RESEARCH

Associating Student Performance in Pharmacy Practice Didactic and Skills-Based Courses With Advanced Pharmacy Practice Experiences

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Objective. To determine the association between pharmacy practice didactic course examinations and performance-based assessments with students' performance during their advanced pharmacy practice experiences (APPEs).

Methods. This retrospective analysis included data from the graduating classes of 2018 to 2020. Students were coded as APPE poor performers (final course grade < 83%) or acceptable performers. Assessments in pharmacy practice didactic and skills-based courses in students' second and third years were included in the analysis, with thresholds correlating to grade cutoffs. The association between poor performance mean examination scores and performance-based assessments with APPE performance was calculated.

Results. Of the 403 graduates, analysis sample sizes ranged from 254 to 403. There were 49 students (12%) who met the criteria for poor performance in the APPE year. When comparing pharmacy practice didactic course performance to APPE poor performance, the proportion of mean examination scores that were <83% for six of the seven pharmacy practice didactic courses was significant; five of the seven mean examination scores were significant at the <78% threshold. Performance-based assessments that were significantly associated with APPE poor performance often required critical thinking.

Conclusion. A gap in identification of students with APPE poor performance who did not fail a didactic course was demonstrated. Specifically, this finding suggests that pre-APPE curriculum should focus on assessments that include critical thinking. These methods could be used by other pharmacy programs to find components of their curricula that help identify students who need additional support prior to the APPE year.

Keywords: advanced pharmacy practice experience, skills-based assessment, academic performance, pharmacy practice

INTRODUCTION

It is crucial for schools and colleges of pharmacy to promote student success in advanced pharmacy practice experiences (APPEs) by monitoring student performance in the pre-APPE curriculum and providing remediation as needed.¹ When students require remediation prior to or during APPEs, that remediation requires intensive time and resources.^{2,3} Determining a process that guides remediation decisions could help programs in planning for and appropriately allocating limited resources. This begins with identifying factors within the pre-APPE curriculum that are associated with student performance during APPEs.

Thus far, evaluations that have examined performance in the pre-APPE curriculum have centered on entrance demographics and end-of-semester outcomes, such as a failed course or examination, and their relationships to APPE readiness or performance. Call and colleagues examined a range of factors, including grade point average (GPA), course grades, performance-based assessment and examination scores, professionalism issues on introductory pharmacy practice experiences (IPPEs), and academic honor code violations.⁴ Nyman and colleagues analyzed the predictive value of student demographics, along with admission and didactic performance measures.⁵ Both of these studies found that two factors correlate to APPE readiness more than others: aggregate pharmacy education knowledge-based variables and the entering age of students (more than skills-based variables, admission measures, or other student demographics).^{4,5}

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Medical educators have also examined indicators that are predictive of medical student performance. Efforts have focused on four general categories, including demographics (eg, gender), other background factors (eg, college major), performance/aptitude (eg, medical college admission test scores), and noncognitive factors (eg, curiosity).⁶⁻¹⁰ The pass-fail grading system used by many medical schools makes it challenging to identify performance predictors within preclerkship curricula. An evaluation at Harvard Medical School examined the association between frequency of first-year medical students' performance in the bottom quartile on major examinations and subsequent academic and clinical performance. The number of appearances in the bottom quartile in year one was associated with poor performance on knowledge-based assessments and poor clinical performance during experiential rotations.¹¹

The literature has provided mixed results on the association between performance-based assessments within skills-based courses, which are fundamental components of Doctor of Pharmacy (PharmD) curricula, and APPE readiness. Additionally, despite these previous evaluations, some students perform poorly during their APPE years and are not identified in the pre-APPE curriculum. This current evaluation aims to determine the association between pharmacy practice didactic course examinations and performance-based assessments with students' performance during their APPEs.

