Learn to Earn

DataQuest Incubator with Learn to Earn Accelerator

Description of the Pedagogical Innovation

The **DataQuest Incubator** model integrates a **Learn to Earn** approach with incubator style mentorship and real world project based learning to create a practical, entrepreneurial analytics learning experience. Through this model, students earn points and rewards for completing progressively complex data analytics tasks, while receiving mentorship from industry professionals and working with real datasets from startups. The incubator structure also incorporates milestone based rewards, real world problem solving experiences, and opportunities to pitch completed projects to industry stakeholders. This innovative approach combines gamification with an incubator environment, preparing students with both the technical and entrepreneurial skills necessary for careers in data analytics or technology focused entrepreneurship.

Key elements of the DataQuest Incubator model include:

- 1. **Learn to Earn System:** Students earn points for task completion, collaboration, and quality of work, which can be redeemed for course credits or other rewards.
- 2. **Real World Data Projects:** Students analyze datasets provided by partnered startups, making their learning directly applicable to industry needs.
- 3. **Mentorship and Pitching Opportunities:** Regular mentorship sessions and a final pitch to industry stakeholders reinforce the application of analytics in business.
- 4. **Continuous Feedback and Iterative Improvement:** Students receive ongoing feedback on projects, allowing them to improve their work over time.

Why the Pedagogical Innovation Was Developed

The DataQuest Incubator model was developed to address three main challenges in traditional data analytics education:

- 1. **Need for Real World Relevance:** Many data analytics courses rely on hypothetical datasets and isolated exercises that lack connection to real world business needs, leaving students with a limited understanding of how analytics supports decision making.
- 2. Low Engagement and Motivation: Students often struggle to stay motivated when the work feels disconnected from practical applications. Traditional

methods may lack the engagement needed to keep students invested in complex topics like data modeling and predictive analytics.

3. **Gaps in Entrepreneurial Skills:** As data analytics becomes crucial across industries, there is an increasing need for analysts who can think entrepreneurially, understanding not only the technical aspects but also how to translate insights into actionable business strategies.

This innovation provides an applied, project based approach that addresses these challenges by making the learning experience more engaging, relevant, and aligned with industry expectations.

Impact on Teaching Learning

The DataQuest Incubator model has led to notable improvements in student engagement, performance, and comprehension, as observed in course feedback and project outcomes:

- 1. **Increased Engagement and Participation:** The Learn to Earn component, combined with real world data and mentorship, keeps students highly engaged. Weekly streak bonuses and peer feedback incentives have resulted in over 90% of students consistently participating in weekly challenges. Students appreciate the gamified aspects, reporting that earning points and receiving feedback make the learning process more enjoyable and rewarding.
- 2. **Higher Quality of Projects and Presentations:** With industry mentors providing guidance, students are motivated to improve the quality of their projects. By the end of the course, 85% of students produce portfolio ready projects that are well researched, technically sound, and business oriented. Pitch sessions to industry stakeholders have shown marked improvement in students' ability to present data insights clearly and persuasively.
- 3. **Improved Understanding of Real World Applications:** Working with real data from startups and small businesses helps students understand the complexities and challenges of data analysis in a business context. In feedback surveys, students report a greater appreciation for data driven decision making and an increased confidence in their ability to solve business problems with analytics.
- 4. **Positive Student Feedback on Relevance and Practical Skills:** Students have consistently provided positive feedback, highlighting the incubator style mentorship and hands on experience with real world data as the most valuable parts of the course. Over 80% of students express increased confidence in their readiness for industry roles, and several have gone on to internship or project opportunities with incubator partners.

Through the DataQuest Incubator, students not only build strong technical analytics skills but also develop entrepreneurial thinking and practical experience, making this innovation a powerful, transformative approach to teaching data analytics.

