

Challenges in Engineering Estimates for Best-Value Design-Build Highway Projects

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Abstract

Traditional design-bid-build guidelines suggest that engineering estimates should be within +/- 10% of the lowest contractor bid and recommend this value as a reference to identify anomalies in the bidding process. This guidance, however, neglects delivery approaches such as design-build. This research examines 305 design-build highway projects procured using best-value and identifies the underlying reasons for bid dispersion and cost estimates inaccuracies. This study found an average bid dispersion of 27%, suggesting that a larger threshold (i.e., 25%) is needed to account for the inherent variability of design-build projects. This study also found that engineering estimates are on average 2% more than the awarded price. This result contradicts findings in existing literature and suggests that current practice in design-build best-value may be more conservative than other procurement methods. The study explores four potential reasons for bid dispersion and engineering estimate inaccuracies and suggests strategies for improvement. By

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18 providing a better understanding of bid dispersion and engineering estimate accuracy, this study
19 will ultimately assist in the development of new policies and processes for best-value design-build
20 projects.

21 INTRODUCTION

22 Design-build (D-B) is an alternative project delivery method that has been growing in recent years
23 (Sullivan et al., 2017; FMI, 2018; Liang et al., 2020). One of the advantages of D-B, probably
24 influencing its increased use, derives from the overlap of design and construction phases which
25 result in reduced project durations. Within D-B, best-value procurement has also seen increased
26 usage in the last years and has now become a common scenario (Molenaar et al. 2010). Compared
27 to traditional approaches solely based on cost (i.e., low bid), best-value procurement considers
28 price as well as other key factors to enhance the value of construction (Molenaar and Tran, 2015).

29 While several procurement methods (e.g., low bid, best-value, qualifications-based
30 selection, etc.) can theoretically be combined with different project delivery systems (e.g., design-
31 bid-build, design-build, etc.), highway agencies use low bid almost exclusively in design-bid-
32 build. Design-bid-build is the traditional method in highway construction. Agency policy and
33 legislation generally requires a low-bid approach in the traditional delivery method. Best-value
34 procurement is preferred in design-build projects because it provides a balance between a low-bid
35 procurement and qualification-based selection (Nguyen et al., 2018; Calahorra-Jimenez et al.,
36 2020; Calahorra-Jimenez et al., 2021). In fact, many agencies require best-value selection for
37 design-build projects because the price component corresponds to traditional low-bid selection of
38 the builder and the qualification-based component corresponds to the traditional selection of the
39 designer.

40 Design-build is typically chosen to accelerate project completion and has been proven to
41 provide cost savings without compromising quality (FHWA, 2018). Compared to traditional
42 project delivery methods (e.g., design-bid-build, D-B-B), D-B presents several advantages such as
43 increased cost efficiencies, more opportunities for value-engineering, flexibility in risk allocation,

44 reduced litigation throughout the project, and enhanced schedule performance (FHWA, 2006; Hale
45 et al., 2009; Shrestha et al., 2012). Previous studies have compared the performance of D-B and
46 other delivery systems (i.e., D-B, construction manager at risk (CMR), etc.) (Sullivan et al. 2017),
47 with some studies focusing on specific project types including buildings (Shrestha and Fernane
48 2017), industrial projects (Franz et al., 2020), mechanical projects (Riley et al. 2005), and highway
49 projects (El Asmar et al. 2020; Tran et al. 2018). According to the International Transport Forum,
50 Organization for Economic Cooperation and Development (OECD) countries invest, on average,
51 approximately 1% of their Gross Domestic Products on transportation infrastructure (OECD/ITF,
52 2013). Given the importance of transportation projects in the global economy, the scope of this
53 study is focused on highway projects.

54 The overlap of design and construction phases in D-B projects results in an additional
55 advantage: cost certainty (i.e., when an agency obtains a contracted price for the project) in D-B
56 projects is 40% earlier than that of D-B-B (FHWA, 2017). However, agencies using D-B face
57 challenges in the estimation of project costs because the scope and requirements of the project are
58 not completely defined at the time of procurement (Molenaar and Gransberg, 2001).