METHODS

The University of Wisconsin-Madison School of Pharmacy is a four-year PharmD program. The first three years of the program include didactic coursework, skillbased coursework, and IPPEs. Throughout students' second (P2) and third (P3) years in the program, students are required to take seven didactic pharmacy practice courses, including pharmacokinetics, pharmacotherapy (four courses), nonprescription medications, and drug literature evaluation. Across the didactic courses, student assessments consist of examinations and lower-stakes assignments, such as problem sets and quizzes. The pharmacy practice skills-based course series beginning in the second year of the program includes the Integrated Pharmacotherapy Skills courses (I-IV). The skills-based courses prepare students for APPEs through practice and skill development, along with formative and summative assessment of pharmacy practice skills through simulated patient and provider encounters.¹² Each of the Integrated Pharmacotherapy Skills courses consist of approximately eight one-hour discussions and eight three-hour laboratory sessions spaced throughout the semester. For this analysis,

didactic and skills-based courses related to the pharmacy practice sequence were included. The courses and variables are further described in Appendix 1.¹³⁻¹⁵ Briefly, for this analysis, unweighted mean examination scores were used as the primary indicator for didactic course performance. During the fourth year of the program (the APPE year), students are expected to care for patients in various clinical settings, primarily across Wisconsin, with supervision from a licensed pharmacist. The APPE year is made up of the four required core APPEs per the 2016 Standards (ie, acute care, ambulatory care, community pharmacy, and health-system pharmacy) and three to four elective rotations, which are each six weeks in duration.

This evaluation is a retrospective analysis of data from the graduating classes of 2018, 2019, and 2020. Data were extracted from the University of Wisconsin-Madison's learning management system and an established online clerkship database. The last APPE for the graduating class of 2020 was dropped from this analysis, given the changes to rotations and stress associated with the onset of the COVID-19 pandemic. In order to preserve the greatest number of students, all students were included in the analysis, regardless of progression irregularities. Due to progression and the mixed availability of data (due to a campus change in learning management systems and curricular changes), there were several instances of missing data, including one semester's data in one course. While all students were retained in the analysis, there was no imputation for missing data.

To prepare the data for analysis, the student database with final APPE scores was coded to differentiate APPE poor performers from APPE acceptable performers. In order to better identify students at risk of poor performance, higher mean examination-score thresholds of <78% and < 83% were used as opposed to using a traditional definition of failure. Students scoring < 83% were coded as poor performers. All other students (ie, those who scored \geq 83%) were considered acceptable performers. Similarly, data were coded to identify poor performers in seven didactic courses and four skills-based courses (Appendix 1). For didactic courses using mean examination scores, two thresholds of < 83% and < 78% were used to define poor performers, as these are the lower thresholds used by the campus for a grade of B (ie, GPA of 3.0) and BC (ie, GPA of 2.5), respectively (ie, with < 83%, a student would earn less than a B and be considered a poor performer for this analysis). For performance-based assessments, two thresholds of <78% and <70% were used, as these are the cutoffs used by the campus for a BC and C (ie, GPA of 2.0), respectively. Compared to the didactic cutoffs, the thresholds for performance-based assessments were lowered to allow for better identification of students who were struggling and for greater generalizability to institutions who use a pass-fail grading system for higher-stakes performance-based examinations. Students who received less than a C in at least one didactic course were also identified as poor performers.

Descriptive statistics were calculated. Fisher exact tests were used to evaluate the relationship between poor performance in didactic courses and performance-based assessments with APPE poor performers, as both the independent and dependent variables were binomial. A subanalysis using the Fisher exact test was performed to understand the relationship between the number of didactic courses in which a student performed poorly on mean examination scores and APPE poor performance. A sensitivity analysis was performed using logistic regression, including all didactic courses for the outcome of APPE poor performance. All data management and analyses were conducted using StataSE 16 (StataCorp LLC). The University of Wisconsin-Madison Educational Institutional Review Board certified this work as a quality assurance project.