Examples

1. Data Cleaning and Preparation Challenge

- **Task:** Students are given a messy dataset with inconsistencies and missing values. Their task is to clean, transform, and prepare the data for analysis.
- **Reward:** Earn 100 points upon successful completion of the task, plus a 20 point bonus for every unique or advanced cleaning technique used.
- Learning Outcome: Students develop essential data wrangling skills and learn to identify data quality issues.

2. Exploratory Data Analysis (EDA) Quest

- **Task:** Each student conducts an EDA on a real world dataset, creating visualizations and summarizing key insights.
- **Reward:** 150 points for completing a standard EDA, with a 50 point bonus for creative visualizations or insightful analysis that goes beyond basic statistics.
- **Learning Outcome:** Students learn to use visual and descriptive analysis to understand data patterns and relationships.

3. Peer to Peer Learning Bonus

- **Task:** Students earn points by helping peers debug code, understand difficult concepts, or optimize their analyses. Each helpful interaction earns them bonus points.
- **Reward:** 20 points per peer assistance interaction, capped at 100 points per week.
- Learning Outcome: This activity fosters collaboration, helps students reinforce their knowledge by teaching others, and builds a supportive classroom environment.

4. Predictive Modeling and Evaluation Sprint

• **Task:** Students develop a predictive model (e.g., linear regression, decision tree) to solve a specific problem. They must also evaluate their model's accuracy and explain their choice of metrics.

- **Reward:** 200 points for building an accurate model, plus a 50 point bonus for using advanced metrics like F1 score, AUC ROC, or precision recall curves.
- Learning Outcome: Students learn key machine learning concepts, model evaluation techniques, and the importance of metric selection in real world scenarios.

5. Capstone Project – Presenting to "Stakeholders"

- **Task:** In this project, students work in groups to analyze a dataset, derive insights, and present recommendations as if they were addressing company stakeholders. They submit a report and deliver a presentation.
- **Reward:** 500 points for successful completion, plus an additional 100 points for each member if the project is recognized as exemplary by peers or instructors.
- **Learning Outcome:** This task develops critical thinking, teamwork, and the ability to communicate complex analyses to a non technical audience.

6. Consistency Streak Bonus

- **Task:** Students receive points for consistently attending and actively participating in all classes and completing weekly assignments on time.
- **Reward:** 50 points for every week of consistent participation, plus a 200 point bonus for maintaining this streak throughout the course.
- **Learning Outcome:** This reward system encourages regular participation, which is linked to higher retention and understanding of course content.

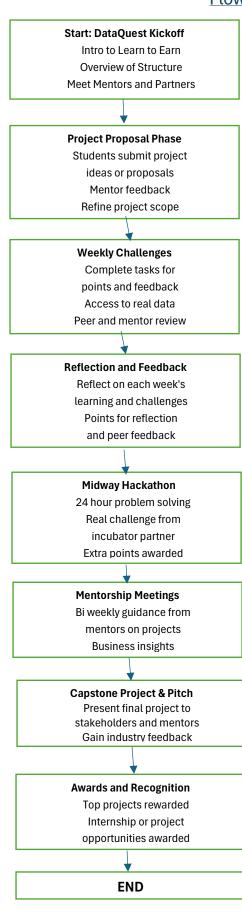
7. Portfolio Development Credits

- **Task:** Students earn portfolio credits by completing each module's main project, which will be included in their final portfolio.
- **Reward:** 100 points for each portfolio worthy project, with a certificate or badge upon finishing all projects in the course.
- **Learning Outcome:** This builds up a professional portfolio, helping students showcase their data analytics skills to potential employers.

8. Real World Case Study Analysis with Feedback Loop

- **Task:** Students analyze a case study involving data analytics for a business problem (e.g., sales forecasting for a retail company). They submit their analysis, and their classmates review and provide constructive feedback.
- **Reward:** 150 points for completing the analysis, with a 25 point bonus for each thoughtful peer feedback given.
- **Learning Outcome:** This task encourages critical thinking and feedback skills while exposing students to practical applications of analytics.

