

Maximizing Value Through Vendor Performance Management

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Abstract:

In the modern business landscape, supply chain management is crucial for achieving operational efficiency and aligning external partnerships with organizational goals. To effective supply chain management, it is imperative to establish vendor performance management system and effective performance metrics. This paper explores the challenges and how to maximize the value addition via vendor management by integrating structured methodologies such as vendor performance scorecards with advanced data analytics. Vendor scorecards offer a standardized and systematic approach to defining key performance metrics (KPIs) that align business objectives, ensuring consistent and objective evaluation. This study presents a utility business case for designing these scorecards, emphasizing the importance of selecting the right KPIs and scoring mechanism. Furthermore, the paper discusses how data analytics can enhance performance evaluations by leveraging historical data to identify trends, benchmark vendor performance, and identify areas for improvement. The Monte Carlo method is introduced as an optimization tool for simulating individual vendor performance and refining benchmarking metrics, providing deeper insights into performance variability. Additionally, the role of ML and AI is discussed to dynamically adjust the weightage of KPIs on the vendor scorecard based on real-time data and business priorities, enabling adaptive and responsive performance management. The integration of these technologies offers a data driven, comprehensive approach to evaluating vendor performance, facilitating improved decision making and long-term strategic alignment.

Keywords: Vendor Performance Management, Vendor Scorecards, Key Performance Indicators (KPIs), Supply Chain Management, Data Analytics, Artificial Intelligence (AI), Machine Learning (ML), Monte Carlo Simulation, Adaptive KPI Weighting.

Introduction

In today's highly competitive business environment, organizations are increasingly reliant on supply chain partners (third-party vendors) for the smooth execution of their operations. The performance of these vendors has a significant impact on overall efficiency, cost-effectiveness, and quality of the goods and services delivered. As a result, managing vendor performance has become a critical component of business strategy. Traditional methods of evaluating vendor performance are often insufficient to provide a comprehensive and accurate understanding of vendor performance

since they do not consider real time data or provide any insight into future trends or patterns. This has led organizations to adopt or consider adopting more data driven approaches that leverage advanced tools like scorecards, data analytics, and artificial intelligence (AI) to assess, monitor, and improve vendor performance.

A vendor scorecard is a valuable tool that allows organizations to evaluate vendors based on multiple criteria such as delivery time, product or service quality, customer service, and compliance with contract terms. By systematically scoring and tracking these metrics, businesses can gain a clear and objective view of each vendor's strengths and weaknesses. However, the sheer volume and complexity of data generated by vendors across various touchpoints often overwhelm manual processes, making it challenging to uncover actionable insights (Xu & L. Bo, 2024). Data analytics and AI can play a transformative role. Through advanced data analytics and machine learning (ML) models, organizations can process large datasets, identify patterns, predict potential risks, and make data driven decisions to optimize vendor relationships.

This paper explores the integration of scorecards, data analytics, and ML/AI in managing vendor performance. We examine how these tools can work together to create a more dynamic, efficient, and transparent process for evaluating vendors. The use of data driven approach not only helps in identifying underperforming vendors but also enables organizations to proactively improve vendor collaboration, mitigate risks, and align vendor performance with strategic business goals. Ultimately, this research aims to provide a comprehensive framework for leveraging these technologies to drive better vendor management outcomes in the modern, data centric business landscape.

IMPORTANCE OF VENDOR PERFORMANCE MANAGEMENT

In today's dynamic work environment, many organizations engage vendors or contractors for various functions rather than relying solely on in-house resources. There can be various reasons behind this strategic engagement such as cost efficiency, access to specialized skills to enhance the quality of services or products, improved time-to-market, and also better flexibility and scalability to adapt to change in project demands or market conditions. Sometimes businesses can choose to outsource non core services to focus on core competencies driving growth.

A typical vendor lifecycle consists of various stages an organization goes through when engaging with the vendors, from initial vendor evaluation and selection, onboarding, performance monitoring, ongoing relationship and collaboration, assessment and quality development, leading back to evaluations for contract renewals or termination (Simpson, Siguaw, & White, 2022). Effective management of this lifecycle is crucial for optimizing vendor performance, ensuring smooth operations, and mitigating risks (Noshad & A. Awasthi, 2015).

