

Roadmap to inculcate complex problem-solving skills in CS/IT students

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Abstract: IT industries expect critical & analytical thinking, programming skills, domain & technology knowledge and soft skills from CS/IT graduates. There is a need for investigation of outcome-based methods to inculcate complex problem-solving skills among graduates. This paper presents a roadmap for designing student learning outcomes, assessment methods, curriculum and active teaching-learning activities for CS/IT programme. The proposed roadmap incorporates project-based, problem-based and case study based teaching-learning and assessment strategies to address higher Bloom's level. The proposed roadmap of implemented for the 2015-19 batch of CS&IT department, Rajarambapu Institute of Technology. The case study presents identified 13 student learning outcomes (SLOs) in line with program outcomes and current IT industry expectations. To achieve the SLOs, problem and project-based assessment methods and teaching-learning methods are designed. To calculate the success of the proposed roadmap, students' performance of 2015-19 batch is compared with ancestor batch 2014-18. The effectiveness of the proposed roadmap for inculcating complex problem solving is measured with percentage of higher levels of Bloom's addressed in assessment, attainment of student learning outcomes, attainment of students'

employability skills and student's feedback. For all courses, performance of students of batch 2015-19 is better than batch 2014-18. The better performance is shown with highest and median marks. Batch 2015-19 shows better student learning outcomes and employability scores than batch 2014-18. The proposed roadmap is found better on all mentioned measures for inculcating complex problem-solving skills.

Keywords: Problem-solving roadmap, project-based learning, problem-based learning, outcome-based education.

1. Introduction

National Employability report 2019 published a survey conducted for 170,000 students from 750 engineering colleges in India. According to this report, more than 90% students are weak in problem-solving skills such as algorithmic knowledge, programming, analytical skills, etc. Research in Education System has reported the limitation of traditional teaching-learning and evaluation methods. Lack of patience in young generation drives the need for active teaching-learning methods. So, it's time to update and improve the teaching & assessment process through activity-based learning and active learning techniques.

In literature different active learning techniques are investigated for student's engagement. Few popular active teaching-learning methods are project-based learning, think pair share, case study based

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learning, flipped classroom. The main motive behind these techniques is to improve, student's engagement in the classroom, solving complex problems, self-learning, lifelong learning and collaborative work. In literature, problem-based learning technique is used for different disciplines such as medical, law, engineering. The authors have presented the effectiveness of project-based and problem-based learning in engineering education. They have clarified the difference between two methods and review in engineering education (Mills et al., 2003).

Many researchers reported the advantages of problem-based learning methods (Ellis et al., 1998; Evensen et al., 2000; Kay et al., 2000; Fee & Holland-Minkley, 2010). The authors reviewed problem-based learning by collecting data through interactions and discussions with students for positive lines of research. They have used this data for curriculum decisions and supervisor practice. (Evensen et al., 2000). Paper presented PBL approach for planning to evaluation for courses in computer science. The authors shared their experience in PBL implementation (Kay et al., 2000). Paper presented the impact of PBL method on undergraduate Electrical Engineering course. The study validates effectiveness of PBL method (Yadav et al., 2011).

Project-based learning promotes students for effective learning by doing. This is a most active method of learning which allows a student to demonstrate his or her skills while working independently, and it develops the leadership skills to work with his or her peers, building teamwork and group skills (Chinowsky et al., 2006; Hung et al., 2012; Holmes & Hwang, 2016). Paper presented the implementation of PBL for two courses in Mechanical Engineering. The authors reported the integration of PBL in engineering curriculum. PBL method is gaining interest in engineering education (Hadim & Esche, 2002). The authors presented experimental learning by changing teaching style from a theory-based to a project-based. PBL tested the students' ability with open-ended challenges. PBL courses have been introduced at the Colorado University and Student feedbacks are taken to identify the possible benefits this approach (Chinowsky et al., 2006). The authors presented students' perceptions regarding PBL implementation and its impact on a course in Mechanical Engineering taught using project-based learning. Students are expected to complete mini-project under selected course. Paper presents an analysis of PBL as learning environment using teachers, assistants and students involved in the

course (Frank et al., 2003). The authors presented the advantages of PBL methodology for a course related to Computer Education. Authors reported that the PBL method is strongly associated with real life scenario and found effective despite of lack of resources (Gülbahar & Tinmaz, 2006).

Case study based teaching and learning can engage students enthusiastically to apply skills to study and analyse real-world problems/situations. This method can be used to enhance students learning by experimenting between theories and come up with new ideas or alternate solutions (Mustoe & Croft, 1999; Raju & Sankar, 1999; Yadav, 2007; Popil 2011).

In literature, problem-based and project-based learning methods are investigated for a single course in engineering education. To the best of our knowledge, no single paper is available which deals with multiple courses of CS/IT programme. This paper presents a roadmap for improving problem-solving skills of CS/IT students using problem and project-based assessment and active learning methods. The presented roadmap is helpful for design, delivery and assessment of multiple courses of CS/IT programme. The main objective of this paper is to improve student's ability to integrate knowledge and skills from different courses/domains to analyse, evaluate, design and develop solutions to complex engineering or real-world problem effectively.

