

INTRODUCTION TO SAS® TEXT MINER™



CUSTOMER LOYALTY TEAM • Support You Can Count On

TODAY'S AGENDA

INTRODUCTION TO SAS® TEXT MINER™

- Define data mining
- Overview of SAS® Enterprise Miner™
- Describe text analytics and define text data mining
- Text Mining Process
- SAS® Text Miner™
- Illustrate text mining by example

- Q&A

A QUICK INTRODUCTION TO DATA MINING

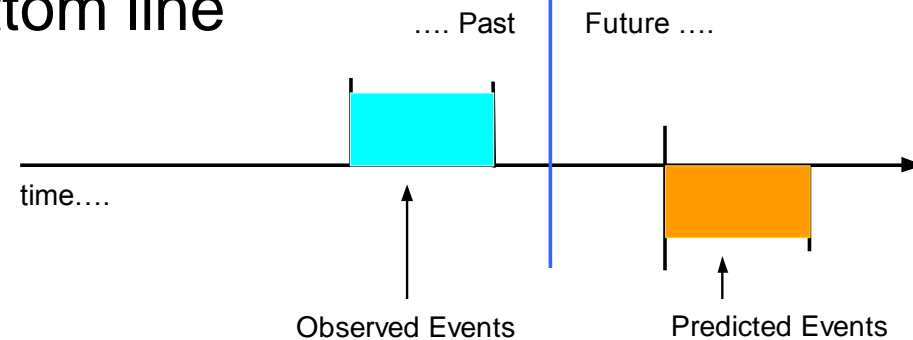


WHAT IS DATA MINING?

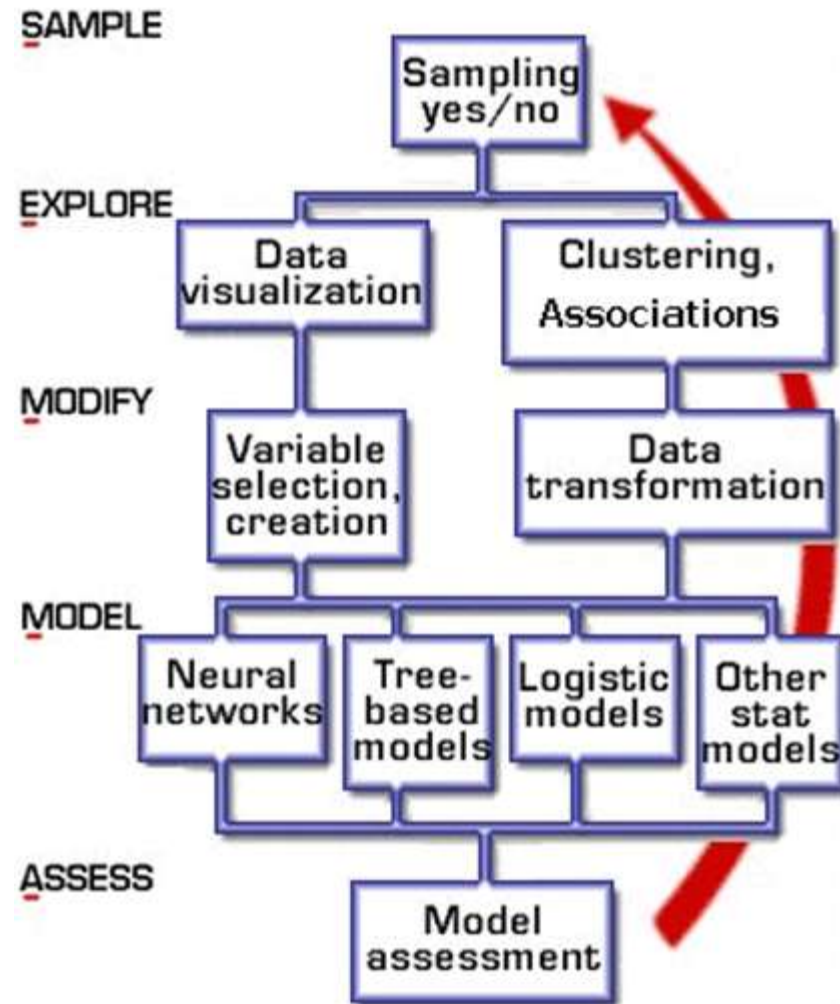
Turning increasing amounts of
raw data into useful information

DATA MINING IS:

- Discovering patterns, trends and relationships represented in data
- Developing models to understand and describe characteristics and activity based on these patterns
- Using insights to help evaluate future options and take fact-based decisions
- Deploying scores and results for timely, appropriate action that affects the bottom line



SEMMA DATA MINING WITH SAS® ENTERPRISE MINER™



SAS® ENTERPRISE MINER™

MODEL DEVELOPMENT PROCESS

Sample

Explore

Modify

Model

Assess

- Input Data
- File Import
- Sample
- Data Partition
- Merge
- Filter
- Append
- Time Series

- Association
- Cluster
- Variable Selection
- Market Basket
- StatExplore
- Variable Clustering
- MultiPlot
- Path Analysis

- DMDB
- SOM/Kohonen
- Graph Explore

- Transform Variables
- Impute
- Replacement
- Interactive Binning
- Rules Builder
- Drop
- Principal Components

- Decision Tree
- AutoNeural
- Dmine Regression
- DMNeural
- Ensemble
- Gradient Boosting
- LARS
- MBR

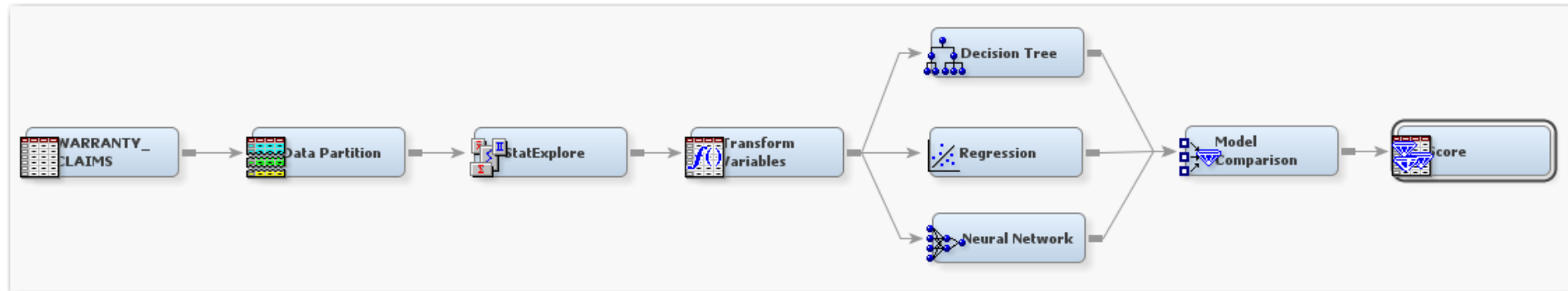
- Neural Network
- SVM
- Partial Least Squares
- Regression
- Rule Induction
- TwoStage
- Model Import

- Model Comparison
- Score
- Segment Profile
- Decisions
- Cutoff

Text

- Text Import
- Text Parsing
- Text Filter
- Text Topic
- Text Cluster
- Text Rule Builder