RESULTS

For the graduating classes of 2018, 2019, and 2020, 403 students graduated from the program. However, due to progression and data availability, sample sizes for individual analyses ranged from 254 to 403. There were 49 students (12%) who met the criteria for poor performance in the APPE year. Of those 49 students, 38 students performed poorly in one APPE, six performed poorly in two APPEs, four performed poorly in three APPEs, and one performed poorly in five APPEs. There were six unique students who failed one APPE during their fourth year. Over the three graduating years, there were 18 APPE rotations where students received a grade of <83% in the graduating class of 2018, 20 in 2019, and 29 in 2020. During this period, all students who began APPEs graduated.

When comparing didactic course mean examination scores to APPE performance, nine APPE poor performers (18.4%) and 21 APPE acceptable performers (6%) earned less than a C in any didactic course (p=.006). At both the <83% and <78% thresholds, there was a significant difference between the number of pharmacy practice didactic mean examination scores on which students performed poorly and performing poorly in APPEs (Figure 1).

When reviewing the relationship between didactic mean examination scores and APPE performance, the proportion of didactic poor performers was significantly higher among APPE poor performers compared to APPE acceptable performers (Tables 1 and 2). This was consistent at both thresholds, with six of the seven pharmacy practice didactic courses at the <83% threshold and five of the seven courses at the <78% threshold. The sensitivity logistic regression analysis confirmed the primary analysis in that the same six courses were significant and maintained a positive relationship between didactic and APPE performance (ie, students with a <83% mean examination score were more likely to perform poorly in APPEs).

Across the skills-based courses, each semester of the skills-based curriculum included performance-based assessments that were significant as well as assessments that were not significant (Tables 3 and 4). Assessments that tended to be significant required critical clinical thinking by the student. Additionally, assessments were more likely to be significant the first time a skill was summatively assessed, while on subsequent similar assessments, students tended to perform without differentiation in the APPE year.

DISCUSSION

This evaluation found that students may be identified for future poor performance on APPEs by assessing multiple markers of performance within didactic and skillsbased courses. Specifically, this analysis highlights that there are opportunities to identify students at risk of poor performance on APPEs in the absence of failing a course, suggesting that there has been a gap in identifying these students. In order to better identify students at risk of poor performance in an APPE, we used higher mean examinationscore thresholds of <78% and <83%. The risk of APPE poor performance for students in this new score range was greater when students repeatedly scored between 70% and 83%. We also found that poor didactic performance was associated with APPE poor performance, strengthening this known relationship.^{4,5} By using a higher threshold, additional at-risk students could be easily identified through early warning and intervention systems. Pharmacy programs could intervene earlier to help at-risk students address deficits in knowledge and skills in a consistent and coordinated manner.

Skills-based items that correlated to APPE performance were related to the application of content and critical thinking. Examples of this include identification and resolution of drug-related problems and clinical documentation, as compared to communication and physical assessment skills (ie, blood pressure and heart rate measurement), which do not require the same level of critical thinking. This illustrates the importance of assessment using direct observation of skills, and the importance of these activities in the curriculum. This finding is inconsistent with the conclusions of Call and colleagues, as they recommended against the use of performance-based assessments as a determinant of progression, as they did not find an association





Figure 1. Number of poor didactic examination means by APPE performance. The numbers 0-7 on the x-axes indicate the number of courses with mean examination scores less than the defined threshold. The numbers above the bar chart indicate percentage of students. Abbreviations: APPE=advanced pharmacy practice experience.

between skills practicum failure and poor performance on APPEs.⁴

As compared to previously published literature, we evaluated variables within pharmacy practice courses at a more granular level, particularly within skills-based courses, and we were able to determine that some activities that were significant for APPE performance in earlier skills-based courses were no longer significant in later courses.⁴ This suggests that the students who struggle with critical thinking and the application of new skills in the pre-APPE curriculum may struggle when progressing to the APPE year, when they are expected to perform skills in a new environment with potentially new disease states and higher patient complexity, and with higher stress from patient care implications. Additionally, the discrepancy between this work and Call and colleagues may be due to how performance-based assessments were scored and which assessments were evaluated in this analysis. Call and colleagues used a pass-fail grading scheme, while our evaluation used point-based grading, which allowed for evaluation at specific and higher thresholds (<78% and <70%).⁴ By using a point-based system, applying higher performance thresholds, and assessing multiple skills within a semester, there is opportunity to identify students at risk of poor performance on APPEs, beyond their performance on a single summative assessment.