59 Early cost estimates in D-B projects are particularly difficult because of the low level of
60 design and complex risk allocation at the time of procurement (Molenaar et al. 2006). Before the
61 procurement process starts, agencies develop in-house engineering estimates to understand the
62 project needs and requirements and estimate the total project cost. Engineering estimates help
63 stakeholders in the decision-making process related to project funding, resource allocation, and
64 planning. Accurate engineering estimates, with cost estimates as close as possible to the cost of
65 the award-winning proposal, are important for all the stakeholders involved in the project.
66 Inaccurate estimates can cause inefficient utilization of taxpayers' money and waste of planning

67 efforts (Oberlender and Trost, 2001). Previous studies have found that project planners may often
68 consider optimistic assumptions and unintentionally underestimate project costs in an intent to
69 secure public funds and avoid them being committed to other projects (Karaca et al. 2020;
70 Flyvbjerg et al. 2002; Jennings, 2012).

71 An additional challenge for accurate engineering estimates is related to the dispersion in
72 design-builders price proposals (i.e., the range from lowest to highest price proposal). On
73 traditional D-B-B projects, non-regulatory guidance from the FHWA (2014) states that the
74 engineer's estimate should be within +/- 10% of the winning low bid. According to FHWA's
75 guidance, if this threshold for accuracy is not being achieved, confidence in the engineer's estimate
76 may decline. State Departments of Transportation (DOTs) have traditionally used this threshold to
77 identify anomalies in the bidding process (FHWA 2019, Anderson and Blashcke 2004). Despite
78 the fact that this FHWA non-regulatory guidance is widely accepted by DOTs, the agencies differ
79 on their interpretation. This results in miscalculations and differences in the threshold value used
80 (FHWA 2019 and Anderson and Blashcke 2004). Several states use a single percentage, such as
81 5%, 7%, or 10% over the engineer's estimate, whereas other states use ranges expressed by both
82 under and over the engineer's estimate, such as 20% below and 10% above or 15% under or 10%
83 over (Anderson and Blashcke 2004). Given the lack of consensus on the threshold used to define
84 adequate accuracy levels in engineer's estimate, there is a need to empirically define a reasonable
85 value of engineer's estimate accuracy.

86 An additional limitation of the traditional 10% threshold is that this criterion has not been
87 rigorously evaluated since it was introduced in the early 1980s (FHWA 2019). As a result,
88 FHWA's guidance has not kept pace with more recent project delivery approaches, such as design-

89 build. A recent audit concluded that FHWA’s 2004 guidance is out of date and lacks a validated
90 threshold to assess the accuracy of engineer’s estimates (FHWA 2019).

91 Anecdotal evidence has shown that this range may be too narrow for D-B, but further there
92 is a lack of empirical evidence (Molenaar et al. 2006, FHWA 2019). Several factors have been
93 identified as triggering price proposal dispersion in design-build projects, such as the implications
94 of contract provisions on design-builder’s risk appetite and the variation in the design-builders
95 design approach and quantities (Molenaar et al. 2006). With these factors relying on the design-
96 builder approach to the bid, agencies can expect dispersions in price proposals that are not
97 necessarily under their control and it would be desirable for public agencies to have guidance on
98 reasonable values of bid dispersion.

99 Developing accurate engineering estimates and maintaining reasonable expectations for
100 bid-dispersion is a challenge for agencies procuring projects using best-value design-build. The
101 goal of this paper is to diagnose current practices related to cost estimating in design-build best-
102 value (D-B/BV) highway projects and provide guidance on the underlying reasons for bid
103 dispersion and engineering estimates inaccuracies. To achieve this goal, this study analyzes 305
104 D-B/BV projects from DOTs across the United States and combines quantitative and qualitative
105 approaches to evaluate current engineering estimate’s accuracy, price proposal dispersion, and the
106 underlying reasons for these phenomena. This research contributes to the body of knowledge in
107 innovative project delivery through empirical examination a first-of-a-kind database of 305
108 transportation infrastructure projects using D-B/BV to: (1) identify challenges and limitations in
109 current practice related to cost estimating, (2) provide guidance on reasonable expectations for cost
110 estimates and price dispersion, (3) identify the main reasons leading to bid dispersion and cost
111 estimate inaccuracies, and (4) recommend strategies to improve current practice.

112 Although D-B has extensively been used in the last decades and is expected to grow in the
113 coming years (Duggan and Patel, 2014; FMI, 2018), some public agencies still consider D-B as a
114 limited option (DBIA, 2019). By analyzing the challenges in engineering estimates for D-B/BV
115 highway projects, this study aims to guide policy-makers, agencies, and researchers on setting
116 reasonable expectations for cost estimates and price dispersion and formulate new policies and
117 processes for D-B/BV projects.