SEMMA A GLIMPSE OF SAS® ENTERPRISE MINER™



SAMPLE

EXPLORE

MODIFY

MODEL

ASSESS and SCORE

Sample

Explore

Modify

Model

Assess

SEMMA A GLIMPSE OF SAS® ENTERPRISE MINER™

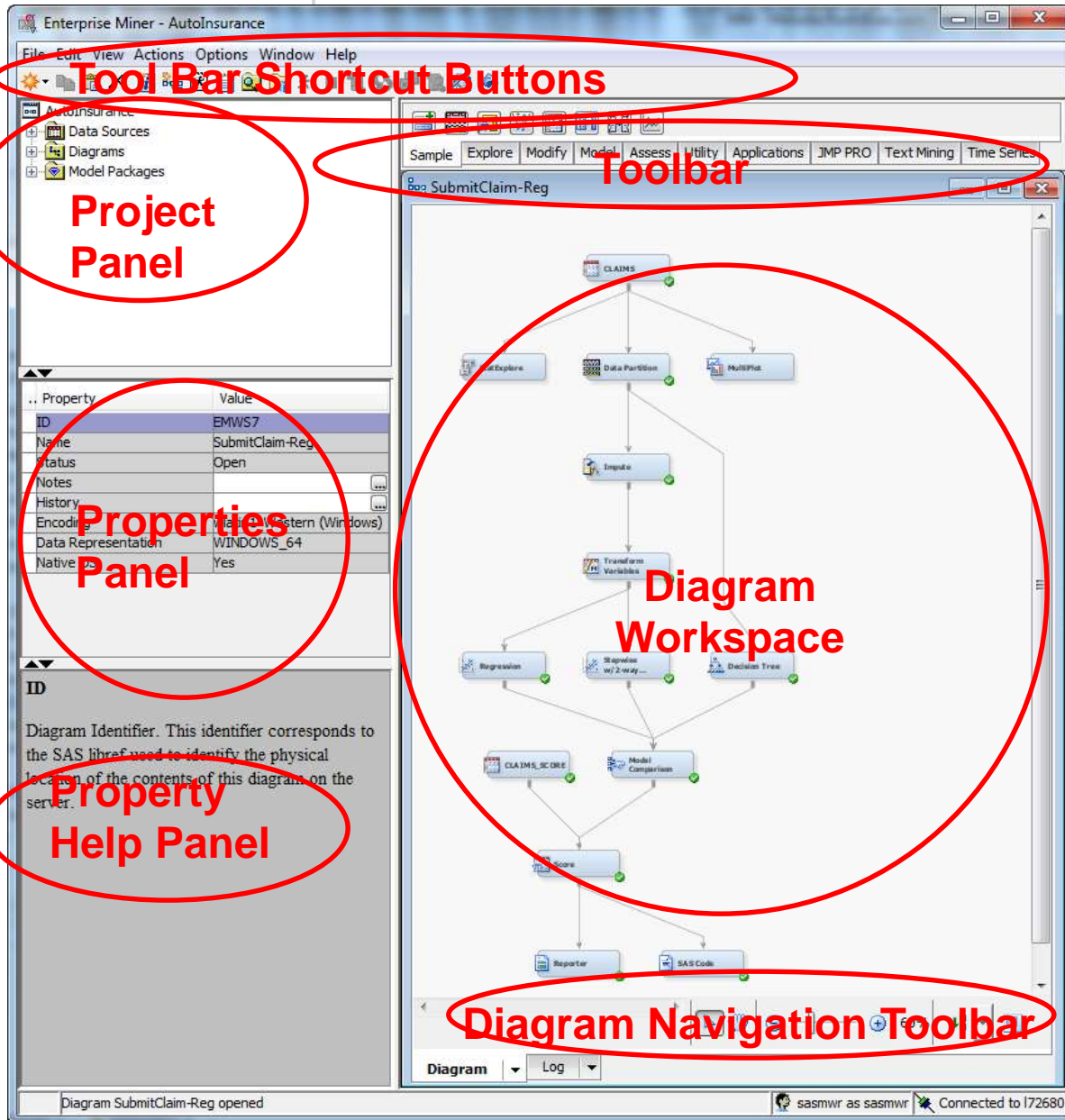
The screenshot displays the SAS Enterprise Miner interface for a project named 'Test_Project'. The main workspace shows a workflow diagram for 'Warranty Analysis' with the following steps: WARRANTY_CLAIMS (data source) → Data Partition → StatExplore → Transform variables → a parallel split into Decision Tree, Regression, and Neural Network models → Model Comparison → Score (output). A light blue callout box points to the 'Data Partition' node and contains the following text:

Tools are organized to support the SEMMA process:

- **S**ample
- **E**xplore
- **M**odify
- **M**odel
- **A**ssess

In the bottom-left corner, a property table is visible:

Property	Value
General	
Node ID	Score
Imported Data	...
Exported Data	...
Notes	...
Train	
Variables	...
Type of Scored Data	View
Use Fixed Output Names	Yes
Hide Variables	No
Hide Selection	...
Score Data	
Validation	No
Test	No
Score Code Generation	
Optimized Code	Yes
C Score	Yes
Java Score	Yes
Java Package Name	Default
User Package Name	



