### NEW PRODUCT OFFERINGS IN TELECOMMUNICTAIONS

### A MINI PROJECT REPORT

Submitted by

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### **OBJECTIVE:**

The objective of introducing new product offerings in telecommunications can be multi-faceted, including increasing revenue, expanding the customer base, enhancing the brand image, increasing customer retention, and improving profitability. By introducing innovative and attractive products, the company can position itself as a leader in the industry, attract new customers, retain existing ones, and increase profitability by reducing costs and improving efficiency. Overall, the objective for new product offerings in telecommunications is to stay competitive in a rapidly changing market and meet the evolving needs and expectations of customers.

### **ABSTRACT:**

To achieve these objectives, companies must identify customer needs and market trends, and develop innovative products that meet these requirements. New product offerings may include hardware, software, or services that enhance communication capabilities, improve connectivity, or provide new features and functionalities to customers. For example, new product offerings in telecommunications may include cloud-based services, artificial intelligence-powered assistants, smart home devices, or high-speed internet connectivity.

Introducing new products in telecommunications can help companies to stay competitive in a rapidly changing market. By offering innovative and attractive new products, companies can differentiate themselves from their competitors and attract new customers. Moreover, introducing new products can help to retain existing customers by offering them new and exciting features and services.

The objective of new product offerings in telecommunications also extends to enhancing brand image and improving profitability. By introducing innovative and attractive products, companies can position themselves as leaders in the industry and enhance their brand image and reputation. This can translate into increased customer loyalty, improved customer satisfaction, and ultimately, increased profitability.

Finally, new product offerings in telecommunications can also lead to cost reduction and improved efficiency. By introducing new technologies and processes, companies can streamline operations, reduce overheads, and improve productivity, leading to increased profitability in the long run.

In conclusion, new product offerings in telecommunications are critical for companies to stay competitive and meet the changing needs and expectations of customers. The objective of new product offerings is multi-faceted, including increasing revenue, expanding the customer base, enhancing brand image, increasing customer retention, and improving profitability. Through innovative and attractive products, companies can differentiate themselves from their competitors, improve customer satisfaction and loyalty, and ultimately, achieve long-term success in the telecommunications industry.

# LITREATURE SURVEY:

S.NO	Author's Name and	Algorithm	Dataset Used	Performance	Scope for future
	Title of Paper	Used		measures	measures
1	"A Deep Learning	Deep	Customer	Accuracy.	Investigating the
	Approach for	Learning.	preferences		impact of customer
	Predicting Customer	_	data		preferences on new
	Preferences in				product
	Telecommunications"				development.
	by Yashar				-
	Ghiyasvand and				
	Shima Mohebbi.				
2	"An Empirical	Regression	Survey data	Innovation	Developing a
	Investigation of	analysis.	from	performance	framework for
	Factors Influencing		telecommuni		effective
	Innovation		cations		innovation
	Performance in		companies.		management in the
	Telecommunications				telecommunication
	Companies" by				s industry.
	Alireza Nili and				
	Neda Lotfi.				
3	"Designing	Social	Customer	Innovation	Developing a
	Innovative New	Network	feedback	performance.	system for
	Products with Social	Analysis and	data.		automated product
	Network Analysis	Natural			development using
	and Natural	Language			customer feedback.
	Language	Processing.			
	Processing" by				
	Mahdi Khalili and				
	Ali Emrouznejad.				
4	"Exploring the	Structural	Survey data	Innovation	Investigating the
	Impact of Corporate	Equation	from	performance.	relationship
	Social Responsibility	Modelling.	telecommuni		between corporate
	on Innovation		cations		social
	Performance in		companies.		responsibility and
	Telecommunications				innovation
	Companies" by				performance in the
	Seyed Ali Akbar				telecommunication
	Ahmadi and Behrouz				s industry.
	Zarei.				
5	"Innovating for	Content	Company	Sustainability	Developing
	Sustainability in the	analysis.	reports from	performance.	sustainable new