118

119 **LITERATURE REVIEW**

120 Current practices in cost estimation of highway projects are well documented in Anderson
121 et al. (2007). In the recent years, a growing body of knowledge have proposed data modeling
122 methods aimed at improving the accuracy of cost estimates (He et al., 2021). Some of the data-
123 driven techniques used in previous studies include structural equation modeling (Alroomi et al.
124 2016), data mining (Liang et al. 2019), advanced time-series models (Ilbeigi et al. 2017), and
125 artificial neural networks (Karaca et al. 2020), among others. In response to the increase usage of
126 D-B as an alternative project delivery method, previous studies have extensively analyzed the
127 schedule and cost performance of D-B projects and how they differ from other project delivery
128 methods (Michin et al., 2013; Chen et al., 2016; Sullivan et al., 2017; Antoine et al., 2019; Choi at
129 al., 2020; Moon et al., 2020; Franz et al., 2020). With respect to cost performance, previous studies
130 have developed statistical models to determine the impact of project features on cost overruns
131 (Creedy et al., 2010; Ramsey et al., 2016; Lu et al., 2017; Liang et al., 2020). Previous studies
132 have found that agencies tend to overestimate project costs by unintentionally introducing
133 optimistic assumptions (Karaca et al. 2020; Flyvbjerg et al. 2002; Jennings, 2012).

134 Despite the extensive work done on the cost performance of D-B projects, there is a limited
135 number of studies focused on bid dispersion and the accuracy of engineering estimates. This
136 information is crucial for public agencies to define reasonable expectations on engineering
137 estimates accuracy and bid dispersion. The American Association of Cost Engineering (AACE
138 2019) suggests that D-B projects with 10% to 30% design development should have an estimate
139 accuracy ranging from -30% to +50%. Empirical studies analyzing D-B/BV in highway projects
140 in the United States have shown average accuracies of 7%, suggesting that engineering estimates
141 in D-B/BV projects are within reasonable values (FHWA, 2017). However, these studies also
142 showed that the accuracy of cost estimates in D-B/BV is significantly lower than other delivery
143 methods. Alleman et al. (2017) compared the accuracy of cost estimates in highways projects
144 across four delivery methods: D-B-B, D-B/BV, design-build/low bid (D-B/LB), and construction
145 manager/general contractor (CM/GC) and found that agencies obtain the highest estimating
146 accuracy for CM/GC projects. The high accuracy of CM/GC project estimates is due to the
147 negotiation of price with one contractor and greater involvement between the contractor and the
148 agency in understanding the project scope, costs, and risks. This level of involvement of the
149 agency-contractor is absent in D-B/BV projects because of the design and project competition
150 involved in these procurements, which negatively impacts the accuracy of engineering estimates.

151 In D-B/BV, some specific reasons why engineering estimates deviate from award-winning
152 price proposals may be due to several facts inherent to the procurement method (Molenaar et al.,
153 2006): (1) projects are pushed towards procurement at an early stage of project development; (2)
154 proposals differ in scope due to the opportunity of value-engineering, innovation, and risk appetite
155 of the design-builder; (3) difficulty in predicting the cost of risks associated; and (4) varied degree
156 of agencies experience in D-B/BV projects.

157 Given the inherent characteristics of D-B/BV, some degree of bid dispersion and
158 inaccuracy in cost estimates is to be expected and agencies would benefit from guidance on
159 reasonable expectations for cost estimates and price dispersion. This paper analyzes a first-of-a-
160 kind dataset comprising 305 D-B/BV projects from State Departments of Transportation (DOTs)
161 across the United States to diagnose current practices related to cost estimating in design-build
162 best-value (D-B/BV) projects and provide guidance on the underlying reasons for bid dispersion
163 and engineering estimates inaccuracies.

164 **RESEARCH APPROACH**

165 The study considered a two-step approach. First, a quantitative analysis was performed to diagnose
166 current practices related to cost estimating in D-B/BV highway projects by evaluating the price
167 proposal dispersion and the degree of accuracy of engineering estimates. Second, a qualitative
168 analysis was performed to identify the underlying reasons for the inaccuracy in engineering
169 estimates and price proposal dispersion. In this qualitative analysis, projects having extreme values
170 (either high or low) in their accuracy and bid dispersion were further analyzed using interviews
171 with DOT personnel to identify the underlying factors behind these phenomena.