Vendor relationships are typically long-term, requiring regular communication and collaboration. Vendor performance measurement can play a key role in strategic decisions such as vendor selection, contract negotiation, and the development of long-term partnerships. By understanding their performance, organizations can make data driven decisions on vendor development, risk management, and renegotiation of contracts (Harikrishnakumar, Dand,

Nannapaneni, & K. Krishnan, 2019). Managing vendor performance not only ensures adherence to quality expectations and service level agreements (SLAs), but continuous monitoring helps proactively identify and mitigate risks that can prevent disruption to operations and avoid any potential issues.

Utilizing vendors can give businesses an edge if the performance is monitored and managed efficiently. This article explores how data can be leveraged to enhance vendor performance and mitigate risks through the effective use of vendor performance scorecards, data analysis and ML/AI. This paper will also include an example from the utility industry to demonstrate its usability and effectiveness.

CHALLENGES IN VENDOR PERFORMANCE MANAGEMENT

Traditionally performance measurement systems focused on financial measures such as ROI than operational measures. Vendor performance scorecards eventually became an important and popular tool as it provides a more structured approach to evaluating vendors based on predefined criteria, enabling businesses to make informed and objective decisions regarding supplier selection, retention, and development.

Vendor performance scorecards enable enhanced decision making by providing a clear picture of vendor performance across various metrics. Scorecards can be tailored to align with business objectives. Since scorecards help assess all the vendors on the same metric, it provides consistency and transparency fostering trust between the organization and vendors. It serves as a feedback mechanism for vendors and can encourage them to improve performance in certain areas that can help mitigate risks.

The most noted framework used for designing scorecards since the 1990's has been Balanced Scorecard (BSC) (Kaplan & Norton, 1992) as the framework balances both financial and non-financial metric. The balanced scorecard focuses on four key perspectives, which, when considered together, provide a holistic view of the performance as compared to the traditional metric that primarily focused on financial goals.

The BSC methodology required to think through below perspective to identify goals and then define associated measures.

Financial Perspective: to measure financial performance to ensure profitability and growth targets are achieved. E.g. Goal could be prospering in the business, then measure could be increased market share and ROE.

Customer Perspective: focuses on customer satisfaction, retention and acquisition. E.g. If the goal is to introduce new products, the measure could be the percentage of sales of new products.

Internal Process Perspective: To assess internal processes to ensure that key processes are efficient and effective. E.g. If the goal is to Manufacturing excellence, measure could be the cycle time or unit cost yield.

Learning and Growth Perspective: Looks at the vendor's ability to innovate and improve, including employee training and development. E.g. if the goal is technology leadership, measure could be time to develop next generation.

Even though the balanced scorecard approach is widely being used by thousands of organizations and has been found beneficial to some extent, it also has certain limitations that should be considered while adopting model (Saleheen, Habib, & Hanafi, 2019).

- BSC is primarily a monitoring and controlling tool rather than improvement tool and delivers little guidance on how appropriate measures or corrective actions can be identified.
- It doesn't reflect relative performance compared to the market competition.
- It doesn't stipulate any mathematical logical relationship among the scorecard criteria.
- It typically focuses on a short period and overlooks cause-and-effect relationships over time. Since it periodically evaluates the past performance, it may become less effective in terms of improving performance as it doesn't reflect the current changes in the business environment leading to delays and potentially overlooks emerging opportunities.
- It can be limited since the performance measurement system should not only look at various perspectives as stated earlier but also focus on both short-term and long-term objectives, different types of performances (cost, quality, delivery, dependability etc.), external factors (competitors, regulations etc.), and various organizational levels.
- Lack of sustainability perspective

DESIGNING COMPREHENSIVE VENDOR PERFORMANCE SYSTEM

Vendor scorecards should be able to consider the multi-dimensional and multi-scale nature of vendor performance (Wang, Chang, & Wang, 2009). Also, the challenges in the traditional methods make it essential for organizations to adopt comprehensive evaluation frameworks.

It is imperative that we use a comprehensive approach to design performance systems such as scorecards and also integrate it with today's technology to go beyond traditional approach. It might be easier for organizations to adopt the vendor scorecards in the beginning to have a standardized method to evaluate the vendors. But as we have already discussed, it may be insufficient to provide the overall or larger picture in the long run. As the organization evolves towards higher data maturity, scorecards can be integrated with business intelligence (BI) and data analytics to leverage historical data to gain deeper insights into individual and collective vendor performance (Liu, Liu, Lin, Yang, Huang, & Shen, 2023).