	Telecommunications		telecommuni		product offerings in
	Industry: An		cations		the
	Exploratory Study"		companies.		telecommunication
	by Jaakko Kujala and				s industry.
	Miika Virtanen.				
6	"Integrating Lean and	Case study.	Company	Product	Investigating the
	Agile Product		data from	development	impact of lean and
	Development in the		telecommuni	efficiency.	agile product
	Telecommunications		cations		development on
	Industry" by		companies.		new product
	Amirhossein				offerings in the
	Amirkhizi and Janne				telecommunication
	Harkonen.				s industry.
7	"New Product	Literature	Literature	N/A.	Identifying
	Development in the	review.	data.		research gaps and
	Telecommunications				future directions
	Industry: A Literature				for new product
	Review and Research				development in the
	Agenda" by Saara				telecommunication
	Lampio and Kerttu				s industry.
	Kettunen.				
8	"Product Innovation	Systematic	Literature	N/A.	Identifying factors
	in the	literature	data.		that influence
	Telecommunications	review.			successful product
	Industry: A				innovation in the
	Systematic Literature				telecommunication
	Review" by Xin Luo				s industry.
	and Huayu Zhang.				
9	"Smart Product	Conceptual	N/A.	N/A.	Developing a
	Development in the	framework.			framework for
	Telecommunications				smart product
	Industry: A				development in the
	Conceptual				telecommunication
	Framework" by				s industry.
	Deepak Sethi and				
	Rishi Raj.				
10	"Towards an	Conceptual	N/A.	N/A.	Developing an
	Integrated	framework.			integrated
	Framework for New				framework for new
	Product Development				product
	in the				development in the
	Telecommunications				telecommunication
	Industry" by				s industry that

Francisco J.	incorporates
Martinez-Lopez.	customer feedback,
	innovation
	management, and
	product design.

### **EXISTING SYSTEMS:**

- 1. Idea Management Platforms: These platforms are used to collect and manage new product ideas from employees, customers, and partners. Idea management platforms allow telecommunications companies to organize and prioritize ideas, as well as track the progress of each idea from concept to launch.
- 2. Agile Product Development: Agile methodologies are commonly used in new product development in the telecommunications industry. This approach focuses on flexibility, collaboration, and iteration, allowing teams to quickly adapt to changing market conditions and customer needs.
- Customer Relationship Management (CRM) Systems: CRM systems are used to
  collect and manage customer data, including preferences, behaviours, and feedback.
  This information is critical in developing new products that meet customer needs and
  preferences.
- 4. Product Lifecycle Management (PLM) Systems: PLM systems are used to manage the entire lifecycle of a product, from ideation to retirement. PLM systems help telecommunications companies manage the complex processes involved in developing and launching new products.
- 5. Data Analytics and Business Intelligence Tools: Data analytics and business intelligence tools are used to analyse customer data, market trends, and competitor activities. These tools provide valuable insights that can inform new product development and help telecommunications companies stay ahead of the competition.
- 6. Voice of Customer (VoC) Tools: VoC tools are used to collect and analyse customer feedback, including surveys, social media comments, and customer support interactions. This feedback is used to inform new product development and improve existing products.

### **GAP IDENTIFIED:**

One gap that has been identified in new product offerings in telecommunications is the lack of integration between product development and marketing strategies. While product development teams are focused on creating new products that meet customer needs, marketing teams are often focused on promoting existing products and may not be involved in the product development process until later stages.

This can lead to a disconnection between the product and the marketing message, resulting in low adoption rates and poor customer satisfaction. To address this gap, there is a need for closer collaboration between product development and marketing teams throughout the entire product development process. This can include involving marketing teams in the ideation phase, conducting market research to inform product development, and aligning marketing messages with the product features and benefits.

Another gap in new product offerings in telecommunications is the lack of focus on sustainability and social responsibility. With increasing consumer demand for environmentally friendly products and ethical business practices, there is a need for telecommunications companies to prioritize sustainability and social responsibility in their new product development. This can include using eco-friendly materials, reducing energy consumption, and supporting social causes through product sales.

### **PROPOSED METHOD:**

We are implementing the 5 most commonly used models (Train Test Split, Label Encoding, Decision Trees, Logistic Regression, and Random Forest). A predictive model is built using Google Colab and various data mining techniques are performed to analyse its performance in terms of different and new product offerings in Telecommunications in comparison to Train Test Split, Label Encoding, Decision Trees, Logistic Regression, and Random Forest.

