

BRIEF

INTRODUCTION TO COST-EFFECTIVENESS ANALYSIS BRIEF

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Introduction to Cost-Effectiveness Analysis Brief

Region 5 Comprehensive Center

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Introduction

The goal of this brief and accompanying Excel model is to provide school district and school staff with tools to help make more effective and efficient use of resources, particularly American Rescue Plan ESSER III funding. ESSER III funding offers districts and schools an opportunity to not only support their immediate needs of safely reopening schools to in-person instruction and addressing learning loss due to COVID-19-related interruptions to schooling, but also leverage opportunities for planning and restructuring for long-term improvement. An important component of this is to budget and use scarce resources strategically, that is, using data to identify student needs, establish performance goals, and respond with strategies and programs capable of meeting these goals that are both effective and cost-effective. What is the difference between effectiveness and cost-effectiveness? A strategy or program may be highly effective but also very costly, perhaps beyond the reach of a district's budget. Other alternatives may be available that are as effective, or nearly as effective, but cost significantly less. If the impact of one of more of these alternatives is sufficient for meeting performance goals, then any one of these lower cost options may be a better, more cost-effective choice.

Cost-effectiveness (CE) analysis is a tool that may be used by districts and schools to compare the costs and effectiveness of two or more program alternatives with similar objectives. CE analysis requires both a detailed accounting of the costs of each alternative and a common outcome that may be compared across the alternatives under consideration. The product of a cost-effectiveness study is the cost-effectiveness ratio for each alternative. The cost-effectiveness ratio tells us the cost per unit of improvement, such as a one-point increase in scale scores, for each alternative intervention. For example, a district may be weighing five different elementary math interventions. A CE analysis will identify the per-student cost of each alternative, the expected average marginal unit of math achievement improvement per student, and the cost per unit of improvement. All other considerations being equal, the most desirable alternative is the one with the lowest cost-effectiveness ratio (i.e., the lowest cost per unit of improvement).

Conducting a cost-effectiveness study involves the following five steps:¹

- » **Step 1: Identifying viable alternatives.** This step involves identifying the available alternatives for achieving a given outcome most appropriate for a given district or school's context (e.g., multiple interventions for improving elementary math scores).
- » **Step 2: Locating reliable impact studies for each alternative that use the same measure of effectiveness for each alternative** (e.g., the change in scores on a specific math assessment—or equated assessments or measures if multiple assessments are used).
- » **Step 3: Estimating the costs of each alternative.**
- » **Step 4: Calculating the cost-effectiveness ratio of each alternative.**

¹ See Levin, H.M., McEwan, P.J., Belfield, C., Bowden, B.A., and Shand, R. (2018). *Economic Evaluation in Education: Cost-Effectiveness and Benefit-Cost Analysis*. Los Angeles, CA: Sage.



- » Step 5: Selecting the most appropriate, cost-effective alternative that is both compatible with a district's culture and needs, and offers sufficient improvement for meeting its performance goals.

Determining Costs

The preferred method for collecting program costs is the ingredients method recommended by the Center for Benefit-Cost Studies in Education.² Typical cost ingredients associated with educational interventions include personnel, materials, technology or other equipment, professional development, facilities, and potentially other resources.

The purpose behind the ingredients approach is to account for the cost of all of the resources required to implement each alternative under consideration, irrespective of their source. By focusing on ingredients, this approach begins not with a budget, but with the details of the intervention and its resource requirements, such as the amount of staff time or instructional materials required. Only after systematically identifying all of the ingredients used in each of the strategy or program alternatives should the costs of these ingredients be measured (e.g., if the ingredient is 30 hours of teacher time, then the cost is 30 hours' worth of salary and fringe benefits). Further, these costs should be calculated as incremental costs (i.e., taking into account resources utilized as part of the intervention beyond those supporting the current approach), also known as the "business as usual" approach. For example, if assessing alternative supplemental math interventions, costs should only include those of the intervention itself, not the costs of delivering the district's adopted math curriculum.

Evaluators and educators often believe that the best method of gathering cost information is to rely on available program budgets. However, for a number of reasons budgets are inadequate for determining costs. Budgets using state-approved accounting codes may not provide sufficient detail for isolating the specific costs of an intervention. The budgeted amount also may not equal what was actually spent on a strategy or intervention. Finally, most budgets may not include certain costs of an intervention, such as the cost of facilities used in the intervention, unless space is being rented or there is new construction.

Because a CE analysis is typically undertaken before any alternatives are actually purchased and implemented, districts will likely need to estimate costs based on a description of program requirements provided by a program's vendor, or based on prior experience of implementing similar programs, or on the experience of similar districts that have already implemented the program, or on some combination of all three approaches. No matter how costs are estimated, every effort should be made to ensure as complete and accurate estimates as possible for each alternative included in the analysis.