SAS Enterprise Miner GUI

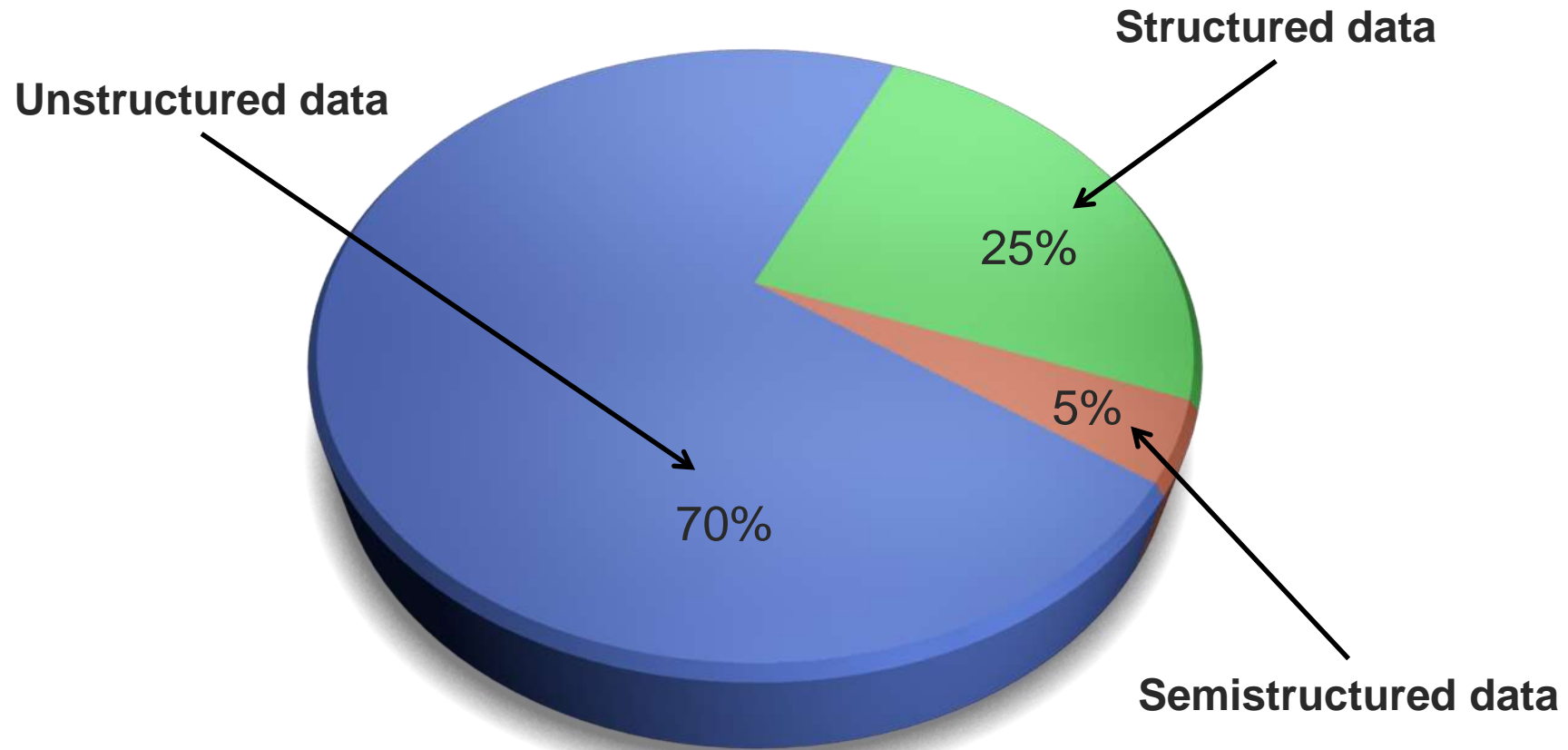
SAS[®] TEXT MINER™



WHY MINE TEXT? IS VALUABLE INFORMATION “LOCKED AWAY” IN UNSTRUCTURED DATA?



UBIQUITY UNSTRUCTURED AND SEMI-STRUCTURED DATA



EXAMPLE DATA

Structured Data

- Age Group = 60+
- Satisfaction = Not Very
- Rewards Customer= No
- Total Hold Time = 8

Unstructured Data

- they called me so i returned their call because it was cut off in the middle of the conversation. every time they call me, they're cut off.

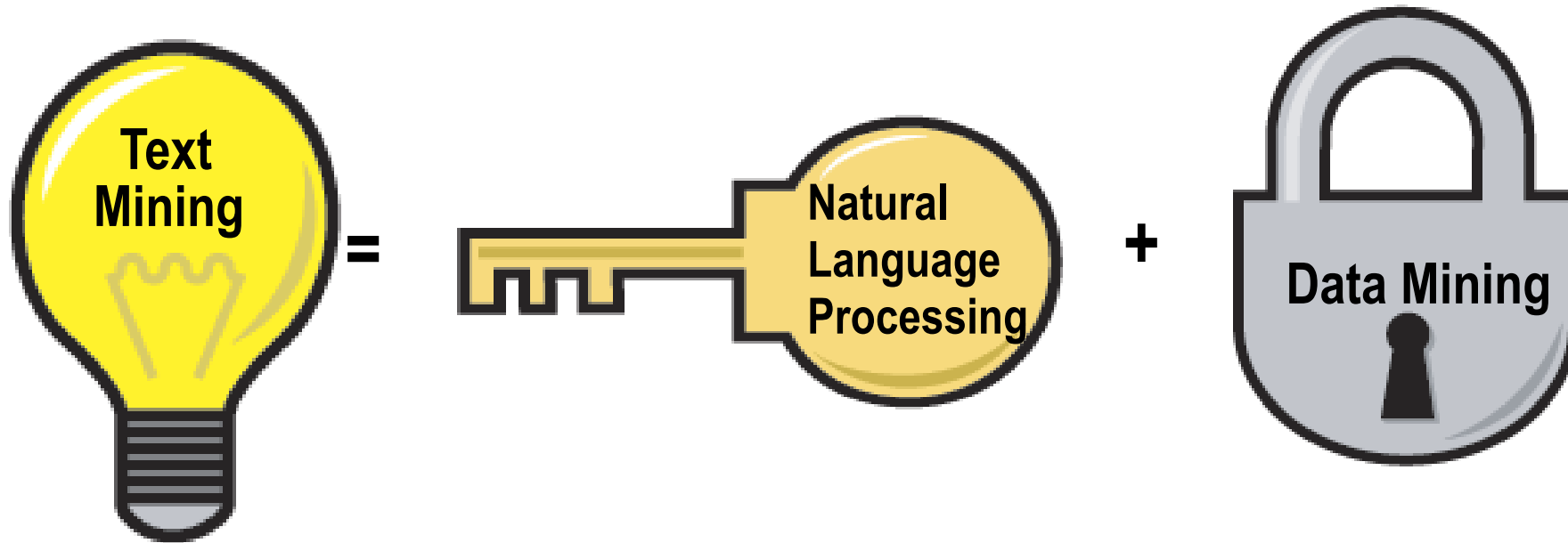
WHY MINE TEXT? WHAT CAN BE LEARNED FROM UNSTRUCTURED DATA?

- Are any of these documents related to one another based on their contents and the characteristics of their contents?
- What are the key topics, themes or concepts being discussed?
- Are there emerging issues?
- Do the documents contain potentially valuable information that could improve predictive models?



TEXT MINING DEFINED

The process of **discovering** and **extracting** meaningful patterns and relationships from text collections



TEXT MINING | TWO GENERAL GOALS

1. Pattern Discovery (Unsupervised Learning)
2. Prediction (Supervised Learning)

These are the same general goals of data mining.

WHAT IS THE TEXT MINING PROCESS?



TEXT MINING THE PROCESS

Text Preprocessing

Text Parsing

Transformation (Dimension Reduction)

Document Analysis

SAS® TEXT MINER ADD-ON

The screenshot displays the SAS Enterprise Miner interface for a project named 'Test_Project'. The main workspace shows a workflow diagram for 'Warranty Analysis'. The workflow starts with a data source 'WARRANTY_CLAIMS', followed by 'Data Partition', 'StatExplore', and 'transform variables'. From 'transform variables', the workflow branches into three parallel paths: 'Decision Tree', 'Regression', and 'Neural Network'. These three paths converge into a 'Model Comparison' node, which finally leads to a 'score' node. A light blue callout bubble points to the 'Text Mining' tab in the top menu bar, which is highlighted. The callout bubble contains the following text:

When SAS® Text Miner is licensed, an additional tab, “Text Mining”, appears in the workspace, containing tools to process and analyze unstructured data

The bottom-left corner of the interface shows a property window with the following table:

Property	Value
General	
Node ID	Score
Imported Data	...
Exported Data	...
Notes	...
Train	
Variables	...
Type of Scored Data	View
Use Fixed Output Names	Yes
Hide Variables	No
Hide Selection	...
Score Data	
Validation	No
Test	No
Score Code Generation	
Optimized Code	Yes
C Score	Yes
Java Score	Yes
Java Package Name	Default
User Package Name	