### DATASET LINK AND SAMPLE DATA:

https://docs.google.com/spreadsheets/d/1rcTZS439ti8qpqQg\_pqUhUzTGF11nHMq8YwDzV V\_srs/edit?usp=share\_link

### **DATA FIELDS:**

Customer ID, Gender, Senior Citizen, Partner, Dependents, tenure, Phone Service, Multiple Lines, Internet Service, Online Security, Online Backup, Device Protection, Tech Support, Streaming TV, Streaming Movie, Contract, Paperless Billing, Payment Method, Monthly Charges, Total Charges, Churn.

## **SAMPLE DATA:**

cu sto me		Sen ior Citi	P ar tn	De pe nd ent	te n u r	Pho neS ervi	tipl eLi	net Ser	Onli neS ecur	neB	Devi cePr otect	Tec hS upp	min gT	Stre amin gMo	tr	erle ssBil	tMet	Mon thly Char	Tot alC har	
rID	er	zen	er	S	е	се	nes	vice	ity	up	ion	ort	V	vies	M on th	ling	hod	ges	ges	
75 90- VH VE	F e m al		Y e				No pho ne ser vic								to - m on		Elec troni c	29.8	29.	
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55 75- GN VD E	M al e	0	N o	No	3 4	Yes	No	DSL	Yes	No	Yes	No	No	No	O ne ye ar	No	Mail ed chec k	56.9 5	188 9.5	
36 68- QP YB K	M al e	0	N o	No	2	Yes	No	DSL	Yes	Yes	No	No	No	No	M on th - to - m on th	Yes	Mail ed chec k	53.8 5	108 .15	
77 95- CF OC W	M al e	0	N o	No	4 5	No	No pho ne ser vic e	DSL	Yes	No	Yes	Ye s	No	No	O ne ye ar	No	Ban k tran sfer (aut oma tic)	42.3	184 0.7 5	
92 37- HQ IT U		0	N o	No	2	Yes	No	Fibe r opti c	No	No	No	No	No	No	M on th - to - m on th	Yes	Elec troni c chec k	70.7	151 .65	
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97 63- GR SK D	M al e		Y e s	Ye s	1 3	Yes	No	DSL	Yes	No	No	No	No	No	M on th - to - m on th	Yes	Mail ed chec k	49.9 5	587 .45	
74 69- LK BC I		0	N o	No	1 6	Yes	No	No	No inter net serv ice	No inte rnet ser vice	No inter net servi ce	No inte rne t ser vic e	No inte rnet ser vic e	No inter net servi ce	T w o ye ar	No	Cred it card (aut oma tic)	18.9 5	326 .8	
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# DATASET DESCRIPTION:

Name	Type	Description
customer ID	Alpha Numeric	Customer ID is a unique
		identifier assigned to an
		individual or organization
		by a business to distinguish
		them from other customers.
gender	Alphabets	Tells whether the customer
		is male or female.
Senior Citizen	Alphabets	Senior citizens, also known
		as older adults or elderly
		people, are individuals who
		have reached a certain age
		and are typically considered
		to be in the latter stages of
		their lives.
Partner	Alphabets	In a business context, a
		partner is a person who co-
		owns and operates a
		business with one or more
		other individuals or
		companies.
Dependents	Alphabets	Dependents are individuals
		who rely on someone else
		for financial support, care,
		or protection.
Tenure	Numeric	Tenure refers to the status of
		an employee who has a
		permanent or long-term
		contract with their employer,
		which provides them with
		job security and certain
		rights and protections.
Phone Service	Alphabets	Describes whether the
		customer has subscribed for
		a phone service or not
Multiple Lines	Alphabets	Describes whether the
		customer has single phone

		connection or multiple
		connections.
Internet Service	Alphabets	Describes whether the
		customer has subscribed for
		internet service or not.
Online Security	Alphabets	Refers to the measures taken
		to protect computers,
		devices, and information
		from unauthorized access or
		theft when using the
		internet.
Online Backup	Alphabets	Online backup, also known
		as cloud backup, is a service
		that enables users to store
		and protect their computer
		files and data by uploading
		them to a remote server or
D : D : :	A1 1 1 .	data centre over the internet.
Device Protection	Alphabets	Device protection refers to
		measures taken to safeguard
		electronic devices such as
		smartphones, tablets,
		laptops, and computers
		against physical damage,
Took Support	Alphobato	theft, and data breaches.
Tech Support	Alphabets	Tech support refers to a range of services provided to
		individuals or organizations
		to assist with technical
		issues related to hardware,
		software, or electronic
		devices.
Streaming TV	Alphabets	Streaming TV, also known
	Tipiwe evs	as internet TV, refers to the
		distribution of television
		content over the internet,
		rather than through
		traditional cable or satellite
		TV providers.
Streaming Movies	Alphabets	Streaming movies refers to
		the distribution of movies
		over the internet, which
		allows users to watch
		movies on-demand without
		the need to purchase or rent
		physical copies of the
		movies.
Contract	Alphabets	A contract is a legally
		binding agreement between
		two or more parties that