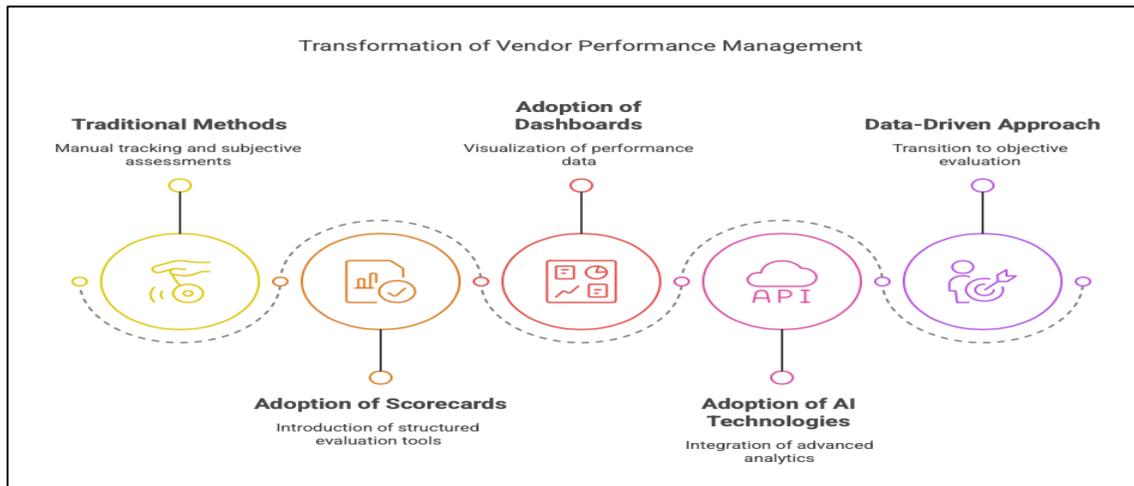


Fig. 1. Transformation of Vendor Performance Management

Vendor performance scorecards

Scorecards remain the focal point in managing performance and should be designed to tailor the organizational vision and objectives that will improve the vendor’s performance. A top-down approach can be used to ensure that that scorecard performance metric aligns with long-term and short-term objectives across strategic, tactical and operational levels of the organization. This may need the involvement of stakeholders from various levels and departments to identify and finalize the objectives, critical success factors (CSFs) and associated key performance indicators (KPIs) (Dey, Bhattacharya, Ho, & Clegg, 2015) Also, it may be important to take into consideration external factors such as competition, shifting market trends, regulatory environment, evolving technologies or economic conditions while determining the metric. Balanced scorecard approach guides us to consider the traditional financial perspective along with customer, internal process and learning/growth perspective.

It is important to provide weightage to various objectives since it is unlikely that all are equally important to ensure that vendor delivers desired results. This weight translates to the score that a vendor would get for his achieved performance for that KPI.

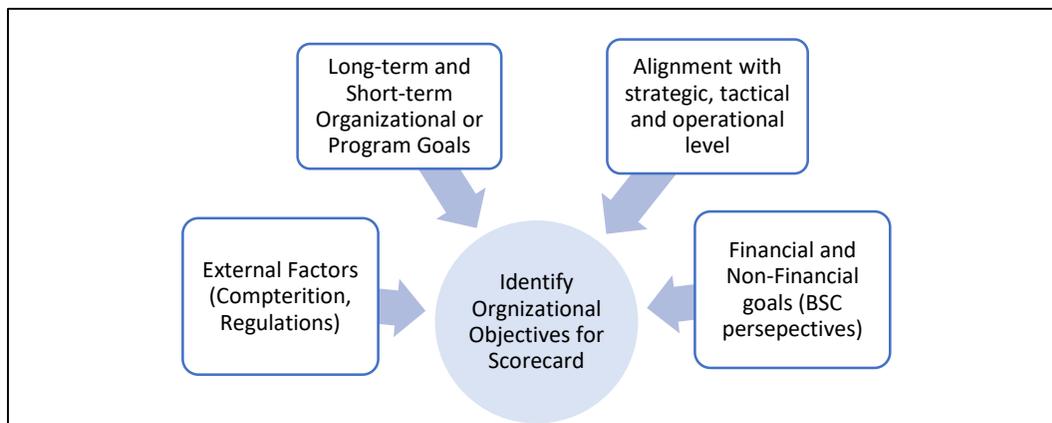


Fig. 2. Identify objectives to align with the vendor scorecard and relative weightage.