Important contributions of the paper are,

- It provides the outcome-based education plan for complete three years span of the CS/IT undergraduate programme.
- The proposed roadmap follows an inductive methodology for OBE activities. It helps for designing curriculum, student learning outcomes (SLOs), problem/project based learning, assessment methodology. Proposed roadmap address the dependency between the student learning outcomes from different courses. The student learning outcomes address higher level of Bloom's taxonomy in incremental mode.
- The proposed roadmap is applied to 2015-19 batch of CS&IT department, RIT. Paper presents case study of CS&IT department with shortlisted important student learning outcomes, courses, learning methods, assessment methods and evaluation rubrics. Students' performance of 2015-19 batch is compared with ancestor batch 2014-18.

The effectiveness of proposed roadmap is presented with attainment of course outcomes, course results, students' employability skills and students' feedback.

The remaining paper is divided as follows. Section 2 presents the proposed roadmap and case study. Section 3 is about the results and discussion of outcomes and observations of the proposed roadmap. The conclusion is given in section 4.

2. Proposed Roadmap and Case study

This section provides the roadmap for strengthening problem-solving skills of CS/IT students. To improve the problem-solving skills of CS/IT student's improvement in the entire teaching-learning environment is necessary. Paper presents an inductive methodology to enhance students learning. The proposed roadmap covers course outcomes, active teaching-learning environment and assessment methodologies. The proposed roadmap is applicable to all engineering programme.

Four steps of the proposed roadmap are as below,

Step 1: Design student learning outcomes (SLO)

Step 2: Design assessment methods for each SLO

Step 3: Develop a curriculum

Step 4: Design active teaching-learning methods

Head of department, academic monitor and course in charge have very role important in the implementation of the proposed roadmap.

- Head of Department (HOD) has the main role to design, customize and implement the roadmap. HOD is responsible for planning and designing the first three steps of roadmap. He/she should identify the student learning outcomes for better problem-solving and increasing the employability/entrepreneurship. The curriculum should be in line with outcomes and current/future industry requirements in local and global. HOD is responsible to ensure high-quality standards in teaching-learning practices and assessments in department. HOD needs to ensure all activities are practicing at highest possible standards and following the necessary evaluation and monitoring procedures.

- The academic monitor has a responsibility to continuously monitor the teaching activities in line with the plans. To improve the teaching-learning activities, HOD and academic monitor will take a weekly review of respective courses based on active learning techniques used to teach the course, evaluation techniques used to assess the students and taking follow up for students learning.
- The course in-charge responsible to prepare an activity-based course plan for effective delivery of course content during the teaching. Course in-charge is also responsible to use the active learning-based evaluation of students instead of traditional methods and ensure the students learning by taking feedback from students about their learnings.

A. Design student learning outcomes

This step gives procedure to design important student learning outcomes required to improve the student's problem-solving skills. SLO describes the problem-solving knowledge and skills students expected to learn. The SLOs must address and in line with program outcomes and employability skills requirements of programme. The main objective is to improve student's ability to integrate knowledge and skills from different courses/domains to analyse, evaluate, design and develop solutions to complex engineering or real-world problem effectively.

Program outcomes represent the knowledge, skills and attitudes the students should have at the end of an engineering program. The first six program outcomes (POs) of department of Computer science and information technology, RIT are as given below.

- PO1: Application of fundamental knowledge of solve complex problems. It covers the fundamentals of science and engineering.
- PO2: Steps of problem identification to analysis are covered in second program outcome. Identification of problem from engineering discipline or real-world application in first important step. Correct problem formulation using suitable techniques is second step. Study of literature to understand different alternative solution and critical analysis of the problem in third step.
- PO3: It focus on development of IT service/product that satisfies the customer's need

satisfying the environmental/legal/societal requirements. It needs the understanding of domain knowledge.

- PO4: It focus on core problem-solving skills and interpretation. It covers the students' ability to conduct the suitable experimentations/tests. Further, interpretation of observations/data to reach accurate conclusions is necessary.
- P O 5 : S e l e c t i o n o f s u i t a b l e methodology/technique/tool for solving the complex problem is covered. Selection of suitable technique/tool from available pool to models, design and analysis is important tasks.
- PO6: Doing professional practices considering the contextual references including social, legal and safety needs/norms is addressed in this program outcome.

The IT industry expectations are understanding of,

- Fundamental courses
- Recent information technologies
- New software development industry

Based on the program outcomes and industry expectations, 13 student learning outcomes (SLO) are designed. Each SLO is mapped to multiple POs based on their influence. Table 1 shows the mapping of SLOs with POs. Here 'HI' indicates strong co-relation. Further, dependency between the SLOs is identified. Table 2 shows the dependency of SLO with other SLOs. Programming skills are pre-requisite for any CS/IT student. The proposed roadmap assumes that the fundamental knowledge of programming courses such as C, C++ and Java is satisfactory. In SLO 8, 9, 10, 12 and 13 implicitly addresses the required programming skills such as python, PHP.

