Case Study: The Rise and Fall of ShopSecure

Introduction: A Promising Start

In 2017, ShopSecure launched with a bold vision: to provide a secure and seamless online shopping experience in an era where e-commerce was booming. Founded by former cybersecurity professionals, the company was driven by the core values of trust, transparency, and security. With consumers growing more cautious about sharing their personal data online, ShopSecure set out to address these concerns. Their cutting-edge encryption technologies, combined with real-time fraud detection, made them the go-to platform for security-conscious shoppers. In the first year alone, ShopSecure saw a revenue increase of 150%, attracting over 500,000 new users within its first six months.

Early Success and Growth

By 2019, ShopSecure had established itself as a fast-growing player in the e-commerce market. Their revenue had ballooned to \$50 million, with over 2 million users actively shopping on the platform. ShopSecure introduced innovations like biometric login features, AI-powered fraud detection, and 24/7 customer support. Their stellar performance led to a 40% increase in daily transactions. Users praised the platform for its unparalleled user experience, which allowed for fast, safe transactions.

The company's exponential growth was reflected in key metrics:

- Customer base: Grew by 300% in two years.
- Order volume: Surpassed 1.5 million monthly transactions by the end of 2019.
- Customer satisfaction: Maintained a consistent 4.8/5 rating across review platforms.

However, as ShopSecure grew, the company faced a new challenge: the introduction of third-party advertisements on their platform.

The Beginning of the Downfall: Unfair Practices

In late 2020, in a bid to further diversify revenue streams, ShopSecure introduced third-party ads on their platform. While this initially boosted revenue by 10%, it inadvertently introduced a vulnerability. Third-party ads were not properly vetted, and as the company scaled, they started to lose control over the quality of the advertisements.

In early 2021, some customers began noticing suspicious emails and pop-ups while using the platform. The issue grew as the company scaled its ad operations without implementing adequate security protocols. Some of these ads contained malicious URLs, leading users to phishing websites.

Customers who clicked these links faced malware infections, ransomware attacks, and, in extreme cases, data breaches.

Over the course of six months, this issue escalated. A 2021 internal audit revealed:

- 3,000 customer complaints of phishing attempts via ad links.
- Loss of 10% of the customer base within a quarter.
- Revenue loss of over \$5 million due to security issues.

The once-promising platform became a haven for scammers. As a result, ShopSecure's brand trust began to plummet, with their customer satisfaction score dropping from 4.8 to 3.2 by the end of 2021. Even worse, the company had unknowingly become complicit in email scams and **phishing** attacks.

Diseconomies of Scale: Growth Hindering Progress

As ShopSecure scaled beyond its initial capacity, the company experienced significant diseconomies of scale. The leadership focused too much on aggressive growth and revenue generation, neglecting the very core values—trust and security—that initially made the platform successful. This led to:

- A lack of stringent ad monitoring: Resulting in 1,500 instances of malware-ridden ads in Q1 2022.
- Over-reliance on automation: Al systems for fraud detection were overwhelmed by the growing number of threats, leading to delays in identifying malicious links.
- Customer complaints skyrocketed to over 5,000 complaints/month, while user retention rates plummeted from 70% to 45% in under a year.

These issues took a toll on ShopSecure's growth trajectory. The stock price fell by 30%, and major investors pulled out, signalling a public relations disaster. The platform lost credibility among its customer base, and over 500,000 users abandoned the platform within six months.

Rebuilding Trust

In 2022, under mounting pressure, ShopSecure launched an initiative to regain customer trust. The leadership team introduced stricter vetting processes for advertisements, implemented real-time URL analysis, and rebuilt their cybersecurity framework. But by this time, it was too late for many customers, who had already lost faith in the platform.

Despite these efforts, the company's revenue shrank to half its 2020 peak and has yet to regain its former glory. While they continue to operate, ShopSecure's story serves as a cautionary tale about the dangers of scaling too quickly without safeguarding the core values that initially fuelled growth.

About Dataset

Dataset Details:

The input dataset contains an 11k sample corresponding to the 11k URL. Each sample includes 32 features that give a different and unique description of U ranging from -1,0,1.

- -1: Suspicious
- 0: Phishing
- 1: Legitimate

The sample could be either legitimate or phishing.

Statement:

In response to the security issues that plagued their business, ShopSecure now wants to develop a robust phishing detection system. Your task is to analyse URL data and build a machine learning model that classifies whether a URL is legitimate or malicious.

Task1:

Exploratory Data Analysis:

- 1. Each sample has 32 features ranging from -1,0,1. Explore the data using histograms and heatmaps.
- 2. Determine the number of samples present in the data and unique elements in all the features.
- 3. Check if there is any null value in any features.

Correlation of features and feature selection:

1. Now, we have to find if there are any correlated features present in the data. Remove the feature which might be correlated with some threshold.

Task 2:

Building Classification Model

- 1. Finally, build a robust classification system that classifies whether the URL sample is a phishing site or not.
 - Build classification models using a binary classifier to detect malicious or phishing URLs.
 - Illustrate the diagnostic ability of this binary classifier by plotting the ROC curve.
 - Validate the accuracy of data by the K-Fold cross-validation technique.
 - The final output consists of the model, which will give maximum accuracy on the validation dataset with selected attributes