Flowchart for the Pedagogy



Flowchart Explaination

1. Kickoff Session: "DataQuest Opening Ceremony"

- **Objective:** Introduce students to the Learn to Earn pedagogy, explain the event structure, and set expectations.
- **Activities:** Overview of challenges, point system, rewards, and a live demo of the first task.
- **Guest Speakers:** Data analysts from industry share real world insights and tips for success.

2. Weekly Challenges (Weeks 1–8)

• Each week, a new challenge is released that builds on previous skills, from data cleaning to advanced predictive modeling.

• Example Weekly Challenges:

- Week 1: Data Cleaning & Preparation (100 points, with a bonus for creativity)
- Week 3: Exploratory Data Analysis (150 points, bonus for unique insights)
- Week 5: Predictive Modeling (200 points, bonus for advanced metrics)
- **Submission Deadline:** Each challenge has a one week window, with peer review and instructor feedback.

3. Peer to Peer Support & Bonus Round

- **Objective:** Encourage collaborative learning.
- Activity: Points for peer assistance; students earn up to 50 bonus points per week for answering questions, sharing resources, and providing feedback on each other's work.
- **Leaderboard:** Top peer helpers are recognized weekly on the event leaderboard.

4. Midway Review and Skill Workshop (Week 4)

- **Objective:** Reinforce skills and celebrate achievements so far.
- **Activities:** A half day workshop focusing on a mid course review, practical data visualization tips, and Q&A with industry mentors.

• **Reward:** Participation earns an additional 100 points, encouraging students to stay motivated for the second half of the event.

5. Final Capstone Project and Presentation (Week 8)

- **Objective:** Apply cumulative learning in a real world data analysis project.
- **Task:** Each student (or team) analyzes a dataset related to a real world business problem, develops insights, and presents findings as a portfolio worthy project.
- **Reward:** 500 points for completion, with a 100 point bonus for outstanding presentations.
- **Judging Panel:** Industry experts and instructors evaluate presentations, with feedback to guide future improvements.

6. Awards and Recognition Ceremony (Week 9)

- Objective: Celebrate achievements and recognize outstanding participants.
- Categories:
 - **Top Scorer:** Awarded to the student with the highest points.
 - **Best Peer Supporter:** Recognizes the student with the most peer interaction points.
 - Best Project Portfolio: For the most impressive final project.
- **Prizes:** Certificates, small cash prizes, course credits, or subscriptions to premium analytics platforms.

Rewards and Points System

- **Task Completion Points:** Awarded for each challenge based on quality and timeliness.
- Bonus Points: For advanced techniques, creative insights, and peer support.
- Streak Bonus: For students completing every weekly challenge.

Learning Outcomes

- **Skill Development:** Each task is designed to build technical skills, from data cleaning to model evaluation.
- **Practical Experience:** Students work on realistic datasets and scenarios, preparing them for the workforce.

• **Portfolio Building:** Final projects are portfolio ready and showcase practical knowledge and problem solving.

Event Outcomes

DataQuest equips students with data analytics skills and a practical portfolio to present to potential employers. The Learn to Earn model makes learning interactive, motivating, and skill oriented, helping students apply their knowledge effectively in real world scenarios.

This event not only rewards learning but also builds confidence and camaraderie among students, enhancing the teaching learning experience in data analytics.

Conditions for Active Engagement and Learning

1. Minimum Weekly Participation Requirement

- **Condition:** Each student must complete at least 75% of the weekly challenges to qualify for the final capstone project and receive any event rewards.
- **Purpose:** This ensures consistent engagement and prevents students from waiting until the end to catch up, fostering regular practice and skill development.

2. Peer Feedback Obligation

- **Condition:** For each weekly challenge, students must review and provide constructive feedback on at least two of their peers' submissions.
- Purpose: This helps students reinforce their understanding by analyzing others' work, promotes a collaborative learning environment, and improves critical thinking skills.