As required by accreditation standards, our institution's early warning and intervention policy allows faculty to identify and address academic deficiencies on a course level to promote successful student completion of a course.¹ The results of this evaluation suggest these current early warning policies could be refined to look beyond

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Course/item	N	Proportion of didactic PP <83%, No. (%)	Frequency of didactic PP and APPE PP (n=49), No. (%)	Frequency of didactic PP and APPE AP (n=351), No. (%)	<i>p</i> value	Frequency of didactic PP and APPE PP compared to overall didactic PP, No. (%)	Frequency of didactic AP and APPE PP compared to overall didactic AP, No. (%)
PK examinations	396	241 (61)	38 (78)	203 (58)	.001	38 (16)	11 (7)
Therapy I examinations	396	195 (49)	31 (63)	164 (47)	.009	31 (16)	18 (9)
Therapy II examinations	397	141 (36)	22 (45)	119 (34)	.064	22 (16)	27 (11)
Drug Literature examination	398	132 (33)	27 (55)	105 (30)	<.001	27 (20)	22 (8)
Nonprescription examinations	397	34 (9)	12 (24)	22 (6)	<.001	12 (35)	37 (10)
Therapy III examinations	394	112 (28)	23 (47)	89 (25)	.001	23 (21)	26 (9)
Therapy IV examinations	403	145 (36)	28 (57)	117 (33)	.001	28 (19)	21 (8)

Table 1. Relationship Between Didactic Mean Examination Scores and APPE Poor Performers at <83% Threshold

course-level student deficiencies and track student performance on a variety of formative and summative evaluations longitudinally across the curriculum. Other schools and colleges of pharmacy can apply similar analyses to determine specific assessments that correlate to their student APPE performance, with the goal of incorporating the assessments they identify as predictive into their early warning systems. However, other programs will need to identify meaningful and useful thresholds for their courses.

These items can be shared with multiple stakeholders, with the goal of improving identification of students who

may benefit from early intervention. For example, instructors may improve student outcomes by focusing resources on support and remediation for students with poor performance on those assessments that correlate with poor performance on APPEs. Student advisors and course coordinators can share their findings with students to encourage student self-reflection, metacognition, and improved performance. Curriculum and assessment committees may wish to undertake curricular mapping efforts and annual surveying of the faculty to ensure identified assessments correlated with APPE poor performance are maintained within a course over time.

Table 2.	Relationship	Between	Didactic	Mean	Examination	Scores an	d APPE	Poor	Performers at	<78%	Threshold

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Course/item	N	Proportion of didactic PP <78%, No. (%)	Frequency of didactic PP and APPE PP (n=49), No. (%)	Frequency of didactic PP and APPE AP (n=351), No. (%)	<i>p</i> value	Frequency of didactic PP within APPE PP compared to overall didactic PP, No. (%)	Frequency of didactic AP within APPE PP compared to overall didactic AP, No. (%)
PK examinations	396	147 (37)	24 (49)	123 (35)	.025	24 (16)	25 (10)
Therapy I examinations	396	93 (23)	17 (35)	76 (22)	.022	17 (18)	32 (11)
Therapy II examinations	397	49 (12)	9 (18)	40 (11)	.11	9 (18)	40 (11)
Drug Literature examination	398	54 (14)	10 (20)	44 (13)	.085	10 (19)	39 (11)
Nonprescription examinations	397	3 (1)	2 (4)	1 (0.3)	.002	2 (67)	47 (12)
Therapy III examinations	394	36 (9)	10 (20)	26 (7)	.003	10 (28)	39 (11)
Therapy IV examinations	403	62 (15)	14 (29)	48 (14)	.006	14 (23)	35 (10)

Abbreviations: APPE=advanced pharmacy practice experience; PP=poor performer; AP=acceptable performer; PK=pharmacokinetics; Therapy I-IV=Pharmacotherapy I-IV courses; APPE PP=students who scored <83% during an APPE.