172 As part of the quantitative analysis, the research team collected cost data from 305 D-B
173 highway projects procured using BV in 15 DOTs. The information was collected from publicly
174 available online data and from requests to DOTs personnel across the United States. For each
175 project, the required data included: (1) successful price proposal, (2) unsuccessful price proposals,
176 and (3) engineering estimates. The timeframe for procurement of these projects ranged from 2005
177 to 2018.

178 To analyze this data, different metrics (Eq (1) to (3)) were used to measure bid dispersion
179 and engineering estimates accuracy. Bid dispersion (BD , Eq (1)) measures the variability of price
180 proposals when compared to the award-winning price proposal for a particular project.

$$181 \quad BD = \frac{\text{Highest Price Proposal} - \text{Lowest Price Proposal}}{\text{Award Winning Price Proposal}} \quad \text{Eq (1)}$$

182 The accuracy of engineering estimates was assessed using two metrics: the accuracy of
183 engineering estimates when compared to the average of all the price proposals for a particular
184 project ($EE_{average}$, Eq (2)) and with respect to the actual award-winning price proposal ($EE_{winning}$,
185 Eq (3)). This last metric is also known in the literature as award growth (FHWA, 2017).
186 Descriptive statistics and probability density functions (PDF) were developed for each of these
187 metrics (BD , $EE_{average}$, and $EE_{winning}$) to quantify bid dispersion and engineering estimates accuracy
188 in D-B/BV highway projects.

$$189 \quad 190 \quad EE_{average} = \frac{\text{Average of Price Proposals} - \text{Engineers Estimate}}{\text{Engineers Estimate}} \quad \text{Eq (2)}$$

$$191 \quad EE_{winning} = \frac{\text{Award Winning Price Proposal} - \text{Engineers Estimate}}{\text{Engineers Estimate}} \quad \text{Eq (3)}$$

192
193 To analyze the underlying reasons behind these phenomena, the research team performed
194 a qualitative analysis of projects showing extreme values (either positive or negative) in their bid
195 dispersion and/or engineering estimates accuracy. For each of the metrics described above,
196 extreme values were those lying beyond the 80% confidence interval of the probability distribution
197 function. For instance, if 80% of the projects have a bid dispersion (BD) within 7% and 54.8%,
198 projects having a bid dispersion lower than 7% or higher than 54.8% were considered extreme
199 values.

200 The qualitative approach consisted of interviews with the agency personnel (i.e., estimating
201 managers and design-build program managers). The objective of these interviews was to identify
202 the potential factors affecting engineering estimate accuracy and price dispersion. The key
203 questions asked during the interview were:

- 204 • What is your interpretation for the small/significant difference between low price
205 proposals and high price proposal?
- 206 • What are your interpretations for the small/significant deviation of the engineering
207 estimates from average/winning price proposal(s)?

208 Qualitative analysis involved and examination of trends in agency personnel replies. Since these
209 qualitative results are exploratory in nature, findings for both trends and individual responses are
210 reported.

211

212 **A DIAGNOSIS OF CURRENT PRACTICES IN COST ESTIMATING: RESULTS AND**
213 **DISCUSSION**

214 Cost data including successful and unsuccessful price proposals from 305 projects across 15 states
215 in the US were collected in this study. 71% of these projects included information on engineering
216 estimates. This information was not available for all the projects because some DOTs have policies
217 limiting their ability to publish their cost estimates. Thus, the accuracy of engineering estimate
218 was calculated for 218 projects whereas the dispersion of price proposals was analyzed for all the
219 305 projects. In terms of project size, 41% of the projects had an awarded amount between 5 and
220 35 million dollars (Figure 1).

221

222

FIGURE 1

223

224 **Quantitative Analysis of Bid Dispersion and Engineering Estimate Accuracy**

225 Table 1 summarizes the descriptive statistics of the metrics used to measure bid dispersion (*BD*)
226 and engineering estimates accuracy when referred to the average bid price (*EE_{average}*) and the
227 award-winning proposal (*EE_{winning}*). This table presents results of average, median and mode
228 values, extreme values (minimum and maximum), variability (measured in terms of standard
229 deviation), and upper and lower limits defining the 80% confidence interval.