- SLO_1: Choose appropriate data structures for developing a solution to the problem.
- SLO_2: Analyse algorithm design techniques for solving the complex problem.
- SLO_3: Practice software process models for real-world problem.
- SLO_4: Apply the project management concepts for the real-world problem.

- SLO_5: Design software system models using UML.
- SLO_6: Draw E-R diagram and design database according to organizations' requirement.
- SLO_7: Write SQL and No-SQL queries to perform various operations on database for specific objectives.
- SLO_8: Design User Interfaces (UIs) for Android applications using controls, layout managers, menus and dialogs.
- SLO_9: Perform testing, packaging of mobile applications and deploy Android applications to emulators and physical devices.
- SLO_10: Build interactive web applications.
- SLO_11: Explore and identify different cloud platforms and services.
- SLO_12: Design and implement IoT solutions for real word problems.
- SLO_13 Applying appropriate tools and techniques for data analytics.

Table 1: SLO to PO mapping

	PO1	PO2	PO3	PO4	PO5	PO6
SLO_1	HI	HI	HI	HI		
SLO_2	HI	HI	HI	HI		
SLO_3	HI	HI	HI	HI		HI
SLO_4	HI	HI	HI	HI		HI
SLO_5	HI	HI	HI	HI	HI	HI
SLO_6	HI	HI	HI	HI	HI	HI
SLO_7	HI	HI	HI	HI	HI	HI
SLO_8	HI	HI	HI	HI	HI	HI
SLO_9	HI	HI	HI	HI	HI	HI
SLO_10	HI	HI	HI	HI	HI	HI
SLO_11	HI	HI	HI	HI	HI	HI
SLO_12	HI	HI	HI	HI	HI	HI
SLO_13	HI	HI	HI	HI	HI	HI

Table 2: Dependency between SLOs

	Dependent on other SLOs
SLO_10	SLO_1, SLO_2, SLO_3, SLO_4, SLO_5, SLO_6, SLO_7
SLO_12	SLO_1, SLO_2, SLO_3, SLO_4, SLO_5, SLO_6, SLO_7, SLO_8, SLO_9, SLO_10, SLO_11,

B. Design assessment methods for each SLO

This section presents the formative assessment methods for identified student learning outcomes. The main objective of the assessment method is to address higher Bloom's level. Higher Bloom's level address higher knowledge and skills level such as develop, formulate, solve, investigate, apply and demonstrate.

Table 3 shows the investigated assessment methods and addressed Bloom's level for student learning outcomes. The proposed assessment methods address the higher level of Bloom's Taxonomy i.e. application (level 3), analysis (level 4) and synthesis (level 5).

This section presents the assessment methodology adopted and implemented in department of CS&IT, RIT.

1) Assessment methodology for project-based learning

The assessment methodology for project-based learning presented by (Adamuthe & Mane, 2016) is used in this paper.

Identify suitable assessment methods in line with the course outcomes. Identify the assessment strategies covering all the objectives/outcomes and decide the weightage accordingly.

Table 3: Selected active learning-based assessment methods

SLO	Assessment method	Addressed Bloom . level	
SLO_1	Problem-based	Analysis, Application	
SLO_2	Problem-based		
SLO_3	Problem-based, case study based	Synthesis, Analysis, Application	
SLO_4	Problem-based, case study based		
SLO_5	Problem-based, Project-based learning		
SLO_6	Project-based		
SLO_7			
SLO_8			
SLO_9			
SLO_10	Project-based	Application	Synthesis
SLO_11		Analysis	
SLO_12			
SLO_13	Project-based		

- Correlate the assessment methods to students' knowledge and skills levels. Assessment methods must focus on higher levels of Bloom's Taxonomy.
- Prepare the assignments/tasks/practicals with the required level of deliverables.
- Prepare assessment criteria/rubrics for each evaluation mode for measurement of outcomes/deliverables.

2) Assessment methodology for problem-based learning

- Identify and define the problem correctly
- Identify and connect the relevant topics/issues for given problem-solving
- Identify multiple solution strategies
- Evaluation of proposed solutions
- Presents accurate and clear argument for the given problem

3) Assessment methodology for case study

- Collect the relevant resource material
- Identify the problem
- Critical analysis of different solution strategies.
- Identify a suitable strategy/research gap/research direction.

Table 4 presents the project-based assessment plan for SLO_6 and SLO_7. The table 4 gives precise plan to evaluate individual students based on required parameters. This is a sample case example for database engineering course. The objective of this course is to design and develop database application for any organization.

A generic rubric-based assessment is shown in table 5. It is used to grade students' work as per the mentioned criteria. Rubrics based evaluation can also be called criteria sheets or grading schemes or scoring guides. It describes the levels of quality for each student based on criteria. Rubric-based assessment provides proper guidelines to the student and teacher to conduct meaningful assessments without any bias.

