

ACAT Assessment of Grade-based and Outcome-based Criteria

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Abstract

Building on substantial work done on a new automated course and program assessment tool, we undertook an experiment to determine the accuracy of the outcomes assessments. We compared assessments of course-level outcomes using manual instructor assessments in Moodle and our Automated Course Assessment Tool (ACAT). Four courses taught in the Spring of 2015 were considered. Two are Laboratory courses, and two are traditional book-based courses with exams or projects. We found that in all but one specific case the manual assessment matched the ACAT assessment. In the sole case that did not match, a single indicator attempted to measure all course outcomes simultaneously. The study considered 34 students, 27 outcomes, and used 107 indicators to measure the outcomes. A single indicator affecting two students caused three outcomes to be adjudged incorrectly.

Introduction

Higher education assessment is typically addressed at three levels: course, program, and institution. We have previously presented a developmental Automated Course Assessment Tool (ACAT) that automatically assesses course-level and program-level outcomes. The software works by reading Moodle gradebook entries that instructors have mapped to course-level outcomes. It then computes an assessment of both course-level and program-level outcomes based on these mappings.

An objection to grade-based course-level outcomes has been noted by ABET¹. It is desired that course-level outcomes be assessed independent of a final grade for a course. At issue is the accuracy to which a single grade may be applied to a number of course-level outcomes. In our methodology we do not assess an entire course by a single final grade. Our software selects individual Moodle gradebook items to perform the assessment. While this is an improvement, it is sometimes the case that multiple course-level outcomes are assessed by a single gradebook entry. Thus, it still may not provide enough granularity in assessment.

To validate our approach, the ACAT software has been updated to accept Moodle's course-level outcomes. Our school has run an experiment in which a sampling of courses were evaluated using both gradebook entries and independent assessment of course-level outcomes using Moodle's outcomes. In this paper, we will report on these findings and the correlation between measuring a few course-level outcomes per gradebook item and the independent Moodle-based assessment.

p Course Outcomes To GradeBook			
ACAT	Map Co	urse Outcomes To Gradebook	
	Select Class		N
		CS203L-A Soph Softwr Engr Lab I - Fall 2014	13
	Select Outcome	CS203L-A Soph Softwr Engr Lab I - Fall 2015 CS204L-A Soph SE Lab II - Spring 2015	
		CS204L-A Soph Softwr Engr Lab II - Spring 2016	
		CS208-A Intro Web Design & Development - Fall 2014	
		CS209 Advanced Web Design and Development- Template	
Save Mappings		CS219-A Compter Architecture 1 - Fall 2015	
		CS229-A 2D Game Programming - Spring 2015	
		CS203L-A Junior Softwr Engr Lab L - Fall 2015	
Gradebo	ok to Course Outcon	CS361-A Softwr/Operating Sys - Fall 2015	
		CS409-A 3D Game Programming - Spring 2015	
		CS409-A 3D Game Programming - Spring 2016	
		CS411-A Artificial Intelligence - Spring 2015	
		CS411-A Artificial Intelligence - Spring 2016	
		CS427-A Computer Graphics - Fall 2014	
		CS427-A Computer Graphics - Fall 2015	
		EG110-A-B Engineering Design I - Fall 2014	
		EG112-A-B Engineering Design II - Spring 2015	
		EG201-A Fluid Mechanics - Spring 2015	
		EG202-A Mechanics of Materials I - Spring 2015	
		EG203-A Dynamics - Spring 2014	
		EG203-A Dynamics - Spring 2015	
		EG208-A Material Science - Fall 2014	
		EG208-B Material Science - Fall 2014	

Figure 1. Screen shot showing the instructor's courses and the list of approved course outcomes for ease and consistency of assigning.

ACAT Software

The Learning Management System (LMS) used by the author's institution is the open source Moodle² LMS. It allows external programs to access its database (e.g., grade book data).

The Automated Course Assessment Tool (ACAT)³ assessment software has been developed at Daniel Webster College for the purpose of assisting end of semester determination of course-level outcomes and automatic generation of program-level outcomes. Briefly, ACAT maps Moodle gradebook entries to pre-defined course-level outcomes. After logging in, the user

selects the Define Outcomes menu option.. This will display a window with all the courses the professor is authorized to see. The course instructor selects a course for mapping through a graphical user interface as shown in Figure 1. The instructor is presented only with courses he/she is an approved instructor for.



Figure 2. Screen shot showing the Moodle gradebook mappings for a specific course outcome.