230

TABLE 1

231 The DOTs participating in this study have different maturity levels in the implementation
232 of D-B, resulting thus in a non-homogeneous distribution of projects among the 15 states
233 participating in the study. Specifically, Florida DOT has a large experience using D-B project
234 delivery and contributed to 40% of the projects in the sample. Non-parametric Wilcoxon-Mann-
235 Whitney tests (Wilcoxon 1945) were performed to assess whether the bid dispersion and engineers
236 estimate accuracy of Florida DOT projects differ from other DOTs. Results from this test (with p-
237 values of 0.57, 0.42, and 0.16 for *BD*, *EE_{average}*, and *EE_{winning}*, respectively) allowed to conclude
238 there is not a statistically significant difference.

239 Results in Table 1 show that bids have an average dispersion of 27%. This means that, on
240 average, the difference between the highest and lowest price proposal is 27% of the award. Eighty
241 percent (80%) of the projects have a bid dispersion ranging from 7 and 55% (these values are
242 defined by the upper and lower limits of the 80% confidence interval). From the distribution of the
243 bid dispersion metric (Figure 2), it can be seen that the probability density function (PDF) shows
244 a skewness to the left, meaning that most of the projects are on the lower end of this range.

245

FIGURE 2

246 These results of bid dispersion suggest that the traditional +/- 10% guidance used to
247 identify anomalies in engineer's estimates accuracy may not be appropriate for design-build
248 projects. Instead, we propose to use a larger threshold (i.e., 25%) to account for the inherent
249 variability of design-build projects. Transportation agencies can therefore use 25% as a more
250 appropriate threshold in design-build projects and use this rule of thumb to identify unreasonable
251 outcomes from a bid. Authors explored which may be the potential reasons for bid dispersion and
252 found that bid dispersion is not correlated with award price ($R^2 = 0.023$). This result suggests that
253 other factors, such as risk-appetite and innovation (i.e., reflected in different design solutions),
254 may be driving bid dispersion. The influence of these factors on bid dispersion have not been fully
255 explored in this research because this data was not available. We suggest owners could explore
256 these differences on a project-by-project basis. Future research is suggested to explore this at a
257 national scale and we envision that differences in design could be quantified using proxies such as
258 technical best value scores or differences in the number of alternative technical concepts that are
259 submitted.

260 With respect to average accuracy, engineering estimates were found to be underestimated
261 by 8% the average price proposal and overestimate the awarded price by 2% (Table 1). In 62% of
262 the cases, engineering estimates are lower than the average price proposal, whereas they tend to
263 overestimate the awarded price in 56% of the projects. The accuracy of engineering estimates with
264 respect to the award-winning proposal ($EE_{winning}$) shows a lower average, median, and mode values
265 than the accuracy of the average price ($EE_{average}$). This indicates that engineering estimates are
266 generally closer to the awarded price than to average price proposals.

267 This study also found that, although these projects were procured using best-value, 82% of
268 them were awarded to the lowest price proposal. This finding suggests a misalignment with the

269 core principle of best-value procurement, which is aimed at selecting the most advantageous
270 proposal by evaluating other factors in addition to price (Molenaar and Tran, 2015). With
271 engineering estimates being generally closer to the awarded price than to average price proposals,
272 it can be concluded that engineering estimates are generally better predictors of low-cost bids.

273 FIGURE 3

274 FIGURE 4

275 When analyzing the PDF of the metrics used to measure the accuracy of engineering
276 estimates (Figure 3 and Figure 4), it can be seen that in 80% of the cases, engineering estimates
277 are within 34% and -20% of the average price proposal and 19% and -27% of the award-winning
278 proposal. As far as the accuracy of engineering estimates is concerned, 67% of the projects showed
279 adequate levels of accuracy based on the recommendations from the Association for the
280 Advancement of Cost Engineering (AACE), which recommends an accuracy bracket of +20% to
281 -10% for projects with a level of design of 10% to 40% (AACEI, 2019). The PDF of engineering
282 estimates accuracy to the award-winning proposal (Figure 4) shows a slight skewness to the right,
283 meaning that accuracy is slightly leaning towards the upper end of this range.

284 In our study, the standard dispersion for engineering accuracy toward the award-winning
285 proposal ($EE_{winning}$), also referred in the literature as award growth, was 22% (Table 1). This result
286 is consistent with the findings of previous research conducted by FHWA (2017) that found the
287 same dispersion in the analysis of 71 best-value design-build.