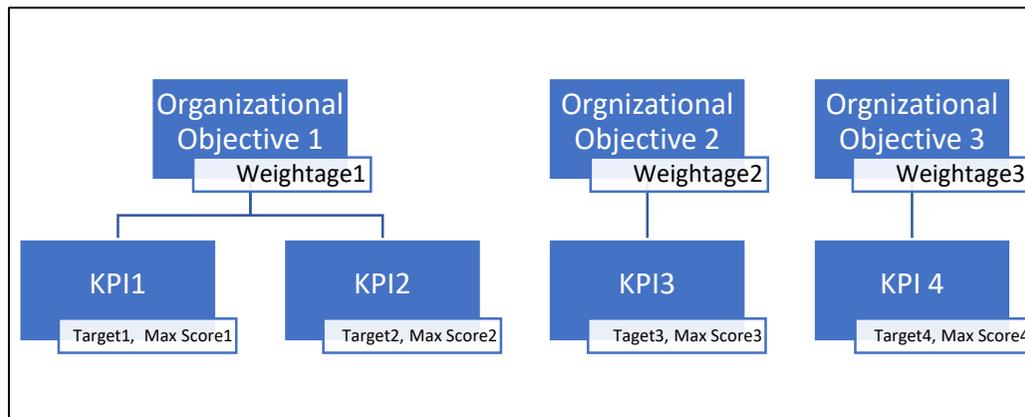


Fig. 3. Break Each Objective into SMART KPIs and associated targets.

Once key performance indicators (KPIs) have been established, it is essential to define specific targets for each KPI. Assessing vendor performance against these targets requires a more nuanced approach than simply determining whether the target has been met or calculating the percentage of the target achieved. By applying a Performance Grading Matrix, organizations can more precisely distinguish between varying levels of vendor achievement and areas requiring improvement.

This approach involves mapping each vendor's actual performance to predefined tiers within the KPI's scoring framework and assigning the corresponding score. The aggregate of these scores across all KPIs provides a holistic measure of the vendor's overall performance.

There are several ways to design a performance grading system tailored to business requirements. For example, similar to academic grading, the highest performers may receive the best scores. In the demonstration outlined here, we employ a system where higher scores indicate lower performance, while lower scores reflect stronger performance. In this context, a low or absent score suggests no significant issues, whereas higher scores highlight areas that require closer examination.

By implementing a standardized metric across all vendors and evaluating their performance against clearly defined objectives using consistent scales, organizations can achieve greater clarity in understanding both individual and comparative vendor performance.

USE CASE OF A UTILITY PROGRAM

The challenge

One of the strategic objectives of a utility company (referred as "Utility A") is to attain energy efficiency goals and it typically runs various programs for its residential and commercial customers to help identify energy savings opportunities (such as weatherization, installing or replacing with more efficient HVAC or other equipment) and implement energy efficiency measures. To facilitate this energy efficiency program, "Utility A" company contracts multiple vendors to deliver services such as setting up appointments with customers, performing energy audits, identifying areas to improve energy efficiency, implementing certain energy efficiency measures, recommending deeper energy savings measures and implementing these recommended but optional services by providing certain

rebates. Since multiple vendors are contracted regularly to provide these services to hundreds or thousands of customers on a regular basis, it was critical to monitor the vendor's performance on a regular basis to avoid any disruption and maintain customer satisfaction.

Even though vendors were required to feed the details of all the projects undertaken by them on a regular basis in the tracking system, there was a need for a standardized approach to assessing the performance of the vendors. Also, there was a need for a holistic view of the services being provided by vendors, and associated quality, compliance and cost; to identify gaps and manage expectations.

Vendor performance scorecards were effectively used to monitor individual vendor performance and provide data driven feedback to the vendors, as detailed in section 6.2. Furthermore, a BI dashboard was designed to leverage the data to provide an insight into various aspects such as relative performance, overall performance against program goals, any hidden trends or predictive insight, as described in section 6.3. This has enabled program management to take any corrective actions to improve vendor performance, decisions on renewing vendor contracts, or changes in how the performance is being evaluated such as change in performance metric or evaluation methodology (such as taking rolling averages of 6 months instead of considering monthly performance for certain metrics).