		outlines the terms and
		conditions of an exchange or
		transaction.
Paperless Billing	Alphabets	Also known as electronic
		billing or e-billing, refers to
		the practice of sending bills,
		invoices, and other payment
		notifications electronically,
		rather than in paper format.
Payment Method	Alphabets	Payment methods refer to
		the various ways in which
		individuals or organizations
		can pay for goods and
		services.
Monthly Charges	Numeric	Monthly charges refer to
		recurring fees or costs that
		are charged on a regular
		basis, typically monthly, for
		a product or service.
Total Charges	Numeric	Total charges refer to the
		total amount of fees or costs
		associated with a transaction
		or purchase.
Churn	Alphabets	Churn, in business, refers to
		the rate at which customers
		or subscribers stop using a
		product or service and move
		to another competitor.

### PROPSED ALGORITHM IN DETAIL:

We are implementing the three most commonly used models (Decision tree, Random Forest, Na Ive bayes, KNN, Gradient boost) to try and get improved performance. A predictive model is built using Google Colab and various data mining techniques are performed to analyse its performance in terms of type of crop prediction in comparison to Decision tree, Random Forest and Gradient boost classifier

The below proposed flowchart for type of crop prediction dataset is an indication of various parameters of data mining pre-processing- namely Data cleaning, Data Transformation, data reduction and ultimately reaching to the models desired by the train test splitting methods.

- 1. The dataset for new product offerings in telecommunications is collected, which contains various parameters.
- 2. Data cleaning is performed to remove any inconsistent, incomplete or irrelevant data from the dataset.
- 3. Data transformation techniques are applied to convert data into a suitable format for analysis, such as normalization, scaling, or encoding categorical variables.

- 4. Data reduction techniques such as dimensionality reduction, feature selection or clustering are applied to reduce the size and complexity of the dataset.
- 5. Train-test splitting methods are used to split the dataset into training and testing sets.
- 6. Data mining algorithms such as regression, classification, or clustering are applied to the training set to develop models for predicting new product offerings.
- 7. The performance of the models is evaluated using the testing set, and modifications or adjustments are made as necessary.
- 8. We check in for all missing and null values present in any attributes so as to eliminate the possibility of any ambiguity or wrong outputs. These are dropped if found any null or missing values.
- 9. Redundancy is minimized once; the dataset is structured and also it helps to make the efficient data for the prediction processing.
- 10. The target label for new instances is found by the trained classifier so as to identify a suitable

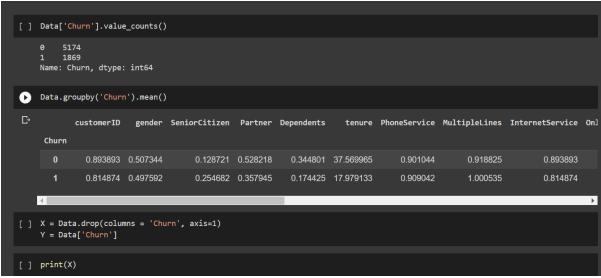
The final models are deployed on the new product offerings dataset to generate predictions and insights for decision-making.