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Course/item	Proportion of skills PP <78% No. (%)	Frequency of skills PP and APPE PP, No. 1%)	Frequency of skills PP and APPE AP (n=350), No (%)	u value	Frequency of skills PP and APPE PP compared to overall skills PP No. (%)	Frequency of skills AP and APPE PP compared to overall skills AP No (%)
Fall P2 vear (PP $n=49$ )				Anna d		
Skills I PBE consult, communication	2 (0.5)	1 (2)	1(0.3)	.23	1 (50)	48 (12)
Skills I PBE consult, content	71 (18)	16 (33)	55 (16)	.005	16 (23)	33 (10)
Skills I PBE PPCP activity	91 (23)	18 (37)	73 (21)	.016	18 (20)	31 (10)
Spring P2 year (PP n=47)						
Skills II PBE consult, communication	4 (1)	0 (0)	4 (1)	1.0	0 (0)	47 (12)
Skills II PBE consult, content	37 (9)	8 (17)	29 (8)	.061	8 (22)	39 (11)
Skills II PBE SOAP note	103 (26)	16 (34)	87 (25)	.21	16 (16)	31 (11)
Skills II BP/HR	35 (9)	5 (10)	30 (9)	.59	5 (14)	42 (12)
Fall P3 year ^a (PP n=37)						
Skills III PBE patient case presentation to preceptor, content	88 (22)	16 (43)	72 (21)	.13	16 (18)	21 (7)
Skills III PBE patient case presentation to preceptor, communication	30 (8)	9 (24)	21 (6)	600.	9 (30)	28 (8)
Skills III PBE verbal provider communication (SBAR)	39 (10)	11(30)	28 (8)	600.	11 (28)	26 (7)
Skills III women's health consult, content	78 (20)	15 (41)	63 (18)	.081	15 (19)	22 (7)
Skills III women's health consult, communication	69 (17)	9 (24)	60 (17)	1.0	9 (13)	28 (9)
Spring P3 year ^a (PP $n=37$ )						
Skills IV PBE patient interview	12 (3)	2 (5)	10 (3)	.65	2 (17)	35 (9)
Skills IV PBE SOAP note	4 (1)	0 (0)	4 (1)	1.0	0 (0)	37 (9)
Skills IV PBE patient case presentation to preceptor, content	40 (10)	10 (27)	30 (9)	.017	10 (25)	27 (8)
Skills IV PBE patient case presentation to preceptor, communication	50 (13)	10 (27)	40 (11)	.095	10 (20)	27 (8)
^a Missing graduating class of 2018; n=254 and n=32 APPE poor performe Abbreviations: P2=second year of pharmacy school; P3=third year of phar PBE=performance-based examination; PPCP=Pharmacists' Patient Care P background assessment recommendation; APPE PP=students who scored $<$	rs. rmacy school; APPE= Process; SOAP=subjec :83% during an APPE.	advanced pharmacy tive objective asses	practice experience sment plan; BP=bl	; PP=poor ood pressu	performer; AP=ao. :e; HR=heart rate;	ceptable performer; SBAR=subjective