It is important to set realistic targets for vendors and align these with the actual performance trend of the vendors. It was challenging to determine the target for energy savings KPI, especially since there was a considerable gap between the energy savings attained by "Utility A" against industry trends. First the historical data was used to create a baseline, and then Monte Carlo simulations helped set the realistic target by considering the variation in the performance by each vendor, as described in section 6.4.

Designing Scorecard to monitor vendor performance

As discussed in previous sections, it is important to adopt a top-down approach to initially identify the "Utility A" objective, the short-term and long-term goals program goals, and understand how these goals relate to the work being done by the vendors at the customer end. The following approach enabled the alignment of the performance metric with high-level goals with the involvement of various stakeholders such as senior management, program management, engineers etc.

1. In the beginning, the high level goal needs to be identified along with the weightage associated with them, by brainstorming with various stakeholders, with consideration to various aspects as mentioned in section 6.1. A sample of such objectives is provided below:
 - A - Increase in the services provided with consideration to equitable access (Increase in services to certain low- or moderate-income customers) (Weightage – 20%)
 - B – Higher energy Savings achieved with focus on the deeper energy savings measures and/or electrification measures (decarbonization) (Weightage – 30%)
 - C - Maintaining quality of the services as per set program standards (Weightage – 10%)

- D – Project compliance adherence (Weightage – 10%)
 - E - Tracking Costs against goal (Weightage – 20%)
 - F - Customer Satisfaction (Weightage – 5%)
 - G – Ensuring that contractors are up to date with the latest technology/ trainings/ certifications (Weightage – 5%)
2. Once the objectives/goals are identified, the key performance metric or KPIs that can be tracked to measure the performance is identified. You can see some of the sample performance metric that was determined based on the objectives.
- Number of customers served (A)
 - Lower-income customers served (%) (A)
 - Deeper energy savings projects implemented (B)
 - Energy savings achieved per customer (B)
 - Projects that passed quality inspections (%) (C)
 - Projects that didn't meet compliance requirements (%) (D)
 - Cost per customer/project (E)
 - Customer survey score (F)
 - Training attended/ certifications completed (G)
3. Once the performance metric or KPIs are identified, the target for the KPIs needs to be determined wherever applicable e.g. At least 50% of the customers should receive deeper energy savings measures. Please note that not all the metrics will have a set target per vendor as some are only tracked to monitor overall performance.
4. It is crucial to determine the scoring criteria using a scoring mechanism that would translate the KPI performance to associate score. In the approach used below, performance is considered better if the score is lower, and higher score indicates underlying issues in the performance.

As an example, consider an objective (B) getting translated to associated KPIs, targets and scoring criteria.

	KPI1 Performance (Target $\geq 50\%$ projects)	KPI2 Performance (Target > 10 MMBtu)	Total Score
Vendor A	52%	11	0 [Ideal Performance]
Vendor B	35%	5	30 [needs improvement]

5. Each vendor will have a total score indicating its overall performance with a lower score indicating vendor performing good. Similarly, vendor performance for each KPI can be compared to high or low performing vendors for each performance metric.

<p>B – Higher energy savings achieved with the focus on deeper measures that enable electrification (30%).</p> <p>Please note that the weightage of 30% translates to total score of 30 for associated KPIs.</p>	<p>KPI 1 - Deeper energy savings projects implemented (B) [Max Score 10]</p>	<p>Target – 50% or more</p> <p>Scoring Criteria:</p> <p>10% or lower: 10, 11% to 30% - 7.5, 30% to 50% - 5, 50% to 70% - 0 (On Target) 70% or higher: -1 (rewarding for exceptional performance)</p>
	<p>KPI 2 Energy savings achieved per customer (A) [Max Score 20]</p>	<p>Target: X MMBtu [Define Scoring Criteria]</p>

ADOPTING DASHBORDS: TREND ANALYSIS

Vendors performance scorecard is a useful tool to manage vendor performance but considering vendor relationships are typically long-term and advancement in the technologies, historical data can be leveraged to get deeper insights into vendor performances. Creating a vendor performance scorecard for each vendor on a monthly or periodic basis can be limited, since it doesn't consider real time data, doesn't provide insight into performance trends and may not provide insight into how the collective performance aligns with the high-level goals.

Integrating scorecards with BI Dashboard can not only provide flexibility to review the current or past vendor scorecards of any vendor but dashboards can further be customized to display historical trends and identify patterns over time. It can enable visualization of the trends for each KPI for each vendor and collective performance for a KPI against the goal.