Once the course is selected, a dropdown list of course outcomes is automatically as shown in Figure 2. Once an outcome is selected, a table is automatically generated that contains a list of all the Moodle gradebook items for the particular course. The first column is then used to select the specific outcomes for the assessment. Each assessment can be weighted. The third column provides a grade weighting factor, and the fourth column provides a rubric weighting factor. An instructor needs only to select the appropriate checkbox items for each of the course outcomes. After the instructor saves the mappings, both course outcomes and program outcomes are automatically generated.

Course outcomes must have been previously entered by a Dean or Administrator. The software string-matches the Moodle course-name entry. If no match is found, the software informs the user the course is not available in the database. If it is successfully identified, an instance of the course is created automatically and a database is populated with the currently approved course outcomes. If outcomes change from semester-to-semester, the database course instance contains the historical outcomes that were in effect at the time the course was offered. Having unique identifiers for all course outcomes allows year-over-year comparisons, even if some outcomes have changed.



Course Outcomes Matrix

Selected Class Artificial Intelligence

Outcomes		Performance Indicators		Weight	Meets	Partially Meets	Fails To Meet	Class Average	Weighted Outcome Average	
CS_411_02: Demonstrate Unity skills by implementing AI algorithms using built-in Unity features and Rain	Group Assignment. Behavior Trees. O Group Assignment. Behavior Trees. D Group Assignment Pairs Programmi Group Final Project. Due Wed April 2 Group Soccer FM. Due Hriday Jan 3 Homework: RAIN Behavior Trees. D Homework: Waypoints. Due Wed Ma Individual Project - Slot Machine. Du	Group Grade. Due Wed April 8t ng due Friday Fe 19 at 11:55PM D at 11:00AM ue Friday March 3 arch 4 at 11:00AM e Wednesday Fe	h at 11:00AM b 27 at 11:00 20 at 11:00AM δ 11 at 11:00AM	0.13 0.13 0.13 0.13 0.13 0.13 0.13 0.13	100.00 (2 / 0.40) 100.00 (2 / 0.40) 100.00 (2 / 0.40) 88.40 (5 / 1.00) 100.00 (5 / 1.00) 100.00 (4 / 0.80) 100.00 (5 / 1.00) 91.00 (3 / 0.60)	53.00 (3 / 0.60) 53.00 (3 / 0.60) 60.00 (1 / 0.20)	45.00 (3 / 0.60) 0.00 (1 / 0.20) 48.00 (1 / 0.20)	71.80% 71.80% 67.00% 88.40% 100.00% 80.00% 100.00% 76.20%	81.90	
	Weighted % Students				3.5 / 70.0%	0.9 / 17.5%	0.6 / 12.50%			
CS_411_03: Explain concepts of intelligence, cognition, personality and their measurability using Turing/ Winograd tests	Final Exam - May 1st 10:30 AM Homework: Can Machines Think? Du Homework: Turing Tests. Due Friday	e Wed Jan 21 at 1/16 11:00AM	11:00AM	0.33 0.33 0.33	88.09 (5 / 1.00) 100.00 (5 / 1.00) 100.00 (4 / 0.80)		0.00 (1 / 0.20)	88.09% 100.00% 80.00%	89.36	
CC 411 04 Decision and a back	Weighted % Students			0.33	4.7 / 93.3%		0.3 / 6.6/%	00.009/	0316	-
cS_411_04: Design neural networks and explain their application domains	Group Final Exam - May 1st 10:30 AM Group Final Project. Due Wed April 2 Homework: Neural Networks. Due Fr	9 at 11:55PM iday April 10 at :	1:00AM	0.33 0.33 0.33	88.09 (5 / 1.00) 88.40 (5 / 1.00) 100.00 (5 / 1.00)			88.40% 100.00%	92.10	
	Weighted % Students				5.0 / 100.0%					
CS_411_05: Practice graph searching techniques such as A* and navigation meshes	Final Exam - May 1st 10:30 AM Homework: Book Chapter /, A [*] Searc Homework: Book Chapter 8. Navigat Homework: Waypoints. Due Wed Ma	th. Due Friday M ion Meshes. Due irch 4 at 11:00AM	arch 6 at 11:00AM Wed March 18 at 11:00AM A	0.25 0.25 0.25 0.25	88.09 (5 / 1.00) 100.00 (4 / 0.80) 100.00 (4 / 0.80) 100.00 (5 / 1.00)		0.00 (1 / 0.20) 0.00 (1 / 0.20)	88.09% 80.00% 80.00% 100.00%	87.02	
	Weighted % Students				4.5 / 90.0%		0.5 / 10.00%			
CS_411_06: Create AI behaviors using FSM's and Behavior Trees	Final Exam - May 1st 10:30 AM Group Assignment: Behavior Trees. D Group Assignment: Pairs Programmi Group Soccer FSM. Due Friday Jan 3 Homework: RAIN Behavior Trees. Du Homework: Finite State Machines. Du	Due Wed April 8t ng due Friday Fe D at 11:00AM ue Friday March 3 ue Friday Jan 23	h at 11:00AM b 27 at 11:00 20 at 11:00AM at 11:00AM	0.17 0.17 0.17 0.17 0.17 0.17 0.17	88.09 (5 / 1.00) 100.00 (2 / 0.40) 100.00 (2 / 0.40) 100.00 (5 / 1.00) 100.00 (4 / 0.80) 100.00 (4 / 0.80)	53.00 (3 / 0.60)	45.00 (3 / 0.60) 0.00 (1 / 0.20) 0.00 (1 / 0.20)	88.09% 71.80% 67.00% 100.00% 80.00% 80.00%	81.15	H
	Weighted % Students				3.7 / 73.3%	0.5 / 10.0%	0.8 / 16.67%			
CS_411_07: Implement algorithms used in "Sensing" the environment	Final Exam - May 1st 10:30 AM Group Assignment: Pairs Programmin Homework: RAIN Behavior Trees. Du Homework: Book Chapt 4. Sensors. d	ng due Friday Fe Je Friday March I Jue Friday Feb 13	b 27 at 11:00 20 at 11:00AM 3 at 11:00AM	0.25 0.25 0.25 0.25	88.09 (5 / 1.00) 100.00 (2 / 0.40) 100.00 (4 / 0.80) 100.00 (5 / 1.00)		45.00 (3 / 0.60) 0.00 (1 / 0.20)	88.09% 67.00% 80.00% 100.00%	83.77	
	Weighted % Students				4.0 / 80.0%		1.0 / 20.00%			
CS_411_08: Describe how knowledge can be represented	CS_411_Knowledge: Learn how know CS_411_Knowledge: Learn how know Final Exam - May 1st 10:30 AM	iledge can be rej iledge can be rej	presented (exams and assignments) presented (exams and assignments)	0.33 0.33 0.33	100.00 (5 / 1.00) 100.00 (2 / 0.40) 88.09 (5 / 1.00)		33.33 (3 / 0.60)	100.00% 60.00% 88.09%	82.70	
	Weighted % Students				4.0 / 80.0%		1.0 / 20.00%			
CS_411_09: Explain the history of AI systems	Final Exam - May 1st 10:30 AM Homework: Turing Tests. Due Friday Reynolds Flocking Paper. Due Wed F	1/16 11:00AM eb 18 at 11:00AI	N	0.33 0.33 0.33	88.09 (5 / 1.00) 100.00 (4 / 0.80) 100.00 (4 / 0.80)		0.00 (1 / 0.20) 0.00 (1 / 0.20)	88.09% 80.00% 80.00%	82.70	
	Weighted % Students				4.3 / 86.7%		0.7 / 13.33%			
CS_411_10: Argue and discuss the ethics of AI and issues associated with machines that are more capable	Final Exam - May 1st 10:30 AM Homework. Philosophy of AI. Due Fri	day April 29 at 1	1:00AM	0.50 0.50	88.09 (5 / 1.00) 100.00 (1 / 0.20)		0.00 (4 / 0.80)	88.09% 20.00%	54.04	
than humans	Weighted % Students				3.0 / 60.0%		2.0 / 40.00%			