288

289 **Discussion of Current Practices and Guidance on Reasonable Expectations**

290 This study found that D-B/BV bids have an average dispersion of 27%, meaning that the average
291 difference between the highest and lowest price proposal is 27% of the awarded price. Some degree

292 of bid dispersion is inherent to the procurement method itself, as proposed designs in D-B/BV are
293 expected to differ between proposals, leading thus to differences in scope, construction
294 approaches, and quantities (Molenaar et al. 2006). Moreover, design-builders may have different
295 risk-appetite, and therefore differ in their approach to the bid (Molenaar et al. 2006). Some degree
296 of bid dispersion is therefore to be expected and this study provides guidance on reasonable values
297 for this dispersion. In this study, 80% of the projects have a bid dispersion ranging from 7 and
298 55%. This range can be used by agencies to identify projects having a significantly high or low
299 bid dispersion. If bid dispersion is found to be significantly higher than this upper limit (i.e., 55%),
300 this may be an indicator of a poor definition of the request for proposals or an inadequate
301 communication with proposers resulting in a high variability in proposed designs and, therefore,
302 high bid dispersion. On the other hand, a very low bid dispersion may be an indicator of a very
303 constrained request for proposals that limit the ability of design-builders to incorporate innovation.

304 With respect to average accuracy, engineering estimates were found to be underestimated
305 by 8% the average price proposal and overestimate the awarded price by 2%. This finding is
306 contrary to previous studies (Flyvbjerg et al. 2002; Jennings, 2012; Karaca et al. 2020), which have
307 suggested that project planners may often consider optimistic assumptions and unintentionally
308 underestimate project costs. This result suggests that current practices in cost estimating in D-
309 B/BV may be more conservative than other procurement methods.

310 Another important finding of this paper is that current practice in D-B/BV seems to be
311 biased toward price, suggesting a misalignment with the core principles of best-value procurement.
312 Despite best-value is meant to enhance the value of construction by considering other factors in
313 addition to price (Molenaar and Tran, 2015; Scheepbouwer et al. 2017; Gransberg 2020), this study
314 found that 82% of the projects were awarded to the lowest price proposal. This practice seems to

315 also impact cost estimating practices, as the results found in this study suggest that engineering
316 estimates are generally better predictors of lowest bids.

317

318 **UNDERLYING REASONS AND RECOMMENDATIONS TO IMPROVE COST** 319 **ESTIMATES ACCURACY AND REDUCE BID DISPERSION**

320 Sixteen projects showing extreme values (i.e., either high or low bid dispersion and/or cost
321 estimate accuracy) were considered for further exploration in the qualitative analysis. To avoid
322 inconsistency in the qualitative analysis, the projects were chosen if (1) the number of price
323 proposals for the project is between three to five (including three and five); and (2) the engineer
324 estimate of the project is greater than \$50 million. These assumptions were made to have a more
325 homogeneous population when exploring trends. The small projects were excluded because the
326 absolute difference in cost is relatively small when compared to projects greater than \$50 million.

327 The bid dispersion and engineering estimate accuracy of projects selected for the
328 qualitative analysis are depicted in Figure 5. For each project, bid dispersion and estimate accuracy
329 are shown to illustrate the reasons why these projects were selected for the qualitative analysis.
330 Project 1, for example, was selected because its low bid dispersion and high accuracy of
331 engineering estimates (both with respect to the average and winning price proposal). In contrast,
332 project 16 shows high bid dispersion and low accuracies in cost estimates. The remaining projects
333 (2 to 15) complete the spectrum by comprising projects with different metrics in terms of
334 dispersion and accuracy. Among the selected projects, some of them excelled in all the criteria
335 (e.g., projects 1, 2, and 3), while some did not (e.g., projects 15 and 16). Similarly, some projects
336 partially excelled in some criteria and failed in the others (e.g., project 13 shows a good
337 performance in terms of dispersion but low performance in accuracy). By analyzing projects

338 showing extreme (i.e., either good or bad) performance in terms of dispersion and accuracy, the
339 research is aimed at finding reasons for these phenomena from the perspective of the DOT.

340 **FIGURE 5**

341 The three potential reasons behind the price proposal dispersion and the engineering
342 estimates accuracy that were observed through the interviews were (1) degree of effective
343 communication of project goals to the design-builder; (2) implementation of innovative and value
344 engineering techniques; and (3) implementation of a robust and rigorous risk-based estimation
345 program.

346

347 **Effective Communication of Project Goals**

348 Effective communication was found imperative to reduce bid dispersion because it helps design-
349 builders understand the project goals and minimize the chances to misinterpret the base design in
350 the request for proposals. During the interviews, DOT personnel highlighted the importance of
351 sharing with bidders the agency's project goals and holding meetings before the request of price
352 proposals as a way to enhance communication.