TEXT MINING THE PROCESS

Text Preprocessing

Text Parsing

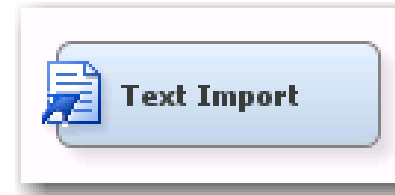
Transformation (Dimension Reduction)

Document Analysis

INPUT DATA | TEXT MINER

- The expected SAS data set for text mining should have the following characteristics:
 - One row per document
 - A document ID (suggested)
 - A “text” column
- The “text” column can be either:
 - The actual full text of the document, up to 32,000 characters
 - A pointer to a text file (*.txt, *.html) located on the file system
- The SAS data set can also have structured data and a target variable (dependent variable, response variable)

TEXT IMPORT NODE



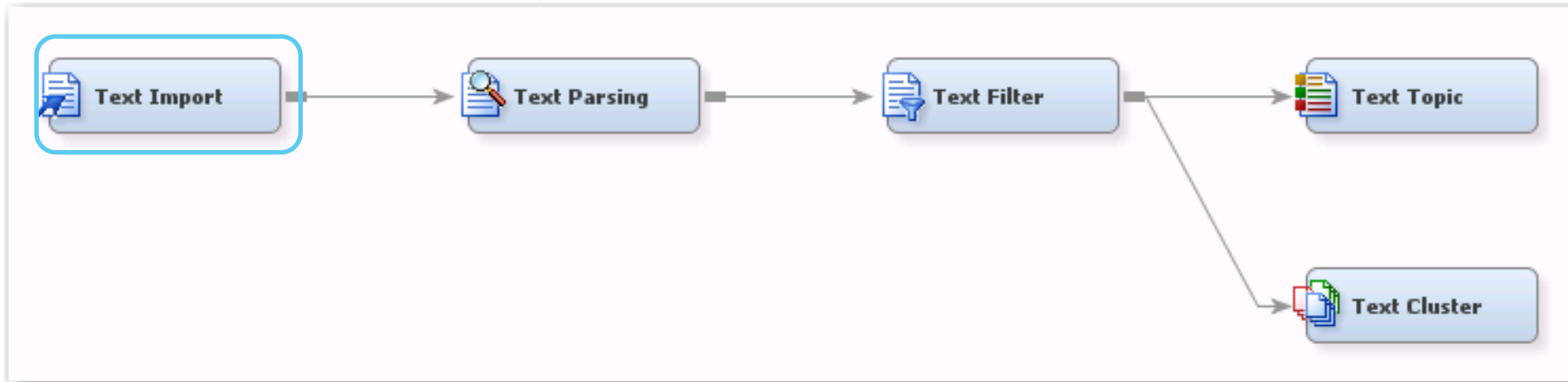
- Enables you to create data sets dynamically from files contained in a directory or from the Web.
- Takes an import directory containing text files in potentially proprietary formats such as MS Word and PDF files as input.
- Extracts the text from the files, places a copy of the text in a plain text file, and a snippet (or possibly even all) of the text in a SAS data set.
- If a URL is specified, the node will crawl Web sites and retrieve files from the Web
- The output of a **Text Import** node is a data set that can be imported into the **Text Parsing** node.

EXAMPLE INPUT DATA

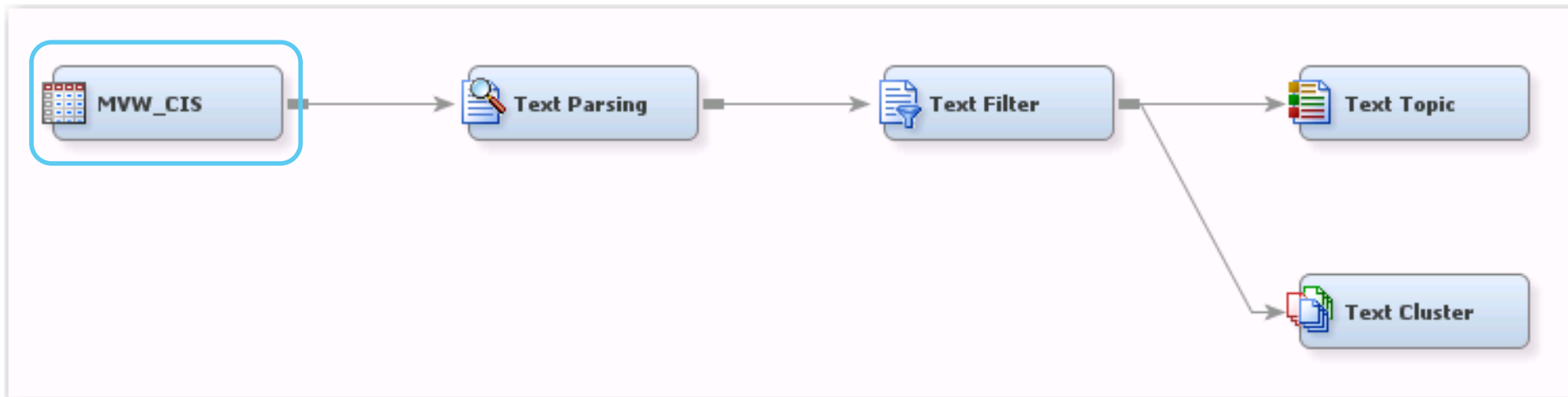
TOT_AGT_HOLD_DUR	TOT_AGT_TALK_DUR	CALL_REAS_1	CSAT_BRAND_RELTNSHIP	ASAT_RESPONSE	CSAT_OVERALL	v_dissat...	v_call_reason
8.0	969.0	3571 - Stop Payment on an account	Very	Completely satisfied	Somewhat	i called th...	just charges that were not supposed to
5.0	546.0	3071 - Statement Questions/Billing inqu...	Not at all satisfied	Not at all satisfied	Not at all satisfied	i was ne...	i called trying to get a hold of one rep...
4.0	1162.0	3114 - Dispute the Validity of a Fee	Somewhat	Very	Not very	i'm satisfi...	there was a problem with a charge.
13.0	283.0	3101 - Dispute A Merchant Charge	Somewhat	Not at all satisfied	Not at all satisfied	i'm still ca...	i made a charge on my credit card prof...
75.0	573.0	3157 - Questions about Account Securi...	Somewhat	Somewhat	Not at all satisfied	i keep try...	trying to get a hold of the fraud depart...
51.0	686.0	3075 - Request Hardship	Not at all satisfied	Not at all satisfied	Not at all satisfied	because i...	to receive financial assistance.
106.0	415.0	3034 - Advanced Payment/Set Up Pay...	Somewhat	Not very	Not very	i was calli...	i had received several messages from ...
66.0	810.0	3085 - Notify Of Late Payment	Somewhat	Very	Somewhat	just i alw...	i called them because i told them i cou...
163.0	693.0	3031 - Make a Payment	Not very	Not at all satisfied	Not at all satisfied	they wer...	i tried to pay my monthly statements v...
69.0	1537.0	3075 - Request Hardship	Not at all satisfied	Not at all satisfied	Not very	it was ac...	the reason was to let them know what...
164.0	1132.0	3072 - Haven't Received Statement	Somewhat	Completely satisfied	Somewhat	i didn't g...	they changed my account number and...
101.0	880.0	3037 - Change or Inquiry regarding Pa...	Somewhat	Somewhat	Not very	essential...	kind of a lengthy reason, bottom line,
76.0	454.0	3031 - Make a Payment	Somewhat	Not very	Somewhat	i didn't m...	to payoff my credit card.
274.0	941.0	3114 - Dispute the Validity of a Fee	Not at all satisfied	Completely satisfied	Not very	just the ...	about the \$25 fee that kept popping u...
35.0	597.0	3034 - Advanced Payment/Set Up Pay...	Very	Completely satisfied	Somewhat	there wa...	to get some kind of payment arrangem...
69.0	629.0	3075 - Request Hardship	Not very	Not at all satisfied	Not very	my wife ...	my wife and i are both unemployed, an...
50.0	376.0	3037 - Change or Inquiry regarding Pa...	Somewhat	Not at all satisfied	Not at all satisfied	i was tryi...	just a lost of job and things were gett...
52.0	941.0	3034 - Advanced Payment/Set Up Pay...	Not very	Not very	Not at all satisfied	i felt reall...	just to communicate about why i was m...
53.0	504.0	3031 - Make a Payment	Somewhat	Somewhat	Somewhat	the repre...	to get caught up on my payments.
38.0	1407.0	3034 - Advanced Payment/Set Up Pay...	Somewhat	Completely satisfied	Somewhat	some thi...	they had called and i wanted to try to...
58.0	660.0	3021 - Change Name/Address on Acco...	Not very	Not at all satisfied	Not at all satisfied	i guess it ...	change of address.
53.0	1032.0	3075 - Request Hardship	Somewhat	Very	Somewhat	i don't lik...	the first time i called, someone from...