² See the Center for Benefit-Cost Studies of Education, University of Pennsylvania Graduate School of Education. <https://www.cbcse.org/>.



Determining Effectiveness

The measure of effectiveness for the alternatives under consideration should closely reflect the main objective of the alternatives (e.g., a valid reading assessment for measuring the effects of alternative reading interventions). One of the constraints of the cost-effectiveness method is that it requires a common and comparable outcome measure for each of the alternatives being studied. Therefore, cost-effectiveness analysis cannot be used to compare interventions with different goals; for example the cost-effectiveness of a reading intervention compared to that of a math intervention.

Key to identifying and comparing alternative strategies and interventions are high-quality evaluations that provide accurate information on their effectiveness and their appropriateness for different types of students. While there may be occasions when a school district may be able to pilot and evaluate a program's effectiveness on its own, in most cases districts will likely rely on the research of others to provide estimates of the effects or benefits.

The effectiveness of educational strategies, programs, or interventions is determined through research studies aimed at measuring their "impact." Impact refers to the effect the intervention has on student learning or other outcomes of interest. For example, how much a supplemental reading program increases students' scores on a reading assessment. Impact studies may vary in quality. Some factors to consider include:

- » How many students were included in the study? Typically, the more the better.
- » What method was used for the study? The gold standard is randomized control trials where participating students are randomly assigned to a treatment group (they are taught using the program being studied) and a control group (they are not taught using the program of interest, but instead using business as usual materials). Quasi-experimental designs may also be found in higher quality studies. Quasi-experimental design studies do not use random assignment but use other means to identify treatment and control groups. Some examples of quasi-experimental design studies include regression discontinuity, interrupted time series, or natural experiments.
- » Was the study conducted internally by the developer/vendor of the product or by external researchers? Developers of educational programs or interventions often conduct their own impact studies to demonstrate effectiveness. It is generally preferable if an independent team of researchers conducts the study. However, if the results of the study were published in a peer-reviewed journal then the results are likely acceptable regardless of who conducted the study. Another check is if an independent study team subsequently conducted a similar study which showed similar results.

Another factor to consider is whether the context of the districts, schools, and students participating in the study are similar to those of your district. A program that is effective for one group of students may not be similarly effective for another. Ideally, study results of the program or intervention show it is effective for students similar to those your district serves.



There are several sources of reliable impact studies districts may turn to, including those published in peer-reviewed academic journals, evaluation reports, or studies available on the What Works Clearinghouse website.

- » **What Works Clearinghouse.** Provided by the U.S. Department of Education’s Institute for Education Sciences (IES), the What Works Clearinghouse (WWC) provides full research reports and summaries of high-quality program evaluations. WWC not only presents evaluation findings but also rates whether or not the studies meet WWC research quality standards.

Link: <https://ies.ed.gov/ncee/wwc/>

- » **Evidence-Based School Finance Literature Reviews.** One of the four primary methods for determining adequate funding for schools is the evidence-based approach. This approach makes use of an extensive literature review of evidence-supported programs and strategies to estimate the cost of an adequate education. A recent version of this literature review may be found in the report for a 2020 study in Wyoming (see review beginning on page 55).

Link: <http://picusodden.com/wp-content/uploads/2021/03/Wyoming-EB-Adequacy-Study-2020.pdf>

- » **RAND Educational Program Evaluation.** The RAND Corporation’s website features reports and briefs on their evaluations of a range of education program areas.

Link: <https://www.rand.org/topics/educational-program-evaluation.html>

- » **Publications from the American Educational Research Association.** Two of its journals regularly featuring program evaluations are *Educational Evaluation and Policy Analysis* and *The American Educational Research Journal*. Both are peer reviewed.

Links: <https://journals.sagepub.com/description/EPA>

<https://journals.sagepub.com/home/aer>

- » **Educational Research and Evaluation.** A peer reviewed journal that publishes articles on educational research and evaluation on a wide variety of education topics. It is international in scope.

Link: <https://www.tandfonline.com/toc/nere20/current>

Determining the Cost-Effectiveness Ratio

Once the alternatives’ costs have been estimated and a common effectiveness measure identified, the cost-effectiveness ratios (CERs) may be calculated. This ratio is calculated as the cost divided by the effectiveness measure—in most cases the per-student cost of an alternative divided by the average improvement by student. For example, if a program costs \$200,000 and yields 100 extra high school completers above and beyond what would be expected from a comparison group not participating in the program, the CER is \$2,000 per extra completer. This ratio shows the cost of “buying” an extra completer.