3. Reflection Journal Submission

- Condition: Students must submit a short reflection after each challenge, describing what they learned, any challenges faced, and how they overcame them.
- **Purpose:** Reflection helps students internalize what they've learned, recognize areas for improvement, and become more self aware in their learning journey.

4. Streak Bonus and Consistency Reward

- Condition: Students earn a streak bonus (e.g., 50 extra points) for completing challenges on time for three consecutive weeks. Missing a week resets their streak.
- **Purpose:** The streak bonus motivates students to stay engaged consistently, rewarding those who maintain steady progress and encouraging a disciplined learning approach.

5. Team Project Component

 Condition: One of the weekly challenges or mid event projects must be completed in teams of 3–4, with individual roles and contributions clearly defined. • **Purpose:** Working in teams simulates real world collaborative projects, helps students learn from each other, and fosters interpersonal and teamwork skills essential in data analytics roles.

6. Challenge Rework Policy

- Condition: Students have the opportunity to re submit one challenge after receiving feedback, earning partial recovery points if they improve their original work.
- **Purpose:** Allowing students to rework challenges emphasizes learning and growth over perfection, encouraging them to apply feedback and improve their understanding of difficult concepts.

7. Random Pop Quizzes and Concept Checks

- **Condition:** Weekly pop quizzes or short concept checks, focused on material from previous weeks, count for participation points but not toward overall competition points.
- **Purpose:** These low stakes quizzes encourage students to review and retain previous lessons, reinforcing knowledge and promoting long term retention.

8. Mandatory Final Presentation

- **Condition:** To qualify for any awards or certificates, students must present their capstone project to the class or judging panel.
- **Purpose:** The presentation requirement builds confidence, communication skills, and reinforces students' ability to explain complex data insights to others, simulating real world stakeholder presentations.

9. Learning Contract

- **Condition:** At the start of the event, each student signs a learning contract committing to participate actively, provide peer support, complete assignments on time, and engage in constructive feedback.
- **Purpose:** The learning contract sets clear expectations and helps students take ownership of their commitment to the course and each other, fostering a shared responsibility for everyone's success.

10. Optional Extra Challenge for Advanced Learners

• **Condition:** Offer an advanced "stretch" challenge each week for additional points, available only to students who have completed all required tasks.

• **Purpose:** This optional component provides additional learning opportunities for highly engaged students and ensures they are continuously challenged without overwhelming those who need more foundational practice.

Benefits of the DataQuest Incubator Model

- Enhanced Learning Outcomes: Students learn both technical and business skills, seeing firsthand how data analytics supports decision making and business strategy.
- **Professional Portfolio Development:** Real world projects with incubator support allow students to build a strong portfolio, boosting employability.
- **Networking and Career Opportunities:** The incubator's network provides exposure to industry professionals, potential employers, and mentors.
- Entrepreneurial Mindset: The incubator model fosters creativity, problem solving, and a drive for innovation, helping students think beyond classroom assignments.

By connecting **DataQuest** with an incubator, students gain a well rounded experience that prepares them for careers in analytics or entrepreneurial ventures, where they can leverage data to drive impactful, real world solutions.

Pedagogy for course "Text and Sentiment Analysis "

We use the Learn-to-Earn DataQuest Incubator approach for this course. This course will guide managers through hands-on text and sentiment analysis, emphasizing practical application, mentorship, and real-world business problems.

Week 1: Introduction to Text and Sentiment Analysis

- **Topics Covered:** Basics of text analytics, applications in business, introduction to sentiment analysis, overview of tools.
- Activities:
 - Kickoff session to introduce Learn-to-Earn structure and course goals.
 - Submit a mini-proposal outlining how students plan to use text analytics within a relevant business context.
 - Peer reviews on proposal ideas.
- Mentorship: Initial mentor introduction, discussing potential project ideas.
- **Assessment:** Points awarded for proposal clarity and peer feedback participation.