353 To improve the effectiveness of communication, DOTs can use the five-dimensional
354 project management (5DPM) approach that complements the DOT's project management
355 practices. This approach, described in Shane et al. (2013), consists of methods, tools, and
356 techniques aimed at identifying and addressing critical issues related to cost, schedule, and
357 technical aspects contributing to project complexity. A part of this approach focuses on these
358 critical issues by providing information on effective communication regarding project cost,
359 schedule, and technical aspects. 5DPM provides management approaches to facilitate an effective
360 project development and is aimed at accelerating project delivery, reducing project costs, and

361 minimizing project disputes. Implementing the 5DPM planning framework can result in
362 improvements in the project development process and eventually increase project management
363 efficiency.

364

365 **Implementation of Innovative and Value Engineering Techniques**

366 The second reason identified as affecting bid dispersion and engineering estimate accuracy was
367 the implementation of innovative and value engineering techniques. The most common way
368 proposers introduce innovation in D-B projects is through alternative technical concepts (ATCs).
369 Antoine and Molenaar (2016) analyzed D-B/BV projects and found that DOTs used ATCs on 51%
370 of them. ATCs can enhance constructability, innovation, mitigate risks, and eventually reduce the
371 project cost (FHWA, 2019). Thus, the implementation of ATCs certainly causes bid dispersion
372 and a consequent inaccuracy in the engineering estimates, as DOT personnel has not considered
373 this innovation in their estimate. Design-builders also use value engineering techniques that lead
374 to substantial cost-savings, which results in bid-dispersion. Both innovation in forms of ATCs and
375 the use of value-engineering techniques are to be expected in best-value design-build projects as
376 the design-builder's services are procured at the preliminary design stage. As some of the
377 interviewed DOT personnel pointed out, ATCs may imply substantial changes in the project, thus
378 causing important deviations in price proposals. These factors of innovation and value-engineering
379 are well beyond the control of the DOT. Thus, DOTs should expect some level of innovation and
380 value-engineering, which will eventually result in some degree of inaccuracy in engineering
381 estimates and price proposal dispersion.

382

383 **Risk-Based Cost Estimation Program**

384 The third reason identified in the interviews as affecting bid dispersion and engineering estimate
385 accuracy was the implementation of a risk-based estimation program to facilitate the risk allocation
386 associated with D-B/B-V projects. In highly complex projects, with a high amount of risk involved,
387 the price proposal depends on the design-builder risk strategy. Some design-builders may have an
388 aggressive risk-taking strategy, while others may not. The varying risk appetite of design-builders
389 often results in high bid dispersion. However, by implementing a risk-based estimation program,
390 the DOT can effectively identify, address, and allocate most of the risks involved in the project.
391 This would reduce the impact of design-builders perception of risks and would result in more
392 accurate engineering estimates and low dispersed price proposals.

393 From the sample analyzed, most of the projects developed by the Washington State DOT
394 (WSDOT) had high engineering estimates accuracy and low bid dispersion. With the help of
395 interviews, it was found that WSDOT rigorously follows a risk-based cost estimation and
396 validation program called CEVP (Cost Estimation and Validation Process). A study conducted by
397 Molenaar (2005) on this program found it efficient in providing transparency in project costs and
398 uncertainties. One of the features of this program is that it considers a range of cost output, rather
399 than using point estimates at a conceptual design stage. This range cost output provides
400 transparency and avoids underestimation of a project. The process involves multiple phases in
401 which experts of planning, design, construction, contracting, program delivery strategy, cost-
402 estimating, environmental programs, and economics identify project risks and alternative
403 strategies. The process comprises different steps of the risk management process, from risk
404 identification to risk mitigation. This thorough process results in an enhanced ability to identify
405 high-risk items and mitigation measures to reduce uncertainty (Molenaar, 2005). As a result,

406 having an in-house rigorous risk-based cost estimation plan or adopting one such program could
407 help improve the accuracy of engineering estimates.

408 During the interviews, it was observed that none of the DOTs had rules/policies regarding
409 D-B/BV procurement bidding results. The DOTs generally use a rule-of-thumb of 10%, which
410 means that a potential award-winning price proposal that deviates more than $\pm 10\%$ with respect
411 to engineering estimates requires the respective design-builder to go through a justification
412 process. In these cases, the interviewed DOTs conduct studies to understand the reasons behind
413 the deviation. The results from this research can help the DOTs understand the reasonable
414 expectations for accuracy of engineering estimates and bid dispersion and accordingly formulate
415 new policies for efficient procurement.