Table 4: PBL based evaluation for Database Engineering course (Adamuthe & Mane, 2016)

Sr. No.	Outcomes	Assessment method (% weightage)	Knowledge/skills addressed	Bloom's Taxonomy level	Assessment criteria
1	<ul style="list-style-type: none"> - Interact with different enterprises where DBMS is necessary. - Identify the need for DBMS and finalize the objectives of the system. - Design a DBMS system satisfying the objectives/needs of an enterprise. 	Design Document (40% weightage)	<ul style="list-style-type: none"> - Knowledge of respective industry - Application of software development process - Communication skills - Professional ethics - Use of modern tools and techniques 	Application (Level 3) Synthesis (Level 5)	<ul style="list-style-type: none"> - Interaction with end-user - Domain knowledge - Use of ER diagram constructs - Use of open source tool
2	Design and implementation of database system with relational database management tool	Implementation using SQL (30% weightage)	<ul style="list-style-type: none"> - Problem-solving - Software development process - Use of modern and open-source tools 	Application (Level 3)	<ul style="list-style-type: none"> - Database schema - SQL queries as per objectives - Use of SQL constructs
3	Implement database application for any individual/organization.	Implementation using Microsoft Access (30% weightage)		Application (Level 3)	<ul style="list-style-type: none"> - Backend design as per objectives - Front end design - Connectivity of front end and back end

Table 5: Generic criteria for evaluation of project-based learning

Sr. No.	Criteria	Level of Attainment			
		Poor	Satisfactory	Good	Excellent
1	Identify area, sub-area and topic	Identified area, sub-area and topic are not relevant.	Identified domain relevant to current trends / fundamental question.	<ul style="list-style-type: none"> • Identified domain relevant to current trends/fundamental question. • Identified correct sub - area. 	Identified topic/problem is conceptually correct and uses correct technical terminology.
2	Depth of literature review	<ul style="list-style-type: none"> • Insufficient papers are selected. • Identified papers are not from good journals. 	<ul style="list-style-type: none"> • Selected a good number of papers from standard journals. • Selected papers focus on similar objectives. 	<ul style="list-style-type: none"> • A good number of papers are reviewed. • Written critical comments. • Identified research gap. 	<ul style="list-style-type: none"> • Identified more than one research gap.
3	Problem statement and objectives	Problem statement and objectives are not clear and inline	Identified problem statement and objectives are clear and inline	Problem statements and objectives are according to the research gap	Problem statements and objectives address multiple research gaps.
4	Critical thinking	Not analysed the problem.	Ambiguity in problem analysis.	Identified variation in problem statements and objectives. Compared to different problem -solving approaches.	Done critical analysis of the problem, objectives and techniques.
5	Presentation Skills & Report Quality	Poor PPT quality and presentation skills PPT / Report content is incomplete or incorrect.	Technical mistakes in the content. The report is not technically correct and comprehensive.	Quality of PPT is good and technically correct. The report is technically correct and comprehensive	Quality of PPT is good and technically correct. Content is presented with proper flow and convincing skills The report is technically correct and comprehensive No grammatical mistakes and typo errors in presentation and report.

Table 6: Rubrics for Internetworking Protocol course

Level Criteria for evaluation	Poor	Average	Good
Concept map preparation	Concepts and Ideas are disconnected	Concepts and ideas are somehow inconsistent	Concepts and ideas are well understood
Demonstration	Know the list of tools/services to demonstrate the concept.	Service/tools are just installed, but not able to configure and demo it	Demonstrated the configuration of service/ tool along use or application.
Q&A	Unable to answer. Most of the answers are wrong.	Answer many questions but ambiguity in few answers	Handle difficult questions easily with confidence and illustrative explanation

It also helps to compare the achievement of the students to the desired outcomes designed for any course or content

Sample rubrics designed for Internetworking protocol course shown in table 6.

Skill-based evaluation techniques motivate students to take projects rigorously to develop problem-solving, self-learning abilities and employability skills. Skill-based evaluation technique for academic projects actively engages students in project activity to achieve project deliverables. Students are asked to work in groups to gain other skills and knowledge which may not be taught in the classroom. Teachers are evaluating the students based on active learning techniques by considering criteria of outcomes of student learning. The methods invite the students to participate in the evaluation process, creating a student's friendly environment for learning and maintaining the fair transparency in assessment. The evaluation technique adds transparency in evaluation, justice to each student, differentiation in student skill wise.

C. Develop curriculum

We have developed the CS/IT curriculum by clearly defining student learning outcomes. The curriculum is designed to address the defined student learning outcomes and respective assessment strategies discussed in previous subsections. The curriculum focus on courses that have high priority for problem-solving skills. These 13 SLOs need to be addressed by multiple courses in three years of graduation span.