The cost-effectiveness ratio equals:

$$\frac{\text{Cost of alternative}}{\text{Change in unit of effectiveness}}$$

Lower CERs are generally preferred—if the program referenced above yields 200 extra completers, then the CER improves to \$1,000 per extra completer. This ratio may be helpful because it can be easily related to the value of the program—specifically, whether it is worth spending \$1,000 to \$2,000 to “buy” an additional completer.

CERs may also be tested for sensitivity to see how sensitive the results are to alternative modeling assumptions. Sensitivity testing may include examining the results if the best and worst cases are assumed, thereby placing upper and lower bounds on the results. Another type of sensitivity test is to vary key variables, or parameters in the model, such as per-student cost. Is the most cost-effective alternative still the same if per-student costs are \$50 or \$100 per student higher than estimated?

Cost-Effectiveness Example

This example of a CE analysis compares the cost-effectiveness of four hypothetical alternative elementary mathematics curricula. The analysis follows the study procedures described above—1) identifying viable alternatives; 2) locating reliable impact studies for each alternative that use the same measure of effectiveness for each alternative; 3) estimating the costs of each alternative; 4) calculating the cost-effectiveness ratio; and 5) selecting the most appropriate, cost-effective alternative. The screen shots of analysis tables are taken from the companion Cost-Effectiveness Calculator.

Step 1: Identifying viable alternatives

For this example, we looked to the Institute for Education Sciences’ What Works Clearinghouse (WWC) for representative examples of elementary math curricula. Based on actual curricula reviewed by WWC, four hypothetical alternatives were developed representing a range of effectiveness levels. A school district searching for appropriate alternatives would likely have additional criteria for selecting alternatives based on scope and sequence across all school levels, the needs of its students, and its specific philosophy of math instruction.

Step 2: Locating reliable impact studies for each alternative that use the same measure of effectiveness for each alternative

The WWC not only did the leg-work of locating impact studies for each alternative, but also assessed the quality of the studies. Because WWC provides its own Improvement Index for all curricula reviewed on the website, this was used as the common measure of effectiveness.

Figure 1 shows the Effectiveness Value entered for each math curriculum alternative, the effectiveness measure selected for this analysis (shown in the “Select Type of Effectiveness Measure Used” box to the right), and the estimated number of student participants for each alternative. The WWC Improvement Index ranges from 2 index point for Alternative 4 to 11 index point for Alternative 1.

Figure 1. Effectiveness measures and estimated participants

Enter each alternative's name and effectiveness value below:

Impact Table		
Alternatives	Enter Name or Other Identifier	Enter Effectiveness Value
Alternative 1	Math Curriculum A	11
Alternative 2	Math Curriculum B	12
Alternative 3	Math Curriculum C	8
Alternative 4	Math Curriculum D	2

Select Type of Effectiveness Measure Used

WWC Improvement Index

If "Other", what is the measure used?

Enter the number of students or staff participating in each alternative below:

Participants Table		
Alternatives	Name or Other Identifier	Enter Number of Participants
Alternative 1	Math Curriculum A	347
Alternative 2	Math Curriculum B	277
Alternative 3	Math Curriculum C	885
Alternative 4	Math Curriculum D	800

Step 3: Estimating the costs of each alternative

For the purpose of this example no attempt was made to estimate the actual costs of purchasing and implementing each alternative. Instead, hypothetical average costs for districts participating in the studies were constructed assuming an average-sized participating district for each alternative based on the total number of students participating in relevant studies for each alternative reported by WWC. Estimated costs for each alternative are presented in figure 2 below. Because cost-effectiveness is estimated based on the average expected gain per student, the cost amounts must also be on a per-student basis. Figure 2 shows that per-student costs range from \$220.06 for Alternative 3 to \$340.13 for Alternative 1.