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Course/item	Proportion of skills PP <70%, No. (%)	Frequency of skills PP and APPE PP, No. (%)	Frequency of skills PP and APPE AP (n=350), No. (%)	<i>p</i> value	Frequency of skills PP and APPE PP compared to overall skills PP, No. (%)	Frequency of skills AP and APPE PP compared to overall skills AP, No. (%)
Fall P2 year (PP n=49)						
Skills I PBE consult, communication	0 (0)	0 (0)	0 (0)	1.0	0 (0)	49 (12)
Skills I PBE consult, content	14 (4)	5 (10)	9 (3)	.018	5 (36)	44 (11)
Skills I PBE PPCP activity	42 (11)	11 (22)	31 (9)	600.	11 (26)	38 (11)
Spring P2 year (PP n=47)						
Skills II PBE consult, communication	1 (0.3)	0 (0)	1 (0.3)	1.0	0 (0)	47 (12)
Skills II PBE consult, content	3 (0.8)	1 (2)	2 (0.6)	.31	1 (33)	46 (12)
Skills II PBE SOAP note	37 (9)	9 (19)	28 (8)	.027	9 (24)	38 (11)
Skills II BP/HR	22 (6)	5 (11)	17 (5)	.16	5 (23)	42 (11)
Fall P3 year ^a (PP $n=37$ )						
Skills III PBE patient case presentation to	57 (14)	10 (27)	47 (13)	.38	10 (18)	27 (8)
preceptor, content						
Skills III PBE patient case presentation to preceptor, communication	0 (0)	0 (0)	0 (0)	N/A	0 (0)	37 (9)
Skills III PBE verbal provider communication (SBAR)	21 (5)	6 (16)	15 (4)	.046	6 (29)	31 (8)
Skills III women's health consult content	52 (13)	12 (32)	40 (11)	039	12 (23)	25 (7)
Skills III women's health consult, communication	25 (6)	3 (8)	22 (6)	1.0	3 (12)	34 (9)
Spring P3 year ^a (PP $n=37$ )	~	~				~
Skills IV PBE patient interview	3 (0.8)	0 (0)	3 (0.9)	1.0	0 (0)	37 (9)
Skills IV PBE SOAP note	1(0.3)	0 (0)	1(0.3)	1.0	0 (0)	37 (9)
Skills IV PBE patient case presentation to preceptor, content	12 (3)	3 (8)	9 (3)	.18	3 (25)	34 (9)
Skills IV PBE patient case presentation to	32 (8)	6 (16)	26 (7)	.26	6 (19)	31 (8)
preceptor, communication						
^a Missing graduating class of 2018; $n=254$ and $n=32$ APPE p	boor performers.	ool. ADDE				
ADDIEVIATIONS: $FZ = \text{second year of pnarmacy school; } FZ = \text{unit}$ DBF = nerformance-hased examination: $PPCP = \text{Pharmacrists}^2 P$	d year of pharmacy sch Patient Care Process: S(	001; APPE=auvanceu DAP=suhiective_ohiec	pnarmacy practice ext tive assessment nlan:	perience; FF=1 BP=blood m	oor periormer; Ar = a essure HR = heart rate	cceptable periormer; • SBAR=subjective
background assessment recommendation; APPE PP=students v	who scored <83% durit	of an APPE.	uve assessment pran,	nd nooro - re		where we have the second

There were several variables impacting student performance that we were unable to systematically evaluate. These include students' preferred learning styles, practice experience (eg, internships), mental or physical health challenges, fixed or growth mindset, resilience and grit, and professionalism. The underlying factors contributing to poor performance vary from student to student and may be multifaceted, complex, and interconnected, making them difficult to quantify. This provides an opportunity for pharmacy programs to monitor student performance holistically across the curriculum and identify underlying factors, both academic and nonacademic, for student poor performance. Other factors to explore with a student include their study methods, learning needs, and potential assessment accommodations.^{16,17} This evaluation also showed that students performing consistently in the BC/C range may perform reasonably well on APPEs, which may be due to a variable not measured or to the complexity of predicting performance. We did not assess student performance in pharmaceutical sciences or social and administrative sciences courses, because our project focused on pharmacy practice courses. It may be valuable to assess student performance across the entire

curriculum for a more holistic view. Future directions of this work include refinement of our current early warning and intervention policy, including the addition or removal of items. Monitoring the rate of APPE poor performers could substantiate the effectiveness of the tracking, interventions, and remediation. Additionally, assessment tools, rubrics, and weighting could be evaluated. Lastly, assessment of student self-efficacy of pharmacy practice skills could be used to triangulate the relationship between didactic scores and performance in practice.

#### CONCLUSION

This evaluation demonstrated a gap in the identification of students with APPE poor performance who did not fail a didactic course or performance-based assessment. These results could be used to facilitate student selfreflection and improve motivation to promote successful performance in APPEs. This process could also be used by other schools and colleges of pharmacy to identify crucial components within their curriculum in an effort to recognize students in need of additional support and remediation prior to the APPE year.