Figure 3. Screen shot showing the generated course outcomes.

As shown in Figure 3, once a course has been mapped, the software automatically generates a table that summarizes the percentage of students who met, partially met, or failed to meet each course outcome. The first column lists each outcome. Due to limited screen space, only outcomes 2 through 10 are shown. The second column displays the performance indicators (i.e., Moodle gradebook items) used to evaluate the course outcome. For example, outcome 4 has three indicators. The program normalizes the weights based on instructor inputs during mapping. Since each performance indicator was equally weighted, each contributes one- third of the final evaluation. Columns 4 through 6 show the average grade, number of students, and percent of total students who Meets, Partially Meets, and Fails to Meet the performance indicator. As an example, outcome 2 with performance indicator Individual Project - Slot Machine shows that 3 students (3 out of 5, or 60%) achieved Meets objectives and their average score was 91%. One student (20%) partially meets with a score of 60%. One student also Fails to Meet with a score of 48%. The seventh column gives the average score for a specific performance indicator for all students. Continuing with the slot machine example, the average grade of all students on this indicator was 76.2%. The last column gives the weighted average of all performance indicators for a specific outcome. For outcome 2, that is 81.9%. Finally, across the bottom of each row, the weighted average per outcome is given. Thus, the weighted percent of students who Meets outcome 2 is 3.5 or 70% of the class. The number of students who partially meet outcome two is 0.9 students, or 17.5%. The weighted number of students who Fails to Meet is 0.6 students, or 12.5%.