EXAMPLE

TEXT MINING PROCESS FLOWS



External Documents



Text in Column or Document location in column

TEXT MINING PROCESS

Text Preprocessing

Text Parsing

Transformation (Dimension
Reduction)

Document Analysis

TEXT PARSING



- Text parsing decomposes textual data and generates a quantitative representation suitable for data mining purposes.
- It transforms this:

```
v_call_reason
just charges that were not supposed to be on the account.
i called trying to get a hold of one representative that's been very nice through the whole ordeal, that's been trying to help me and she gave me her employee id number and told me to contact her. that way, she could give it more a one-on-one instead of speaking to a hundred different people and they wouldn't put me through to her. they said it was impossible for them to put me through to her when she had said it wasn't impossible so i got nowhere with that conversation, on saturday.
there was a problem with a charge.
i made a charge on my credit card probably now close to a month ago to an auto mechanic shop. the mechanic shop did terrible work, so i wanted to dispute my charge, but i'm not being able to process my dispute.
trying to get a hold of the fraud department. contact who has my case. she's never there, never calls back.
to receive financial assistance.
i had received several messages from orion. they were trying to reach me for a payment for this month.
i called them because i told them i couldn't make a payment until the 6th of january.
i tried to pay my monthly statements via my smart phone, but i was told my customer service online technical support department that their online payment system is not compatible with smart phones.
the reason was to let them know what was going on in our life, and that we would not be able to pay this bill. i did make the last bill, i made the minimum payment. all i got out of orion, "if you pay next month's minimum payment, we'll give you $39, too." i says, "are you going to do that every month?" "oh no. we'll have to charge you a $25 late fee." to me, this was an... i call... and tel... how...
```

TEXT PARSING



- Text parsing decomposes textual data and generates a quantitative representation suitable for data mining purposes.
- ... into this:

Terms							
	TERM	FREQ	# DOCS	KEEP ▼	WEIGHT	ROLE	ATTRIBUTE
⊕	credit card	5213	2874	<input checked="" type="checkbox"/>	0.0050	Noun Group	Alpha
	credit	2076	1579	<input checked="" type="checkbox"/>	0.044	Noun	Alpha
⊕	payment	2103	1387	<input checked="" type="checkbox"/>	0.0040	Noun	Alpha
⊕	account	1644	1160	<input checked="" type="checkbox"/>	0.065	Noun	Alpha
⊕	want	1406	1114	<input checked="" type="checkbox"/>	0.062	Verb	Alpha
⊕	pay	1475	927	<input checked="" type="checkbox"/>	0.093	Verb	Alpha
⊕	orion	1210	857	<input checked="" type="checkbox"/>	0.121	Noun	Alpha
⊕	know	948	737	<input checked="" type="checkbox"/>	0.069	Verb	Alpha
⊕	activate	838	730	<input checked="" type="checkbox"/>	0.058	Verb	Alpha
⊕	bill	926	684	<input checked="" type="checkbox"/>	0.075	Noun	Alpha
⊕	contact	763	682	<input checked="" type="checkbox"/>	0.118	Verb	Alpha
⊕	charge	842	651	<input checked="" type="checkbox"/>	0.014	Noun	Alpha
	interest	743	596	<input checked="" type="checkbox"/>	0.098	Noun	Alpha
⊕	charge	705	541	<input checked="" type="checkbox"/>	0.085	Verb	Alpha
⊕	receive	612	503	<input checked="" type="checkbox"/>	0.018	Verb	Alpha
⊕	rate	621	498	<input checked="" type="checkbox"/>	0.097	Noun	Alpha
⊕	balance	614	496	<input checked="" type="checkbox"/>	0.01	Noun	Alpha

TEXT PARSING



- Documents are represented internally in SAS[®] Text Miner by a vector that contains the frequency of how many times each term occurs in each document.

Term	Role	Attribute	Freq	# Docs	Keep
i	...Noun	Alpha	17881	4760N	4760N
+ be	...Verb	Alpha	11609	4099N	4099N
+ card	... Noun	Alpha	4043	2842Y	2842Y
+ not	...Adv	Alpha	5016	2446N	2446N
+ have	...Verb	Alpha	3604	2073N	2073N
+ get	...Verb	Alpha	2658	1803N	1803N
+ do	...Verb	Alpha	3541	1792N	1792N
+ credit	... Noun	Alpha	2078	1580Y	1580Y
+ call	...Verb	Alpha	2177	1467N	1467N
+ payment	...Noun	Alpha	2103	1387Y	1387Y
+ make	... Verb	Alpha	1609	1214N	1214N
+ account	... Noun	Alpha	1644	1160Y	1160Y
+ want	...Verb	Alpha	1404	1112Y	1112Y
+ credit card	... Noun Group	Alpha	1168	990Y	990Y
on	...Adv	Alpha	1119	935N	935N
+ pay	...Verb	Alpha	1475	927Y	927Y
+ say	... Verb	Alpha	1478	872N	872N
just	...Adv	Alpha	1082	871N	871N
+ go	...Verb	Alpha	1244	860N	860N
orion	... Noun	Alpha	1209	856Y	856Y
+ know	...Verb	Alpha	941	732Y	732Y
+ activate	...Verb	Alpha	838	730Y	730Y
+ try	... Verb	Alpha	859	715N	715N
+ bill	... Noun	Alpha	926	684Y	684Y
+ tell	... Verb	Alpha	990	678N	678N
+ contact	... Verb	Alpha	749	675Y	675Y
then	...Adv	Alpha	923	652N	652N
+ charge	...Noun	Alpha	842	651Y	651Y
what	...Adv	Alpha	771	609N	609N
interest	Noun	Alpha	743	596Y	596Y