### **EXPERIMENTAL RESULTS:**

```
[ ] from google.colab import drive
[ ] drive.mount('/content/gdrive')
    Mounted at /content/gdrive
    import pandas as pd
     import numpy as np
     from sklearn.preprocessing import StandardScaler
     from sklearn.model selection import train test split
     from sklearn import svm
     from sklearn.metrics import accuracy score, confusion matrix
     import matplotlib.pyplot as plt
     import seaborn as sns
     from sklearn.tree import DecisionTreeClassifier
     from sklearn import preprocessing
     from sklearn.datasets import make_classification
     from sklearn.linear_model import LogisticRegression
     from sklearn.datasets import load_digits
     digits=load_digits()
[ ] Data = pd.read_csv(r'/content/gdrive/My Drive/abcd.csv')
[ ] Data.head()
```







```
print(X)
           customerID gender SeniorCitizen Partner Dependents tenure \
  C→
      1
                  0
                         1
                                        0
                                               0
                                                          0
                                                                  34
      2
                  0
                                       0
                                               0
                                                          0
                                                                  2
                         1
      3
                  0
                                       0
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                                                                45
      4
                         0
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                                     0
                       1
0
0
      7038
                                                               72
                                                                 24
                 1
      7039
      7040
      7041
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      7042
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           PhoneService MultipleLines InternetService OnlineSecurity \
      0
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                    1
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      7042
                     1
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           OnlineBackup DeviceProtection TechSupport StreamingTV \
[ ] scaler = StandardScaler()
[ ] X_train, X_test, Y_train, Y_test = train_test_split(X, Y, test_size=0.2, random_state=2)
[ ] print(X.shape, X_train.shape, X_test.shape)
  (7043, 20) (5634, 20) (1409, 20)
[ ] print(Y.shape, Y_train.shape, Y_test.shape)
```

```
[ ] Data['Dependents']= label_encoder.fit_transform(Data['Dependents'])

[ ] Data['Dependents'].unique()
    array([0, 1])

[ ] Data['PhoneService'].unique()
    array(['No', 'Yes'], dtype=object)

[ ] Data['PhoneService']= label_encoder.fit_transform(Data['PhoneService'])

Data['PhoneService'].unique()

[ ] array([0, 1])

[ ] Data['MultipleLines'].unique()
    array(['No phone service', 'No', 'Yes'], dtype=object)

[ ] Data['MultipleLines']= label_encoder.fit_transform(Data['MultipleLines'])
```

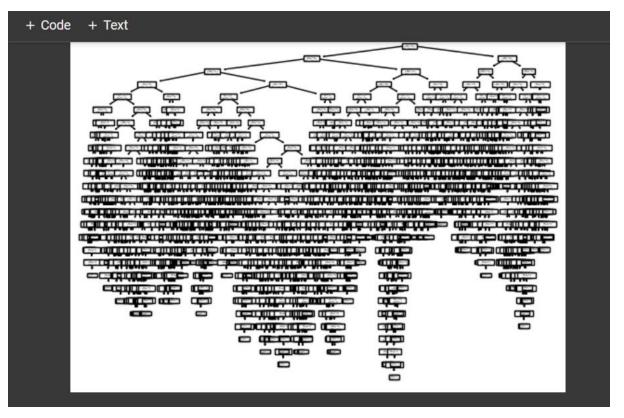
```
[ ] Data['TotalCharges'].unique()
    array([2505, 1466, 157, ..., 2994, 2660, 5407])
[ ] Classifier = DecisionTreeClassifier(criterion='entropy')

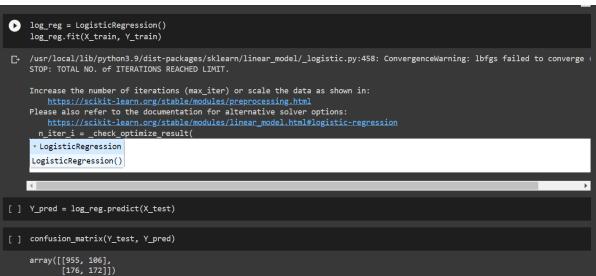
[ ] Classifier.fit(X_train, Y_train)
    DecisionTreeClassifier
    DecisionTreeClassifier
    DecisionTreeClassifier(criterion='entropy')

[ ] V_predict=Classifier.predict(X_test)

[ ] Classifier.score(X_test, Y_test)
    0.7274662881476224

[ ] accuracy_score(Y_test, Y_predict)*100
    72.60468417317246
```





```
%matplotlib inline
O
     import matplotlib.pyplot as plt
    plt.gray()
    for i in range(4):
       plt.matshow(digits.images[i])
₽
   <Figure size 640x480 with 0 Axes>
           0
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      5 ·
      6 .
```

