find vulnerability to noise especially concerning and a needed avenue for further research.

We have provided evidence that the noise to which passengers are exposed may be due not only to car-specific conditions (velocity and flooring) but also to rail conditions (speed limit and tunnels). These findings may point at possible remediation (revised speed limits on longer segments and those enclosed by tunnels). The findings also suggest the possibility that specific line segments could be physically improved for noise. Factors not considered here—such as wheel and brake conditions or rail conditions—may also contribute to noise levels.

This study has several limitations. First, the small sample size does not permit an estimation of the distribution of dosimetry responses for each line segment. A thorough sampling of every line segment in the BART system would also give a better picture of passenger exposure. Likewise, we did not account for clustering of variance by car that a larger study would (for example, using cross-classified multilevel models). Better dosimeters could provide more finely spaced measurements permitting a more nuanced visual characterization of gradients of noise dosimetry along single line segments and assessment of the relationships between more instantaneous measures of velocity and dosimetry measures. Such finely spaced measurements could also permit total counts of  $L_{\text{peak}}$  and  $L_{\text{max}}$  events as recommended by WHO,<sup>24</sup> rather than the "at least one event per line segment" given by these measures in this study. Our use of average (rather than instantaneous) velocity biases regression results toward finding smaller effects since if the effects of instantaneous velocity on noise are positive, "average velocity" will be slightly lower than instantaneous velocity when dosimetry measures are high and conversely will be higher than instantaneous velocity when dosimetry measures are low.

We conclude by noting that BART's operation appears to produce several kinds of noise-related health hazard. While news reports indicate that BART took steps to improve rail condition in 2009, 3-5 it remains to be seen if and how passenger noise exposure will be affected. BART, being a public institution, should serve its passengers at a minimum by communicating the health hazard imposed by the noisy conditions under which it operates, perhaps even suggesting ways for passengers to protect themselves from hazardous noise to, most fully, by making trains quieter. BART could also establish ongoing noise dosimetry measures for the protection of riders' health. Such a surveillance system could also provide better understanding of velocity/noise measures since instantaneous train speed is available to BART operators.

#### **ACKNOWLEDGMENTS**

We thank Craig Ishida and the Environmental Health & Safety Department of California State University East Bay for the loan of the dosimeters used in this study. We thank Professor Tom Dolan of Portland State University's Department of Speech and Hearing Sciences manuscript feedback before submission. This study was unfunded.

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