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Appendix 1.	. Pharmacy	Practice	Didactic	and	Skills-Based	Course	Descriptions	and	Related	Variable	Definitions
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Course Name	<b>Course Type</b>	Variable	Definition
Fall P2 year			
Pharmacokinetics (PK)	Lecture	PK examinations	Average of examination scores on pharmacokinetics
Pharmacotherapy I	Lecture	Therapy I examinations	Average of examinations on neuropsychology content (ie, migraine, epilepsy, etc)
Integrated Pharmacotherapy	Skills-based course	Skills I PBE consult, communication	PBE communication rubric score on one neuropsychology medication consult ¹³
Skills I		Skills I PBE consult, content	PBE content rubric score on one neuropsychology medication consult
		Skills I PBE PPCP activity	PBE score on patient case related to collecting and assessing information
Spring P2 year			
Pharmacotherapy II	Lecture	Therapy II examinations	Average of examination scores on respiratory and cardiology content
Drug Literature Evaluation	Lecture	Drug Literature examination	Final examination score in drug literature evaluation
Integrated Pharmacotherapy Skills II	Skills-based course	Skills II PBE consult, communication	PBE communication rubric score on two medication consult (inhaler + HTN medication) ¹³
		Skills II PBE consult, content	PBE content rubric score on two medication consult (inhaler + HTN medication)
		Skills II PBE SOAP note	PBE SOAP note rubric score (HTN + lipids) ¹⁴
		Skills II BP/HR	Rubric score on BP/HR measurement assessment
Fall P3 year			
Pharmacotherapy III	Lecture	Therapy III examinations	Average of examination scores on immunology, transplant, gastrointestinal, renal, endocrine
Nonprescription Medications	Lecture	Nonprescription examinations	Average of examination scores on nonprescription medications content
Integrated Pharmacotherapy Skills III	Skills-based course	Skills III PBE patient case Presentation to preceptor, content	PBE comprehensive patient case rubric score (ambulatory care visit with patient laboratory and PE assessment and medication recommendations)
		Skills III PBE patient case presentation to preceptor, communication	PBE verbal patient case presentation evaluation rubric score (ambulatory care visit with patient laboratory and PE assessment and medication recommendations)

(Continued)

Course Name	Course Type	Variable	Definition
		Skills III PBE verbal provider communication (SBAR)	PBE provider interaction assessment rubric score (verbal SBAR) (ambulatory care visit with patient laboratory and PE assessment and medication recommendations) ¹⁵
		Skills III women's health consult, content	Content rubric score on one medication consult (oral contraception) and response to patient question on missed doses
		Skills III women's health consult, communication	Communication rubric score on one medication consult (oral contraception) and response to patient question on missed doses ¹³
Spring P3 year			
Pharmacotherapy IV	Lecture	Therapy IV examinations	Average of examination scores on infectious disease and oncology content
Integrated Pharmacotherapy Skills IV	Skills-based course	Skills IV PBE patient case presentation to preceptor, content	PBE comprehensive patient case rubric score (complex critically ill patient with multiple medical problems and a full electronic health record)
		Skills IV PBE patient case presentation to preceptor, communication	PBE verbal patient case presentation evaluation rubric score (complex critically ill patient with multiple medical problems and a full electronic health record)
		Skills IV PBE patient interview	PBE patient interview and education rubric score (ambulatory care visit with patient pain assessment and care planning)
		Skills IV PBE SOAP note	PBE SOAP note rubric score (documentation of ambulatory care visit assessment and care plan)

Appendix 1. (Continued)

Abbreviations: P2=second year of pharmacy school; P3=third year of pharmacy school; PK=pharmacokinetics; PBE=performance-based examination; PPCP=Pharmacists' Patient Care Process; HTN=hypertension; SOAP=subjective objective assessment plan; BP=blood pressure; HR=heart rate; PE=physical examination; SBAR=subjective background assessment recommendation.