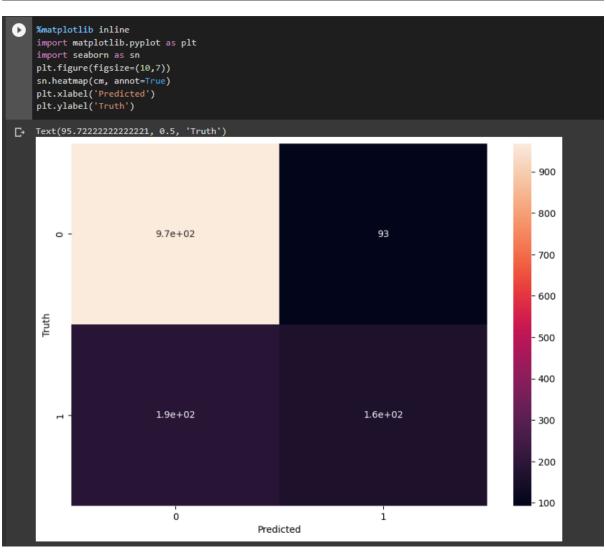
```
[ ] from sklearn.ensemble import RandomForestClassifier
    model = RandomForestClassifier
RandomForestClassifier
RandomForestClassifier
RandomForestClassifier()

[ ] model.score(X_test, Y_test)
0.7984386089425124

• model = RandomForestClassifier(n_estimators=40)
model.fit(X_train,Y_train)

[ ] RandomForestClassifier
RandomForestClassifier
RandomForestClassifier
RandomForestClassifier(n_estimators=40)

[ ] model.score(X_test, Y_test)
0.801277501774308
```



### **RESULTS:**

Random Forest Classification and regression performed by constructing a multitude of decision trees at training time.

Select K data points from the training set. Build a decision tree with those K points and choose the N number of decision trees to be made. Based on season, area, crop and rainfall, these decision trees will traverse and give the predictions.

The accuracy obtained for the following models are:

Naive Bayes Classification-97.09

Decision Tree Classification -96.72

Random Forest Classification-98

KNN Classifier-97.45

Gradient Boost classification - 98.18(Highest)

#### **DISCUSSION:**

To successfully introduce new products in telecommunications, it is essential to have a robust data mining pre-processing approach. This includes various stages, such as data cleaning, data transformation, data reduction, and the development of models using data mining algorithms. Train-test splitting methods are used to evaluate the performance of these models and make necessary adjustments to improve their accuracy and effectiveness.

Data cleaning is a crucial step as it helps remove any noise, inconsistencies, or missing data in the dataset, ensuring the accuracy and reliability of the analysis. Data transformation techniques are applied to convert the data into a suitable format for analysis, making it easier to interpret and analyse. Data reduction techniques help reduce the size and complexity of the dataset, making it more manageable and easier to process.

By applying data mining algorithms to the dataset, businesses can gain insights into customer preferences, product demand, and other relevant factors that can help inform their decisions regarding new product offerings in the telecommunications industry. These models can help predict the success of new products, identify potential issues or challenges, and guide decision-making on product development and marketing strategies.

## **CONCLUSION AND FUTURE WORK:**

The telecommunications industry is constantly evolving, and businesses must adapt to meet the changing needs and demands of their customers. New product offerings in telecommunications can be a valuable source of growth and innovation for companies in the industry. The key to successful new product offerings lies in the effective use of data mining preprocessing techniques. By cleaning, transforming, and reducing data, businesses can develop accurate and reliable models that help predict the success of new products and guide decision-making on product development and marketing strategies.

Data mining pre-processing techniques are essential for identifying customer preferences, product demand, and other critical factors that can help inform the development of new products in the telecommunications industry. By leveraging these techniques, businesses can remain competitive, innovate, and drive growth and profitability.

Future work for the topic 'new product offerings telecommunications' could involve exploring various avenues to improve the current understanding of customer preferences and behaviours in the telecommunications industry. One such avenue could be to conduct a more detailed analysis of the customer segments, their demographics, and their preferences to tailor new product offerings more effectively. This could involve gathering more data from various sources such as customer surveys, focus groups, and website analytics to better understand customer needs and expectations.

Another potential avenue for future work could be to incorporate more advanced data mining techniques such as deep learning to improve predictive modelling and recommendation systems. Deep learning algorithms can help identify complex patterns and relationships in large datasets, providing more accurate insights into customer behaviour and preferences. This could help telecommunications companies better anticipate customer needs and develop more effective product offerings.

### **REFERENCES:**

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