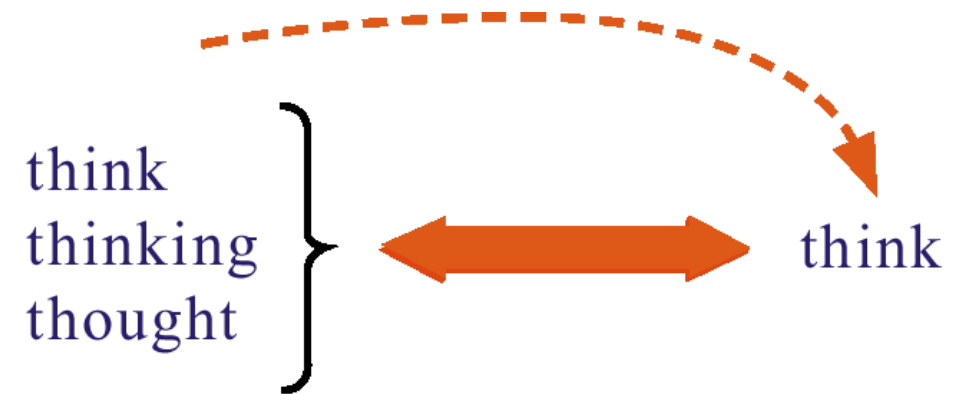
TEXT PARSING



STEMMING

PART OF SPEECH

- Determines if the word is a common noun, verb, adjective, proper noun, adverb, etc.
- Disambiguate parts of speech when a word is used in a different context,
 - *I wish that my **bank** did not have a service charge for using other vendor ATM's.*
 - *You can **bank** on either Germany or England winning the world cup next year.*



ENTITY EXTRACTION

Places

White House



People's Names

James H. Goodnight



Dates



PARTS OF SPEECH IN SAS® TEXT MINER



- Abbr (abbreviation)
- Adj (adjective)
- Adv (adverb)
- Aux (auxiliary or modal)
- Conj (conjunction)
- Det (determiner)
- Interj (interjection)
- Noun (noun)
- Num (number or numeric expression)
- Part (infinitive marker, negative participle, or possessive marker)
- Pref (prefix)
- Prep (preposition)
- Pron (pronoun)
- Prop (proper noun)
- Punct (punctuation)
- Verb (verb)
- VerbAdj (verb adjective)



- Address
- Company
- Currency
- Date
- Internet
- Location
- Measure
- Organization
- Percent
- Person
- Phone
- Prop_Misc (proper noun – ambiguous classification)
- SSN (U. S. Social Security Number)
- Time
- Time_Period
- Title
- Vehicle (motor vehicle)

ADDITIONAL PARSING STEPS



- **Specify Start/Stop/Synonym Lists**

- Filtering out low information words such as
 - articles (e.g. the, a, this)
 - prepositions (e.g. of, from, by)
 - conjunctions (e.g. and, but, or)
- Consider document subject matter as well as domain-specific language and acronyms

- **Vertical dictionaries**

- Automatically generate synonyms appropriate to the data

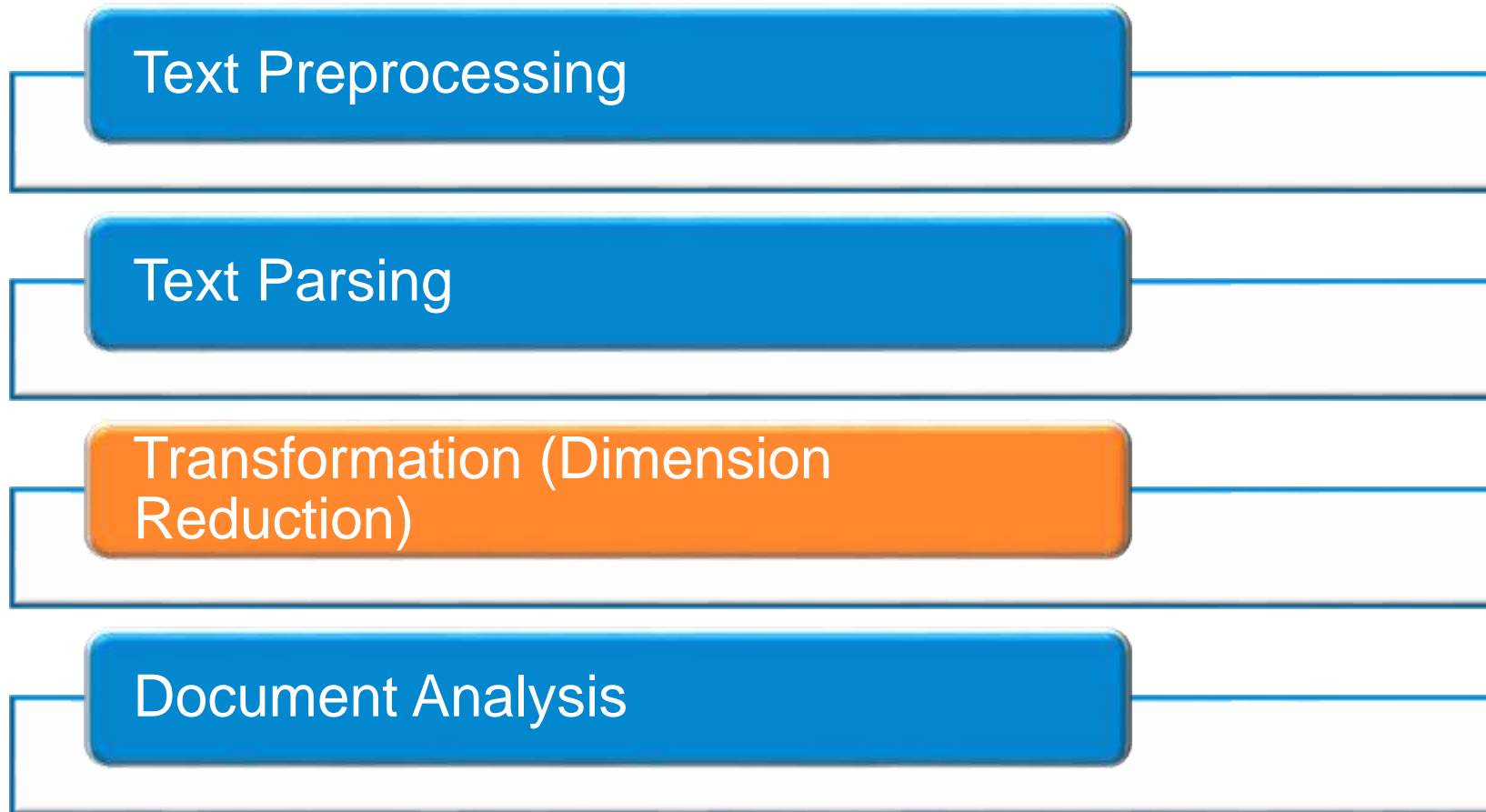
ADDITIONAL DATA PREPARATION

- Remove “*boilerplate*” language common to most or all documents
 - Headers and footers
 - Common qualifiers
 - Disclaimers
- Parse created data
 - Convert abbreviations
 - Correct misspellings
- Use term frequency filtering to assist with the creation of a stop list

ADDITIONAL DATA PREPARATION

- Recommendation: create subsets of documents by language. For example, all English documents in one corpus, all German documents in another corpus, etc.
- SAS includes extremely robust and sophisticated data manipulation capabilities, including character functions and regular expressions.