Program-level outcomes are also computed by ACAT using the weighted percent of students calculated in the course-level outcomes. No further instructor input is necessary. Program-level performance indicators are identified and composed from course-level outcomes. Program-level outcomes are composed of a number of performance indicators. These mappings are defined by the Deans or Institutions. Once course-level outcomes are computed, the software uses them to compute the Program-level outcomes³.



Figure 4. Screen shot showing Moodle course outcomes for CS411 Artificial Intelligence, Spring 2015.

Moodle Assessment

Moodle also has a built-in course assessment. As shown in Figure 4, course outcomes are first entered into the Moodle database for each course. In this case they are the same outcomes that we use in the automated system.



Figure 5. Screen shot showing assessment of Moodle course outcomes during grading.

We then set up a grading rubric in Moodle for evaluating course-level outcomes. As shown in Figure 5, our institution uses a No Outcome (0) / Fails To Meet (1) / Partially Meets (2) / Meets

for Outcome Assessment (3) Rubric for Moodle. In ACAT a student meets objectives if his/her score on the activity is 70% or better. He partially meets the outcome with a score of 50% to 69%. Below that, the student has failed to meet the objective.

Once Moodle is set up, outcomes are then assigned to Moodle activities (Exams, Assignments, etc.) by selecting the appropriate check boxes for each activity. When an instructor grades an activity, he/she simultaneously and independently assesses the outcomes. This is a manual process in that the instructor provides a score for the activity and a separate assessment of the outcome. This decouples an aggregated grade from the outcome assessment. In the case of a Moodle exam that is automatically graded, this places an additional burden on the instructor due to the manual outcome assessment process.

CS_411_Turing	Partially Meets 50%-69% (2.87)	Yes	Homework: Turing Tests. Due Friday 1/16 11:00AM	Partially Meets 50%-69% (2.6)	5
			Homework: Can Machines Think? Due Wed Jan 21 at 11:00AM	Meets 70%-100% (3)	5
			Final Exam - May 1st 10:30 AM	Meets 70%-100% (3)	5
CS_411_Neural_Nets	Meets 70%-100% (3)	Yes	Homework: Neural Networks. Due Friday April 10 at 11:00AM	Meets 70%-100% (3)	5
			Group Final Project. Due Wed April 29 at 11:55PM	Meets 70%-100% (3)	5
			Final Exam - May 1st 10:30 AM	Meets 70%-100% (3)	5
CS_411_Graph_Search	Partially Meets 50%-69% (2.9)	Yes	Homework: Waypoints. Due Wed March 4 at 11:00AM	Meets 70%-100% (3)	5
			Homework: Book Chapter 7. A* Search. Due Friday March 6 at 11:00AM	Meets 70%-100% (3)	4
			Homework: Book Chapter 8. Navigation Meshes. Due Wed March 18 at 11:00AM	Partially Meets 50%-69% (2.6)	5
			Final Exam - May 1st 10:30 AM	Meets 70%-100% (3)	5

Figure 6. Screen shot showing a partial Moodle course outcomes report for CS411 Artificial Intelligence, Spring 2015.

At the end of the course, Moodle automatically generates an Outcomes report, as shown in Figure 6. In this example we show a subset of three outcomes used in the course. The first column lists the outcome name (e.g. CS_411_Neural_Nets). The second column gives the course average. The third column provides information as to whether the outcome can be used across all courses or is local to a particular course. Global Moodle outcomes are what we refer to as

Standard Outcomes in ACAT. The fourth column lists the activity that was used for assessment. Of note is that all three outcomes shown in Figure 6 use the Final Exam activity to assess each outcome. The fifth column provides the average assessment of all participants for that activity. In the first row the average of 2.6 is computed from 4 students meeting and 1 student failing to meet the outcomes ((4*3 + 1*1)/5 = 2.6). The overall average in column 2 is the average of all activities ((2.6 + 3 + 3)/3 = 2.87). In Moodle it is not possible to assign a weight to an outcome. The last column identifies the number of students that participated in the activity.