Figure 2. Detailed costs of four elementary mathematics curricula

Cost Element	Alternative 1 Math Curriculum A				Alternative 2 Math Curriculum B				Alternative 3 Math Curriculum C				Alternative 4 Math Curriculum D			
	Units	# Units	Price/Unit	Cost	Units	# Units	Price/Unit	Cost	Units	# Units	Price/Unit	Cost	Units	# Units	Price/Unit	Cost
Personnel Costs																
Administrator salaries - central office	Hours	20.0	\$48.08	\$961.54	Hours	10.0	\$48.08	\$480.80	Hours	15.0	\$48.08	\$721.20	Hours	12.0	\$48.08	\$576.96
Administrator salaries - school	Hours	90.0	\$43.27	\$3,894.23	Hours	75.0	\$43.27	\$3,245.25	Hours	80.0	\$43.27	\$3,461.60	Hours	90.0	\$43.27	\$3,894.30
Clerical/support staff salaries	Hours	180.0	\$16.83	\$3,028.85	Hours	100.0	\$16.83	\$1,683.00	Hours	185.0	\$16.83	\$3,113.55	Hours	120.0	\$16.83	\$2,019.60
Instructional coach, mentor, or lead teacher salaries	Hours			\$0.00	Hours	132.0	\$38.19	\$5,041.08	Hours	420.0	\$38.19	\$16,039.80	Hours	384.0	\$38.19	\$14,664.96
Teacher salaries	Hours	336.0	\$38.19	\$12,833.33	Hours	330.0	\$38.19	\$12,602.70	Hours	1,050.0	\$38.19	\$40,099.50	Hours	960.0	\$38.19	\$36,662.40
Substitute teacher salaries	Hours	224.0	\$15.00	\$3,360.00	Hours	176.0	\$15.00	\$2,640.00	Hours	560.0	\$15.00	\$8,400.00	Hours	512.0	\$15.00	\$7,680.00
Other certified staff salaries				\$0.00				\$0.00				\$0.00				\$0.00
Other classified staff salaries				\$0.00				\$0.00				\$0.00				\$0.00
Fringe benefit costs for certified staff	% of Salaries		30.0%	\$5,306.73	% of Salaries		30.0%	\$6,410.95	% of Salaries		30.0%	\$18,096.63	% of Salaries		30.0%	\$16,739.59
Fringe benefit costs for classified staff	% of Salaries		24.0%	\$726.92	% of Salaries		24.0%	\$403.92	% of Salaries		24.0%	\$747.25	% of Salaries		24.0%	\$484.70
Fringe benefit costs for substitute teachers	% of Salaries		15.0%	\$504.00	% of Salaries		15.0%	\$396.00	% of Salaries		15.0%	\$1,260.00	% of Salaries		15.0%	\$1,152.00
Total Personnel Costs				\$30,615.60				\$32,903.70				\$91,939.53				\$83,874.51
Non-Personnel Costs																
Contract costs of consultants and external trainers		1.00	\$25,000.00	\$25,000.00		1.00	\$30,000.00	\$30,000.00		1.00	20,000.00	\$20,000.00		1.00	30,000.00	\$30,000.00
Technology hardware or equipment				\$0.00				\$0.00				\$0.00				\$0.00
Technology software				\$0.00				\$0.00				\$0.00		1.00	25,000.00	\$25,000.00
Licensing or subscription fees		10.00	\$5,000.00	\$50,000.00				\$0.00		20.00	3,000.00	\$60,000.00		17.00	3,500.00	\$59,500.00
Materials or supplies		1.00	\$1,908.00	\$1,908.00		1.00	\$16,620.00	\$16,620.00		1.00	5,310.00	\$5,310.00		1.00	4,800.00	\$4,800.00
Professional development	Teachers	14.00	\$750.00	\$10,500.00	Teachers	11.00	\$675.00	\$7,425.00	Teachers	35.00	500.00	\$17,500.00	Teachers	32.00	650.00	\$20,800.00
Food and refreshments				\$0.00				\$0.00				\$0.00				\$0.00
All other costs				\$0.00				\$0.00				\$0.00				\$0.00
Total Non-Personnel Costs				\$87,408.00				\$54,045.00				\$102,810.00				\$140,100.00
Total Costs				\$118,023.60				\$86,948.70				\$194,749.53				\$223,974.51
Total Cost per Participant				\$340.13				\$313.89				\$220.06				\$279.97

Step 4: Calculating the cost-effectiveness ratio

Figure 3 below shows the resulting cost-effectiveness ratio, which is calculated automatically by the Cost-Effectiveness Calculator. The cost-effectiveness values range from \$26.16 per index point improvement on the Improvement Index for Alternative 2 to \$139.98 for Alternative 4.

Figure 3. Cost-effectiveness ratios for the four mathematics curricula alternatives

Alternative	Name	Cost-Effectiveness Ratio
Alternative 1	Math Curriculum A	\$30.92
Alternative 2	Math Curriculum B	\$26.16
Alternative 3	Math Curriculum C	\$27.51
Alternative 4	Math Curriculum D	\$139.98

NOTE: The alternative with the lowest Cost-Effectiveness ratio (the lowest dollar amount shown because the CE Ratio represents the cost per unit of change provides the lowest cost per unit of change among the alternatives under consideration.

Step 5: Selecting the most appropriate, cost-effective alternative

Because in this example there are no other considerations other than selecting the most cost-effective option, our preferred math curriculum would be Alternative 2, which has the lowest cost per unit of Improvement Index gain. As noted above, districts may have other legitimate criteria for selecting an alternative that is less lower cost-effective but a better fit for the district.