Table 7: Identified courses for selected SLOs

Student Learning Outcomes (SLO)	Course name	Class
SLO_1	Data structures (DS)	Second year
SLO_2	Algorithms (Algo)	Third year
SLO_3	Software engineering (SE)	
SLO_4		
SLO_5	Software modelling & design (SMD)	
SLO_6	Database system (DB)	
SLO_7		
SLO_8	Mobile application development (MAD)	
SLO_9		
SLO_10	Web application development (web)	Final year
SLO_11	Cloud computing (CC)	
LO_12	Internet of Things (IoT)	
SLO_13	Data analytics (DA)	

Table 7 presents the student learning outcome and identified courses.

- Data structures course includes elementary and advanced data structures namely stack, queues, linked lists, trees and graphs. It covers the basic operators and their applications to solve engineering and real-world problems.
- Algorithms introduces different algorithm design techniques and it's application. It covers P and NP problem-solving techniques.
- Software Engineering covers the software engineering process and models. It includes software design and management practices.
- Software Modelling & Design course includes how to use object-oriented techniques to design software systems. The course starts with requirements gathering & end with specific designs. In the process, student will learn static, dynamic and functional design of system.
- Database system course focuses on use of relational database management system for application development. It covers the fundamental concepts and query language.
- Mobile Application Development course

introduces setting up Android app development environment (JDK, Android Studio, Android SDK), Android architecture, Tools in Android. Button, TextView, EditText, Spinner, ListView, RadioButton, etc. Layout in Android, Event delegation model in Android, Toast App. Activity, Service, Notification, Broadcast receiver, AlertDialog, Menus: Option Menu and Context Menu Native data handling: SQLite Database, Files handling and Shared Preferences. Signing and Packaging App: Signing, Packaging and Deploying Android app on Google Play store, Firebase demo, Mini project using Android.

- Web application development course focuses on design and development of Web-based applications using different programming languages and tools.
- Cloud computing course presents the journey of IT industry from mainframes to cloud computing. It covers the basic models and services of cloud computing. It focuses on technical and business aspects such as security, cloud services by leading vendors, application in healthcare and business, service level agreement, total cost of ownership.
- Internet of Things course address different hardware & sensors required for data collection. It covers the IoT architectures, protocols and application to real-world problems.
- Data Analytics course covers methods and tools for analysing data from different domains such as marketing, finance. Topics include probability, statistics, clustering, classification and forecasting.

D. Design active teaching-learning methods

Skills-based students learning mainly focused on problem-based learning, project-based learning and case study based learning. Table 8 shows the active teaching-learning strategies used for selected courses.

- Problem-based learning
- Problem-based learning is mainly focused on student-centric education, in this student will learn a course through hands-on experience by trial and error to solve an open-ended problem that may found during the course study.
- Project-based Learning

- Project-based learning is a task-based approach where students are asked to apply the conceptual knowledge to develop a real-time application.
- Case study-based learning
- It focuses on applications, problem-solving methodology and practices.

Table 8: Active Teaching-Learning strategies adopted

Course name	Teaching strategy
Data structures (DS)	<ul style="list-style-type: none"> • Problem-based learning • Think pair share
Algorithms (Algo)	<ul style="list-style-type: none"> • Problem-based learning • Think pair share
Software engineering (SE)	<ul style="list-style-type: none"> • Problem-based learning • Jigsaw
Software modelling & design (SMD)	<ul style="list-style-type: none"> • Project-based learning • Jigsaw
Database system (DB)	Project-based learning
Mobile application development (MAD)	Project-based learning
Web application development (web)	Project-based learning
Cloud computing (CC)	Project-based learning
Internet of Things (IoT)	Project-based learning
Data analytics (DA)	Project-based learning

The sample problems selected for problem-based learning for course algorithms are as follows.

- Divide and conquer design technique is not applicable to solve TSP problem. Comment.
- Develop greedy algorithm to find minimum number of coins.
- Discuss the greedy strategy used in process scheduling algorithms: First come first serve and Round robin
- Discuss the greedy strategy used in bin packing algorithms: First fit and best fit.
- Illustrate the limitations of greedy method with graph colouring problem.
- What is the impact of state-space tree on performance of backtracking algorithm?
- Design effective solution representation for solving queen problem.

Sample topics of project-based learning for mobile application development course are as follows,

- Village E-complaint management System
- Advertisement Reservation Application
- Nursery plant management system
- Student Feedback System
- Restaurant Management system

Sample topics of case study for Software Engineering and Software Modelling & Design course are as follows.

- Vehicle Security system using IoT
- Citizen feedback system for road maintenance issues
- Nursery plant management system
- Water management system
- Chatbot for customer support system

Sample topics of project-based learning for Internet of Things course are as follows.