Trend analysis can provide useful insights into seasonal fluctuations, year-on-year trends, to evaluate the vendor performance against KPIs over time.

- Seasonality fluctuations can be uncovered by plotting monthly performance of the vendors over the years. It can help to uncover any fluctuations due to holidays, seasons, weather patterns, or other events. This can help teams to better manage variations during such identified events (e.g. higher participation rates in winter) and mitigate risks to avoid any disruption in service.
- Year-on-year or Quarter-on-quarter trends can be mapped to check variation in performance and further analysis. If there are noticeable improvements or deterioration in the performance during the certain period, Root Cause Analysis (RCA) can be done to identify the problem and take necessary actions.

- Evaluating Vendor Performance against KPIs over time helps identify vendors that consistently underperform in certain areas and enable management to facilitate vendors to improve the performance. Similarly, if there are performance gaps such as all the vendors seem to be consistently underperforming or overperforming on a certain KPI, metric itself may need to be reviewed and revised. As an example, KPI evaluation methodology can be refined from using monthly averages to six-months rolling averages.

Trend analysis on a periodic basis or in real time using dashboards enables continuous monitoring and opportunity to adjust the strategies so that the KPIs remain aligned with the overall program goals.

Benchmark targets for performance metric

Historical data can be useful for performance benchmarking by analyzing past data associated with a KPI against industry standard, competitors or internal goals. *Setting new performance targets can help* organizations set achievable and data driven goals based on past performance and external or internal standards. This can help avoid any misalignment between the goals and actual vendor performance trends. Setting up targets to be too ambitious might lead to vendor underperformance on scorecards, while being too conservative can seem like overperformance. Using a data driven approach can help set practical benchmark targets.

Using Monte Carlo Simulations for Benchmarking

“Utility A” was trying to set the performance targets for the KPI “Energy savings achieved per customer”. First, the past data was analyzed to set the baseline which was further used to set the target (baseline + X%). Also, industry trends were considered to verify if the new target seemed practical. Since there was a gap in the new target and industry trends, further statistical analysis such as Monte Carlo simulations to understand the probability of vendors achieving the target and resetting it if needed (Zeng, Cohen, Steele, & Sairamesh, 2008).

Monte Carlo simulations for a KPI allow for an understanding of the potential variability in vendor performance and a more effective assessment of risks.

This can be done using historical data for a vendor to first identify the underlying distribution characteristics such as type of probability distribution, associated mean and standard deviation; then simulating thousands of scenarios where each vendor’s performance is affected by random variability and check the probability of a vendor meeting the benchmark by aggregating the results of simulation.

Since the simulations can help predict the probability of a vendor(s) attaining the set target, it can be adapted effectively to study the future vendor performance against the benchmark, and we can revise the target to achieve to achieve the optimal performance.

FUTURE CONSIDERATION: ROLE OF ML/AI

Machine Learning (ML) algorithms and AI can be useful in managing vendor performance at various stages for predictive and prescriptive analytics. Predictive analytics help predict future trend based on historical data to anticipate potential outcomes, and prescriptive analytics can go a step further by recommending specific actions based on the predictions and provide data driven insights. ML and AI can be useful during vendor selection process to evaluate vendor performance and classify vendors as per performance (Özdemir & Temur, 2009); (Mudunuri, 2024). It can be effectively used to consolidate data from various sources such as invoices using ML or NLP techniques. (Saout, Lardeux, & Saubion, 2024).

Some other useful areas where ML/AI can help enhance vendor performance:

Predictive Vendor Performance Analysis:

Trend Analysis can be further enhanced using ML/AI technologies (Khan, et al., 2020) as these can not only predict the future performance using ML algorithms, but AI can also prescribe the corrective actions to improve the performance.

Dynamically adjusting scorecard KPI weightages

In the context of vendor performance scorecards, it can be useful to dynamically adjust weightage to each scorecard KPIs.

- Using historical data to determine which KPIs have had significant impact on vendor performance outcomes by identifying correlations with KPIs and business success and adjusting weightage accordingly.
- By predicting future performance or patterns and adjusting weightage to align with anticipated business needs.
- By analyzing trends to understand which KPIs are more critical at different stages of vendor relationship (such as quality metric might be important when a vendor is new or new product/service is introduced)
- By accounting for other external factors (economic conditions or market shifts) or change in internal organizational goals (policy changes)

Conclusion

The implementation of vendor performance monitoring through structured scorecards and robust data analysis has added tremendous value for the program management with a powerful mechanism to track performance, set clear expectations, and deliver consistent feedback to vendors. By aligning organizational objectives and program goals with vendor outcomes through precise metrics, the performance scorecard has ensured a cohesive approach to vendor management across multiple dimensions.