TEXT MINING PROCESS



TEXT TRANSFORMATION



- Also referred to as “Dimension Reduction”
- Transforms the quantitative representation into a compact and informative format
- Can also be used to further refine the data to be analyzed. For example, you can reduce the total number of parsed terms or documents that are analyzed.
- Eliminates extraneous information so that only the most valuable information or information that relates to a particular area of interest is considered.

TEXT FILTER NODE



- Spell checking
- Concept Linking
- Full text search
- Define additional synonyms
- Sub-setting management of terms and documents that are passed to subsequent nodes

DIMENSION REDUCTION TECHNIQUES

- Singular value decomposition (SVD)
- Roll up terms
- Combination of both approaches

TEXT MINING PROCESS

Text Preprocessing

Text Parsing

Transformation (Dimension
Reduction)

Document Analysis



- Expectation Maximization Clustering
 - Generates groups of similar documents from output of SVD
 - Fast clustering of many documents
- Hierarchical Clustering
 - Great for creating document taxonomies



- Note: each document is assigned to a single cluster
- Optionally, use unsupervised data mining methods like self organizing maps or clustering after building text mining clusters, using the text mining cluster segment identifiers as inputs in the subsequent analysis

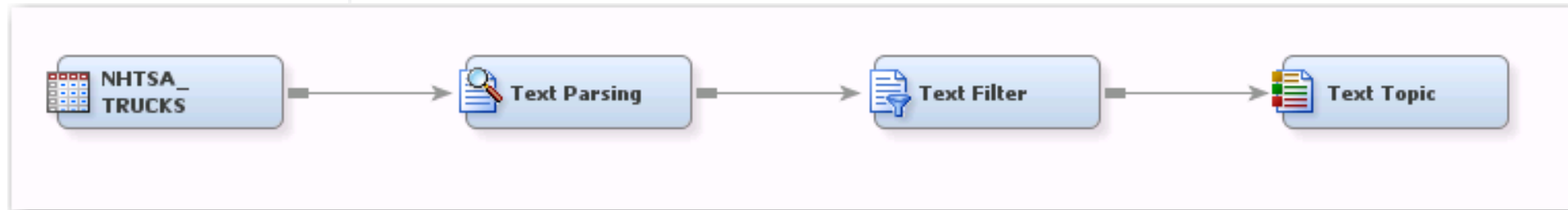


- Discovers topics in document collection
- Allows automatic creation of single and multi-word topics
- User defined topics and editing of automatic topics
- Multiple topics per document
 - Soft clustering using rotated SVD (PROC SVD followed by PROC FACTOR)

SAS® TEXT MINER PROCESS



EXAMPLE TEXT MINING PROCESS FLOWS



Start with a table that contains either:

- Documents saved as a variable (column)
- A column that points to physical text files

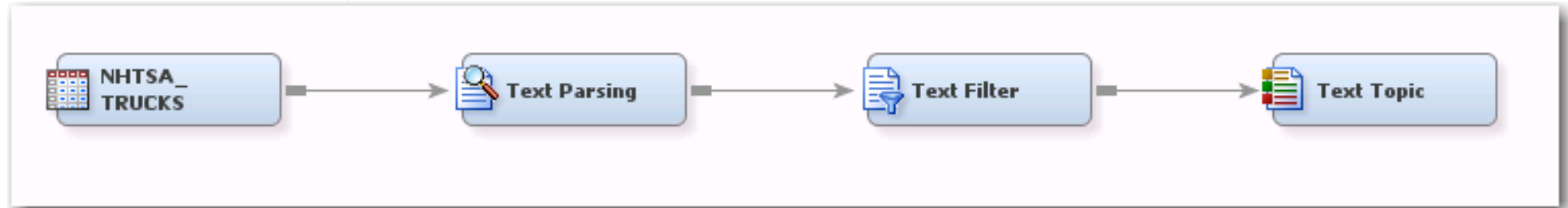
EXAMPLE TEXT MINING PROCESS FLOWS



Apply natural language processing algorithms to **parse the documents** and **quantify information** about the terms in the corpus.

- Determine parts of speech (noun, verb, etc.)
- Perform stemming (run, runs, running, ran, etc.)
- Identify entities (names, places, etc.)

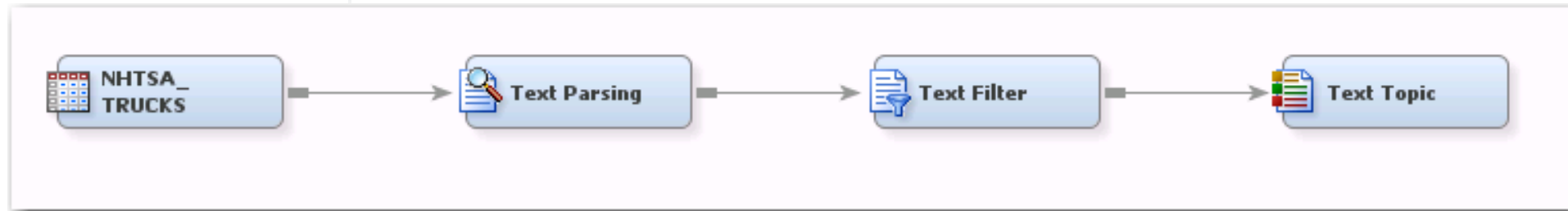
EXAMPLE TEXT MINING PROCESS FLOW



Optionally, filter the terms or documents that will be analyzed.

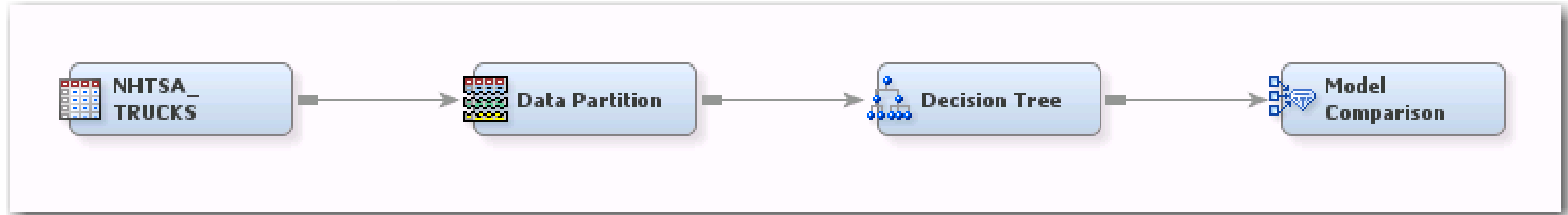
Can also perform spell-checking, full text searches, and analyze and view with Concept Linking

EXAMPLE TEXT MINING PROCESS FLOWS

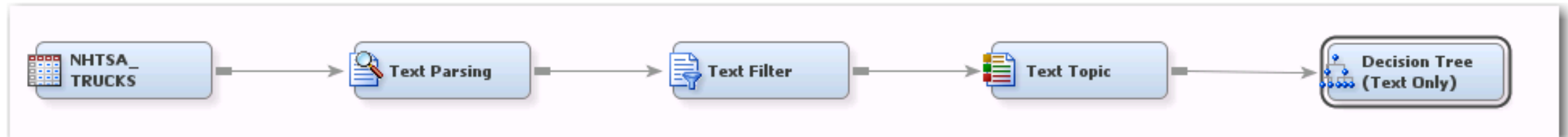


Analyze the documents to **create topics** and assign each document to one or more topics. In addition to derived topics, users can add their own topic definitions.