- Lab automation system
- Smart parking system
- An Intelligent System for Soil Analysis, nutrition management in Agriculture sector
- Smart street light control system
- Fire and smoke detection alarm system for mess
- IoT based garbage collection system

3. Results and Discussion

This section presents results of proposed roadmap implemented for batch 2015-19 of CS&IT department, RIT. The results are compared with ancestor batch 2014-18 to which roadmap is not implemented. The comparison is done using the following measures.

i) Percentage of higher levels of Bloom's addressed in assessment

ii) Attainment of student learning outcomes

iii) Attainment of students' employability skills

iv) Student's feedback

A. Bloom's level addressed and SLO attainments

To analyse the assessment quality and level of difficulty, total marks in each Bloom's level is calculated. The assessment covers ISE (in semester evaluation for 20 marks), unit tests (total 30 marks) and ESE (end semester evaluation for 50 marks). Figure 1 presents the percentage of evaluations addressing Bloom's level 1 to 3 and 4 to 6. The 2015-19 batch in which roadmap is implemented shows more assessment percentage for Bloom's level 4 to 6 than 2014-18 batch. Courses adopted project-based learning (see table 8) addressed more than 50% assessment in Bloom's level 4 to 6.

Figure 2 shows the comparison of courses adopted problem-based learning. The analysis is carried using marks obtained by all students. DS2014-18 indicates the marks of course data structures for 2014-18 batch. For data structure (DS) and software engineering (SE)

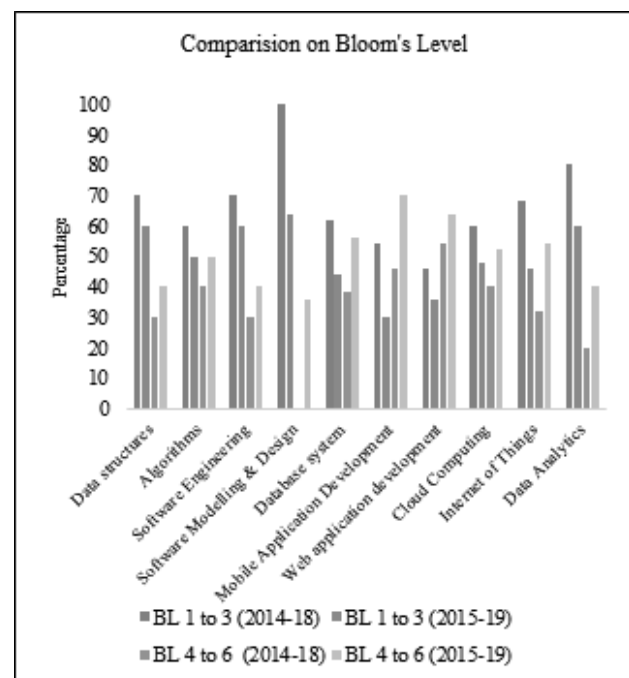


Fig. 1: Bloom's level addressed

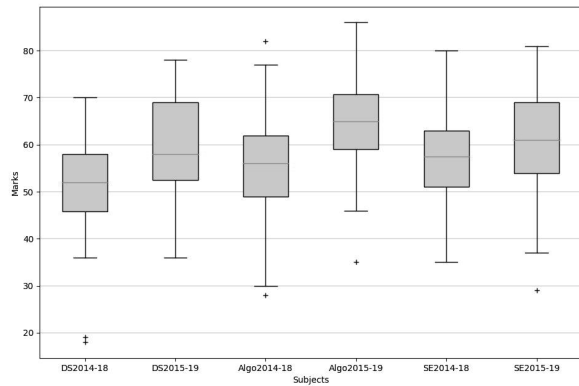


Fig. 2 : Comparison on courses with problem-based learning

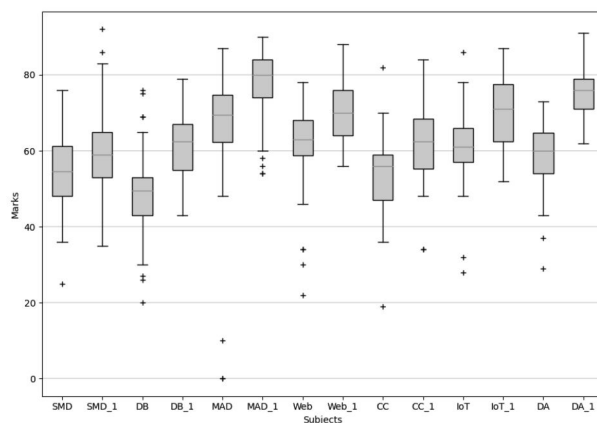


Fig. 3 : Comparison on courses with project-based learning

course the performance of students of batch 2015-19 is better than batch 2014-18. The better performance is achieved for obtained highest mark and median of marks. For algorithm (Algo) course the performance of batch 2015-19 is reduced significantly.

Figure 3 shows the comparison of courses adopted project-based learning. The analysis is carried using marks obtained by all students. SMD and SMD_1 indicates the marks of course Software modelling & design for 2014-18 batch and 2015-19 batch respectively. For all course the performance of students of batch 2015-19 is better than batch 2014-18. The better performance is achieved for obtained highest mark and median marks.