Integrating the scorecard with dynamic dashboards has provided program managers with real-time, comprehensive visibility into vendor performance trends. This capability enables ongoing

monitoring, timely interventions, and proactive strategy adjustments. Furthermore, leveraging trend analysis has facilitated the identification of process gaps, leading to meaningful discussions and driving continuous improvements in evaluation methodologies.

Establishing KPI benchmarks using data driven statistical methods can support the setting of realistic, pragmatic expectations for vendors. This approach does not only lead to measurable improvements in vendor performance but also fosters greater transparency and trust within vendor relationships.

Looking ahead, the adoption of advanced technologies such as machine learning and artificial intelligence will be essential. These tools offer the potential to proactively detect emerging issues and generate deeper, actionable insights, further strengthening data driven decision making and enhancing the overall effectiveness of vendor performance management.

References:

- Dey, P. K., Bhattacharya, A., Ho, W., & Clegg, B. (2015). "Strategic supplier performance evaluation: Case-based action research of a UK manufacturing organization,". *Int. J. Prod. Econ.*, vol. 166.
- Harikrishnakumar, R., Dand, A., Nannapaneni, S., & K. Krishnan. (2019). "Supervised machine learning approach for effective supplier classification,". in *Proc. 2019 18th IEEE Int. Conf. Machine Learning and Applications (ICMLA)*, pp. 240–245, Dec.
- Kaplan, R. S., & Norton, D. P. (1992). "The Balanced Scorecard – Measures that Drive Performance,". *Harvard Business Review*.
- Khan, M. A., Saqib, S., Alyas, T., Rehman, A. U., Saeed, Y., Zeb, A., et al. (2020). "Effective demand forecasting model using business intelligence empowered with machine learning,". *IEEE Access*, vol. 8, pp. 116013–116023.
- Liu, Y., Liu, W., Lin, S., Yang, C., Huang, K., & Shen, Z. J. (2023). "Data driven raw material robust procurement for non-ferrous metal smelter under price and demand uncertainties,". *IEEE Trans. Autom. Sci. Eng.*, vol. 21, no. 4, pp. 5852–5865.
- Mudunuri, L. N. (2024). "Artificial Intelligence (AI) Powered Matchmaker: Finding Your Ideal Vendor Every Time,". *FMDB Trans. Sustainable Intelligent Networks*, vol. 1, no. 1, pp. 27–39.
- Noshad, N., & A. Awasthi. (2015). "Supplier Quality Development: A review of literature and industry practices,". *International Journal of Production Research*, pp. 466–487.
- Özdemir, D., & Temur, G. T. (2009). "DEA ANN Approach in Supplier Evaluation System,". *World Academy of Science, Engineering and Technology, Int. J. Industrial and Manufacturing Engineering*, vol. 3, no. 6.

- Saleheen, F., Habib, M. M., & Hanafi, Z. (2019). "An Implementation of Balanced Scorecard on Supply Chain Performance Measurement in Manufacturing Industry,". *in Proc. ICBM*.
- Saout, T., Lardeux, F., & Saubion, F. (2024). "An Overview of Data Extraction From Invoices,". *IEEE Access*, vol. 12, pp. 19872–19886.
- Simpson, P. M., Siguaw, J. A., & White, S. C. (2022). White, "Measuring the Performance of Suppliers,". *Journal of Supply Chain Management*, pp. 29–41.
- Wang, S.-Y., Chang, S.-L., & Wang, R.-C. (2009). "Assessment of supplier performance based on product-development strategy by applying multi-granularity linguistic term sets,". *Omega*.
- Xu, J., & L. Bo. (2024). "Enhancing Supply Chain Efficiency Resilience Using Predictive Analytics and Computational Intelligence Techniques,". *IEEE Access*, 27 Nov.
- Zeng, S., Cohen, M. A., Steele, B. J., & Sairamesh, J. (2008). "A supplier performance evaluation solution for proactive supplier quality management,". *in Proc. 2008 IEEE Int. Conf. e-Business Engineering*, pp. 367–373, Oct. 2008.