Week 2: Data Collection and Preprocessing Techniques

- **Topics Covered:** Text data collection (APIs, web scraping), data cleaning, handling missing data, tokenization, and normalization.
- Activities:
 - Complete a data collection and cleaning challenge using a provided dataset.
 - Peer review and mentor feedback on preprocessing techniques.
- **Mentorship:** Discuss best practices for managing unstructured text data with mentors.
- Assessment: Points awarded for quality of cleaned data, with feedback on preprocessing choices.

Week 3: Fundamentals of Natural Language Processing (NLP)

- **Topics Covered:** Overview of NLP techniques, including stemming, lemmatization, and POS tagging.
- Activities:
 - Apply NLP techniques to prepare data for sentiment analysis.
 - Submit a reflection on how these methods impact analysis accuracy and business insights.
- **Mentorship:** Review NLP outputs with mentors, discussing industry-specific applications.
- Assessment: Points for completing NLP tasks and reflections.

Week 4: Sentiment Analysis Techniques

- **Topics Covered:** Rule-based and machine learning-based sentiment analysis, basic sentiment models, and VADER.
- Activities:
 - Perform sentiment analysis on a selected dataset and interpret results.
 - Mini-presentation on how sentiment analysis insights could support business decisions.
- Mentorship: Receive feedback on sentiment analysis approach and results.
- Assessment: Points for sentiment analysis accuracy and presentation quality.

Week 5: Advanced Sentiment Models and Real-World Application

- **Topics Covered:** Advanced machine learning models for sentiment analysis, including Naive Bayes, SVM, and neural networks.
- Activities:
 - $_{\odot}$ $\,$ Experiment with at least two models on real business datasets.
 - Mid-course peer review of progress and approach.
- Mentorship: Mentor feedback on model selection and real-world applications.
- Assessment: Points for model performance and interpretation of results.

Week 6: Mid-Course Hackathon/Competition - Real-Time Text Analysis Challenge

- **Challenge:** A 24-hour hackathon focused on a real-world text analysis problem, such as customer reviews or social media sentiment.
- Activities:
 - Work in small teams to create an actionable analysis report.
 - $_{\odot}$ $\,$ Peer and mentor evaluations at the end of the hackathon.
- **Assessment:** Bonus points awarded based on quality of insights, teamwork, and presentation.

Week 7: Sentiment Analysis in Business Strategy

- **Topics Covered:** Using sentiment analysis to influence business decisions, case studies in customer experience, brand management, and market analysis.
- Activities:
 - Develop a use case report showing how sentiment insights can inform a business strategy.
 - Peer review and mentor feedback on business use cases.
- **Mentorship:** Discuss industry case studies with mentors, focusing on translating insights into business action.
- Assessment: Points for the business relevance and depth of the use case report.

Week 8: Capstone Project and Final Presentation

- **Project:** Complete a capstone project involving a full sentiment analysis on a selected business-relevant dataset.
- Activities:
 - Present findings and recommendations to a panel of mentors and peers.
 - $_{\odot}$ $\,$ Final peer review and feedback session.
- **Assessment:** Points awarded for technical accuracy, business insights, and presentation skills.
- Awards: Top projects may receive recognition, certification, or mentorship opportunities beyond the course.

Summary

Each week, students earn points through practical activities, reflections, and peer/mentor feedback. The course integrates technical skill-building with a focus on applying text and sentiment analysis to real-world managerial contexts, preparing participants to make data-informed strategic decisions.

Rubrics

Rubric for assessing student performance and awarding top achievers in the **"Text and Sentiment Analysis for Managers"** course, structured around weekly activities, projects, and the final capstone presentation. Each rubric area is broken down into core assessment criteria, with clear point distributions to guide students.