Further, attainment of student learning outcomes is calculated using predefined threshold. Figure 4 presents the attainments of student learning outcomes. The course outcome attainment is calculated using the below formula.

$$\text{Threshold based Attainment \%} = (x/y) * 100 \quad (1)$$

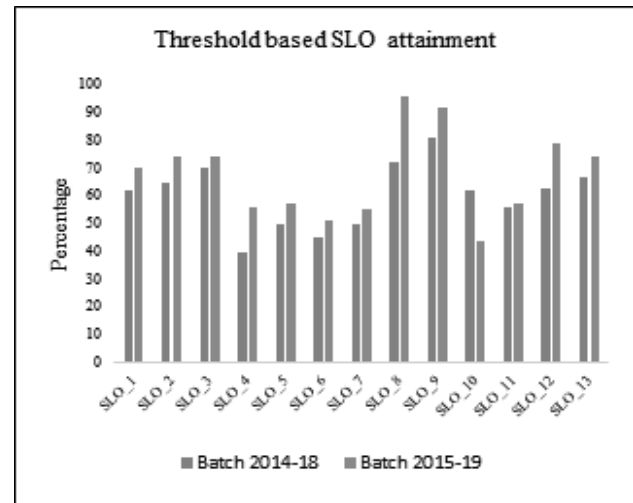


Fig. 4 : Attainment of student learning outcomes

x = Count of Students \geq to Threshold %
 y = Total number of students attempted.

Figure 4 shows that 2015-19 batch attainment is better than 2014-18 batch for all student learning outcomes except SLO_10.

Figure 4 shows that for batch 2015-19 attainment of two learning outcomes is more than 90%. Attainment of five SLOs are more than 70%. Student learning outcome attainment of SLO_8 and SLO_9 is regarding Mobile application Development. All students group have completed mobile application of social benefit and deployed on Google Play store [Google Play store]. SLO 12 is about the devolvment of IoT solutions for real word problems. High attainment is due to satisfactory completion on projects by majority of students. Student learning outcomes of SLO_10 is 44%. The main reasons behind poor attainment are its dependency on other SLOs. To build interactive web application students should be able to choose appropriate data structures (SLO_1), analyse the different algorithm design it (SLO_2), should follow software engineering to design the blue-print models using UML diagrams (SLO_3 to SLO_5), design and write SQL and No-SQL query database according to organization requirement (SLO 6 to 7). After completion of each course, student's feedback is collected through seven questions.

B. Employability skills

Mandale & Adamuthe (2019) presented methodology to evaluate students' employability skills. The focus is on identifying students' ability to integrate knowledge and skills from different courses.

This technique is applied to evaluate students' performance at third-year mini-project and final year project course. Proposed evaluation technique focus on assessment of student's engineering skills, core skills, personal characteristics and communication skills at individual and group level. It evaluates student projects from all employability dimensions by considering innovative practices used in IT industry. The evaluation focus on three main skills listed in table 9.

Table 9: Employability skills

Core skills	Professional skills	Communication skills
Integrity	Knowledge of science and engineering	Written communication
Self-discipline	Solution design as per requirements	Communication in English
Self-motivated	Use of appropriate tools/technologies	Verbal communication
Team work	Knowledge of contemporary issues	

Four reviews are conducted for evaluation of mini-project and project. The project evaluation criteria are mapped to core employability skills, professional skills and communication skills. The marks are normalized to scale of 1 (lowest) to 5 (highest). Figure 5 and 6 shows the normalized results of employability skills for mini-project and project.

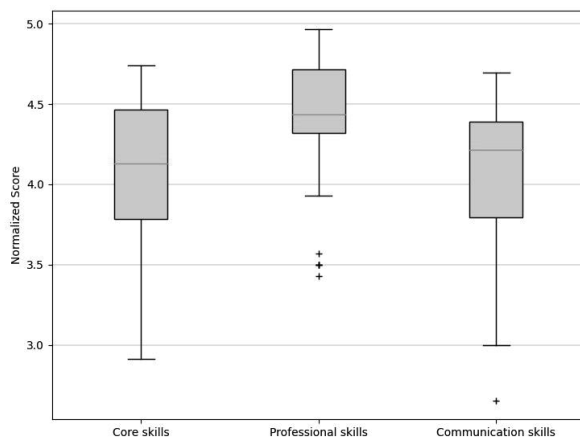


Fig. 5 : Skill-based evaluation result for mini-project

Results from figure 5 indicate that the overall performance of the entire third-year class is better with respect to considered employability skills. Median values for all three skill types are more than 4.2. More than 40% of students have shown outstanding performance on complex problem solving skills (professional skills) with more than 4.5 normalized score.