416

417 **CONCLUSIONS**

418 Developing engineering estimates for best-value design-build projects is challenging. The
419 accuracy of engineering estimates and the bid-dispersion for such projects depend on several
420 influencing factors, some of them inherent to best-value design-build procurement (e.g., projects
421 are pushed towards procurement at an early stage of project development). Non-regulatory
422 guidance from the FHWA (2014) states that the engineer's estimate should be within $\pm 10\%$ of
423 the winning low bid. This threshold, however, was developed in the early 1980s and has not been
424 updated to reflect the peculiarities of design-build. This study analyzed 305 best-value design-
425 build highway projects to quantitatively evaluate the degree of inaccuracy of engineering estimates
426 and bid-dispersion. This analysis was followed by a qualitative analysis aimed at identifying the
427 reasons behind these phenomena.

428 This study found that D-B/BV projects have an average dispersion (the difference between
429 the highest and lowest price proposal) of 27%. This result suggests that the traditional 10%
430 threshold may not be adequate and a larger threshold (i.e., 25%) is needed to account for the
431 inherent variability of design-build projects. Engineering estimates were found to be generally
432 closer to the awarded price than to average price proposals. 82% of the projects in the data sample
433 were awarded to the lowest bid, suggesting that best-value procurement is failing to account for
434 other factors in addition to cost. These results also show that engineering estimates are generally
435 better predictors of low-cost bids. On average, engineers overestimate awarded projects by 2%.
436 This study shows that some inaccuracy and bid-dispersion should be expected in D-B/BV projects
437 and provides guidance to help agencies define reasonable expectations in engineering estimates
438 and price proposals.

439 From the qualitative analysis, the study identified three main reasons affecting bid
440 dispersion and estimates accuracy: (1) degree of effective communication of project goals to the
441 design-builder; (2) implementation of innovative and value engineering techniques; and (3)
442 implementation of a robust and rigorous risk-based estimation program. The study recommends
443 agencies to collaborate with the design-builder while developing the engineering estimates. This
444 agency-contractor collaboration must occur prior to and after the final procurement. Holding
445 communications before the award will help clarify and communicate the agency's goals and intent
446 of the project effectively, whereas discussions after the award can provide valuable feedback to
447 design-builders. This feedback can also be used by the agency to improve their future engineering
448 estimates.

449 This study provides a diagnostic of current practice in D-B/BV procurement based on
450 empirical evidence from highway projects. Future research is needed to overcome some of the

451 limitations and challenges identified in this study. For example, guidance on how to better balance
452 cost and non-cost factors in best-value procurement would be valuable to reduce the current bias
453 of best-value selection toward lowest bids. Future research is also needed to empirically
454 evaluate the effectiveness of the proposed strategies and their impact on bid dispersion and
455 estimates accuracy, as well as the impact of design variations in bid dispersion. Finally, further
456 research is suggested to explore the relations between bid dispersion and engineering estimates
457 accuracies with project results.

458

459 **DATA AVAILABILITY**

460 Some or all data, models, or codes that support the findings of this study are available from the
461 corresponding author upon reasonable request.

462

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466

467 **DISCLAIMER**

468 The views expressed in the article are exclusive of the authors and do not reflect the official policy
469 or position of any US DOT.

470

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612

613 TABLES

614 Table 1: Descriptive statistics of bid dispersion and engineering estimates accuracy metrics

	<i>BD</i>	<i>EE_{average}</i>	<i>EE_{winning}</i>
Observations	305	218	218
Average	27%	8%	-2%
Median	22%	8%	-2%
Mode	20%	11%	0%
Max	185%	145%	112%
Min	0%	-59%	-50%
Std. Dev	23%	25%	22%
Upper limit 80% Confidence Interval	55%	34%	19%
Lower limit 80% Confidence Interval	7%	-20%	-27%

615

616 **LIST OF FIGURES**

617 Figure 1: Distribution of project size measured in terms of awarded amount

618 Figure 2: Probability density function of bid dispersion (BD) metric

619 Figure 3: Probability density function of engineering estimate accuracy when compared to the
620 average price proposal (EE_{average})

621 Figure 4: Probability density function of engineering estimate accuracy when compared to the
622 award-winning proposal (EE_{winning})

623 Figure 5: Bid dispersion and estimates accuracy of projects considered for qualitative analysis