Assessment Rubrics for Weekly Activities and Projects

- 1. Weekly Task Completion and Quality (40%)
 - Data Quality and Preprocessing (10 points):
 - 0-3 points: Data is incomplete or insufficiently cleaned.
 - 4-7 points: Data cleaning is mostly complete, with minor errors.
 - *8-10 points*: Data is thoroughly cleaned, well-preprocessed, and ready for analysis.
 - Modeling and Analysis Execution (10 points):
 - 0-3 *points*: Models are incorrectly applied, with limited understanding shown.
 - 4-7 points: Models are appropriately applied, with some minor issues.
 - *8-10 points*: Models are accurately applied, demonstrating clear understanding.

• Interpretation of Results (10 points):

- 0-3 points: Limited interpretation of analysis, lacks clarity.
- 4-7 points: Interpretation is mostly clear but could be improved.
- *8-10 points*: Results are clearly interpreted and relevant to the problem context.
- Reflection and Peer Feedback Participation (10 points):
 - 0-3 points: Limited or superficial engagement in reflection and feedback.
 - *4-7 points*: Engages with reflections and peer feedback with moderate depth.

• *8-10 points*: Provides insightful reflections and constructive peer feedback.

2. Mid-Course Hackathon (20%)

- Team Collaboration (5 points):
 - 0-2 points: Minimal collaboration and team engagement.
 - *3-5 points*: Strong teamwork and well-coordinated efforts.

• Problem Solving and Analysis (10 points):

- 0-3 points: Limited problem-solving effort, with basic analysis.
- 4-7 points: Adequate problem-solving with relevant analysis.
- *8-10 points*: Creative and effective problem-solving with thorough analysis.

• Presentation and Clarity (5 points):

- 0-2 points: Presentation lacks clarity or detail.
- *3-5 points*: Clear, engaging, and well-structured presentation.

3. Final Capstone Project and Presentation (40%)

- Technical Depth and Accuracy (15 points):
 - 0-5 points: Limited technical accuracy and depth.
 - 6-10 points: Technically sound, with minor areas for improvement.
 - *11-15 points*: Exceptional technical accuracy and thoroughness.
- Business Insights and Application (15 points):
 - 0-5 points: Minimal connection to business relevance.
 - 6-10 points: Mostly relevant insights for business application.
 - *11-15 points*: Insightful analysis with strong relevance to business strategy.
- Presentation Skills and Professionalism (10 points):
 - 0-3 points: Lacks clarity, organization, or professionalism.
 - 4-7 points: Presentation is mostly clear and professional.
 - *8-10 points*: Highly polished, clear, and professionally delivered presentation.

4. Weekly Participation and Engagement (Weekly Points + Bonus)

 Consistent engagement, including active participation in peer review, mentor sessions, and feedback activities, will yield bonus points each week, rewarding consistent learning and engagement behaviors.

Awards and Recognition

1. Top Performer Award

- *Criteria*: Highest cumulative points in all assessments (minimum 85% of total).
- *Recognition*: Digital certificate, special mention at the final presentation, and potential internship or project opportunity with partnered companies.

2. Best Business Impact Award

- *Criteria*: Outstanding performance in translating text and sentiment insights into practical business applications (based on Week 7 business use case and final project).
- *Recognition*: Certificate of Excellence in Business Impact, with additional mentorship or case study feature.

3. Best Technical Execution Award

- *Criteria*: Highest points in technical categories (data preprocessing, modeling accuracy, advanced techniques).
- *Recognition*: Certificate of Technical Achievement, with the possibility of technical mentorship sessions with experts.

4. Most Engaged Learner Award

- *Criteria*: Consistently high participation, including reflections, peer feedback, and mentor sessions.
- Recognition: Certificate of Active Engagement and bonus points toward the final grade, demonstrating strong professional and academic development.

5. Capstone Excellence Award

• *Criteria*: Exceptional quality in capstone project and final presentation, as rated by mentors and peers.

 Recognition: Capstone Excellence Certificate, with a showcase opportunity to industry stakeholders or panel members for potential internships or consulting projects.

These rubrics and awards incentivize excellence, encourage engagement, and acknowledge both technical and practical competencies, supporting a holistic learning experience for managers in text and sentiment analysis.