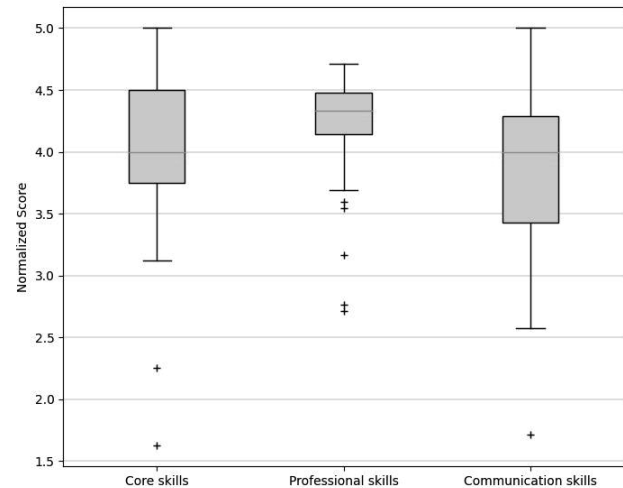


Fig. 6 : Skill-based evaluation results for project

Results from figure 6 indicate that the overall performance of the entire final year class is better with respect to considered employability skills. Median values for all three skill types are more than 4. Students have shown better performance on complex problem-solving skills (professional skills) with normalized score between 4.2 and 4.5. Final year students calculated employability skill scores are validated with end result of students' selection for campus placement. Third-year students calculated employability skill scores are validated with their selection for industry internship program (IIP). To measure the accuracy of employability skill scores two measures are used.

- False bad score (FBS): Students' employability score is less but selected for campus placement (applicable for final year students) or industry internship program (applicable for third-year students).
- False good score (FGS): Students' employability score is good but not selected for campus placement (applicable for final year students) or industry internship program (applicable for third-year students).

Percentage of false bad score (FBS) and false good score (FGS) is approximately 10% and 18% respectively.

Placement is increased by 19% for batch 2015-19 (92%) as compared to batch 2014-18 (73%).

Improvement in student problem-solving skills is satisfactory. For academic year highest packaged is

offered to IT dept. is 8.5 lakh and average package of dept. is around 3.7 lakhs. Statistics show that for the academic year 2018-19 three students received in-house funding around Rs. 30,000. Funding is given to promote students to convert academic projects into products.

Students completed online courses around 196 and it shows that they have improved in self-learning ability where students are having ability to learn from online courses/MOOCs/NPTL courses. Students are self-motivated to participate in national/international level competitions. Ten students' groups have participated in national level hackathon competitions and received the prizes. Seven students have been participated in summer internship in Asia University Taiwan and won first prize in project competition.

C. Students feedback

Batch 2015-19 students' feedback on use of active teaching-learning method is taken using five points Likert scale indicating 5 for strongly agree and 1 for strongly disagree. Student feedback at mid of semester is collected using sample questionnaire.

Table 10 shows the median of students' feedback values for selected three questions which are most relevant to proposed roadmap. Equal importance is given to each question and highest average is value 1.43. Table 10 shows that students are satisfied with the active teaching-learning planned in the proposed roadmap.

Table 10 : Median of student's feedback

Questions	SLO's												
	SLO_1	SLO_2	SLO_3	SLO_4	SLO_5	SLO_6	SLO_7	SLO_8	SLO_9	SLO_10	SLO_11	SLO_12	SLO_13
Do you get opportunities for raising doubts within and outside classroom	1.34	0.95	1.31	1.31	1.28	1.06	1.06	1.24	1.24	1.15	1.18	1.23	1.11
Are all course components and Evaluations challenging	1.33	1.00	1.25	1.25	1.27	1.08	1.08	1.20	1.20	1.13	1.14	1.19	1.11
Are you given enough opportunities for learning by doing	1.33	1.02	1.26	1.26	1.23	1.12	1.12	1.18	1.18	1.14	1.19	1.19	1.04

4. Conclusions

This paper proposed a roadmap to inculcate complex problem-solving knowledge and skills in CS/IT students. The proposed roadmap provides procedure to design student learning outcomes, suitable assessment method, curriculum and active teaching-learning activities for CS/IT department. The proposed roadmap provides a holistic way to department head, academic coordinator, syllabus designing committee and teacher for the effective teaching-learning process. The first step of roadmap describes the identification of student learning outcomes based on the mandatory requirements for employability and program outcomes. The second step provides an outcome-based evaluation strategy for assessment of student learning outcomes based on active learning techniques like project-based learning, problem-based learning and case studies. The third step focuses on designing a curriculum by identifying the most important courses to enhance the student's problem-solving skills during student engineering education. The fourth step recommends effective teaching-learning strategies for respective courses by identifying active learning-based topics.

Paper presents the implementation details of roadmap for batch 2015-19 CS&IT department, RIT. The presented case study is guideline for identifying student learning outcomes, assessment methods, courses and active teaching-learning methods. The proposed roadmap focuses on identified SLOs and courses. It attempts Bloom's levels in incremental order from apply (third level) to create (fifth level). Results of batch 2015-19 show improved students' performance with higher level of Bloom's skills. Performance improvement is achieved in better results with highest and median marks. Results of employability skill score indicate the better performance with respect to core employability, professional and communication skills. Improvement in students' placement, industry-sponsored projects, participation in competitions and online certifications supports the success of roadmap.

The steps in roadmap are general and applicable to any science and engineering disciplines. Expert knowledge in respective discipline is necessary for the effective application of roadmap steps. There is future scope to prepare discipline-specific guidelines for

effective application of proposed roadmap. Roadmap address planning, delivery and evaluation of dependent students learning outcomes. There is future scope to investigate the SLO attainment of dependent student learning outcomes.

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