A limitation of the current Moodle system is that outcomes are assigned to the entire Quiz activity and not individual questions within a quiz. Manual assessment of the outcome is a burden to instructors. At the time of this writing there are proposals to assign outcomes to individual quiz questions. One commercial branch of Moodle supports this capability⁴. This allows automatic assessment of Quiz outcomes.

Experimental Process and Results

To evaluate the effectiveness of ACAT gradebook assessment of outcomes versus manual assessment, an initial study was performed during the Spring 2015 semester. Four courses were selected for both manual Moodle evaluation and automated ACAT evaluation. Two courses were Laboratory group-based learning using CATME⁵ peer assessment. Manual assessment was based on the individual grade computed using the CATME contribution factor. The first class, Game Design and Development Capstone Project (GD426), had a 1-to-1 mapping between activities and gradebook entries. It was therefore expected that manual and automated outcome measurements would match exactly. The second class, Sophomore Software Engineering Lab II (CS204L), is similar to GD426 except that one Moodle Quiz activity on software engineering design patterns was administered. However, since this quiz measured only a single course outcome, it was also expected to have identical manual and automated assessments.

Two instructional courses were also selected for dual evaluation. The first was 3D Game Programming (CS409). The second was Artificial Intelligence (CS411). These courses had traditional homework assignments that generally evaluated one outcome. However, they both had exams or projects where multiple outcomes were measured both manually and using the

automated ACAT software. These courses also had group activities where CATME was used to assess individual performance and outcomes determined consistent with the Laboratory courses. In all cases except one outcome, the instructor-based outcome assessment was identical to the ACAT automated assessment.

Standard used (no remove)

CS_409_C#: Improve C# programming skills using the Unity game ... CS_409_Unity: Improve Unity skills by using the 3D built-in Unity ... CS_409_3D_Basic: Describe and use basic techniques in 3D gaming, ... CS_409_Colliders: Learn to use 3D colliders and perform actions ... CS_409_Character_Controllers: Learn to use 3D character controllers... CS_409_Teamwork: Develop software in teams to meet project ...

Figure 7. Screen shot showing 3D Game Programming (CS409) standard outcomes

CS411 had five students enrolled in the class. With 10 outcomes to measure, including a final exam that measured multiple outcomes, ACAT and the manual assessment were equivalent. CS409 is the only class where ACAT and manual assessment diverged. Fourteen students were enrolled. Figure 7 shows the 6 outcomes being assessed. One particular indicator, a Group Project, measured all 6 outcomes. Of the 6 outcomes, 3 of them matched the ACAT assessment. However, an instructor evaluation of each outcome showed two of the fourteen students failed to meet 3 outcomes. Specifically, C# programming, Unity, and Basic 3D techniques were manually adjudged to have not been met for two students, even though they had achieved a passing grade for the project.

In summary, the study considered 34 students, 27 outcomes, and 107 indicators to measure the outcomes. A single indicator affecting two students caused three outcomes to be adjudged incorrectly.

Conclusions and discussion

Since ACAT uses the final individual score of the indicator to assess all outcomes, it is possible for divergences to arise in comparison with manual assessment. The largest class with 14 students identified one such divergence. This also suggests that it may be desirable to the extent possible to design indicators that don't attempt to measure large numbers of outcomes. This is analogous to using a single grade to assess outcomes.

An observation is that the Exams, which also measured multiple outcomes, did not show any divergences. This may be due to a small sample size. CS409 did not have a final exam. Notably, ACAT can also use Moodle Outcomes directly because they appear as gradebook entries. Moodle has a roadmap to allow outcomes to be assigned to individual Quiz questions. When this feature is implemented, it will be possible in many cases to automatically assess student outcomes with no instructor mappings required. A further enhancement for non-Quiz outcome assessment would be to allow an outcome to be assigned to a Moodle grading rubric. With this addition, the instructor would automatically assess the outcome when he/she scores the activity using the rubric.

In courses not included in this study, both projects and exams have been broken into multiple grade items to enable the assessment of multiple outcomes. For example, in Engineering Design I (EG110), the class project has separate grade items for communication, mechanical design, and control system aspects of the project. In Instrumentations and Measurements (EG207), exams are split into grades for programming, sensor usage, and statistics. In both cases, the single aggregate grade would be insufficient for assessing all of the course outcomes addressed by the activity as seen in CS411. With the divided grades, separate assessment is easy to automate and should avoid the mismatch of assessment seen in this study.

In summary, in all but one case the current gradebook assessment methodology matches the manual Moodle assessment. The small sample size requires further investigation. The case that did not match was analogous to using a single grade to assess all outcomes. Future work should attempt to identify what granularity is acceptable between one activity per outcome and one activity for all outcomes.

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