EXAMPLE DATA AND TEXT MINING PROCESS FLOW

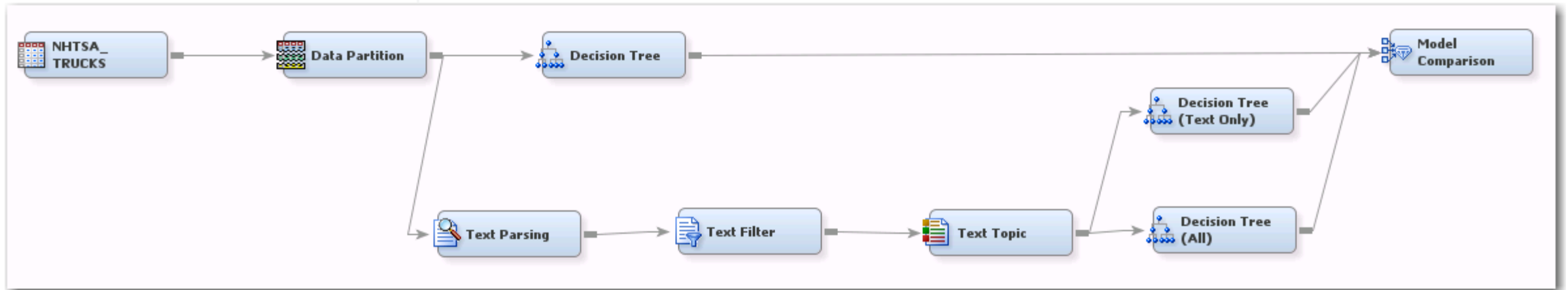


Mining Structured Data



Mining Unstructured (Text) Data

EXAMPLE DATA AND TEXT MINING PROCESS FLOW



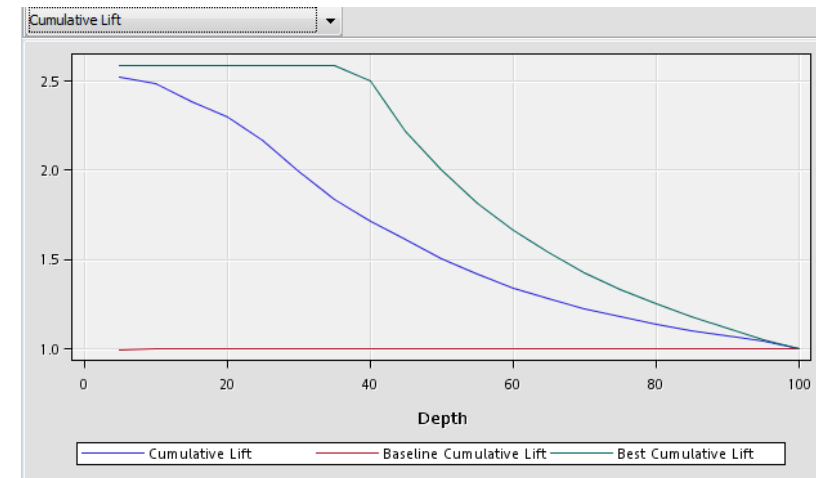
**Mining *ALL* Data:
either Structured, or Unstructured or Both**

TEXT RULE BUILDER



- The **Text Rule Builder** node generates an ordered set of rules that together are useful in describing and predicting a target variable.
- Each rule in the set is associated with a specific target category, consisting of a conjunction that indicates the presence or absence of one or a small subset of terms (for example, “term1” AND “term2” AND (NOT “term3”).
- A particular document matches this rule if and only if it contains at least one occurrence of term1 and of term2 but no occurrences of term3.

Target Value	True Positive/Total	Remaining Positive/Total	Rule	Estimated Precision	Sample Precision
1	130/133	1,137/2,946	accident	0.943884	0.977444
1	121/136	1,007/2,813	vehicle	0.860166	0.933086
1	32/33	886/2,677	mva	0.845067	0.937086
1	52/59	854/2,644	neck	0.814686	0.927978
1	29/33	802/2,585	neck	0.767854	0.923858
1	45/58	773/2,552	injury	0.718533	0.904867
1	68/91	728/2,494	shoulder & ~lift	0.680968	0.878453
1	37/48	660/2,403	car & ~door	0.649462	0.869712
1	10/11	623/2,355	drive	0.637703	0.870432
1	44/68	613/2,344	employee & fall	0.604525	0.847761



NEW NODE TEXT PROFILE NODE

A tool providing a supervised approach to discovering and reporting the terms that best **profile** a set of documents associated with each level of a target variable.



- Uses a “new” procedure, Proc TMBelief, to determine the descriptive terms.
- Useful for binary, nominal, ordinal and date target variables.
- Internally we bin date variables to day, month, year etc. and map to ordinal.
- Note: User can bin interval target variables and then analyze as nominal or ordinal.

NEW NODE TEXT PROFILE NODE

- How are men's and women's attitudes different toward my product?
- How has the answer to survey question #5 varied over the last 4 years?
- What is going on in the twitter feed over the last few months?
- Is there a difference in what people are talking about in different regions of the country?



SAS® TEXT MINER™ DEMO



SAS® TEXT MINER™
WHERE TO LEARN MORE



FOR SELF-STUDY

- Visit <http://support.sas.com/documentation/onlinedoc/txtminer/index.html>
- Download “Getting Started with SAS Text Miner” (How to Guide) (Available for multiple versions)
- Download “Getting Started Examples (Zip)”
- Work to complete the examples.

SAS Text Miner Product Web Site

<http://www.sas.com/text-analytics/text-miner/index.html>

SAS Text Miner Technical Support Web Site

<http://support.sas.com/software/products/txtminer/index.html>

SAS Text Miner Technical Forum (Join Today!)

[Data Mining and Text Mining Community](#) SAS Training

Data Miner Training Path:

<http://support.sas.com/training/us/paths/dm.html>

Courses for SAS® Text Miner:

<https://support.sas.com/edu/prodcourses.html?code=TM&ctry=US>

YOUTUBE VIDEOS

- SASSoftware YouTube Channel
 - <http://www.youtube.com/user/SASsoftware?feature=watch>
- Manage All Unstructured Data with SAS® Text Analytics
 - http://www.youtube.com/watch?v=NHAq8jG4FX4&list=PL8BD07CC2C164FC40&index=4&feature=plpp_video
- SAS® Text Analytics Software Demo
 - <http://www.youtube.com/watch?v=l1rYdrRCZJ4&feature=Bfa&list=PL8BD07CC2C164FC40>

Connect with me:

LinkedIn: <https://www.linkedin.com/in/melodierush>

Twitter: @Melodie_Rush



QUESTIONS?

Thank you for your time and attention!



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TO KNOW.**

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