

Product Data Quality - Different Problem, Different Solutions

ABSTRACT-----

In discussions of Data Quality, it is often assumed that the same tools and techniques that work well in one data domain will work well in any data domain. Specifically, it is often assumed (and sometimes asserted) that experience dealing with customer data is a qualification to also deal with product data. In practice, this is hardly ever the case - as reflected in the emergence of domain-specific markets, toolsets and techniques. Through a series of real-world customer case studies and experiences, this session will explore the differences and similarities between product data and other data types in terms of the core data quality problems, use cases, business drivers and benefits as well as the available tools, techniques, architectures and best practices available to address them.

BIOGRAPHY-----

Martin Boyd

Vice President of Marketing
Silver Creek Systems

Martin Boyd leads strategic positioning and market expansion for Silver Creek Systems, a technology leader in product data quality. His fifteen plus years in Product Management and Strategic Marketing for enterprise software companies brings broad understanding of the practical data issues and real-world solutions required to standardize and integrate disparate data sources within the information supply chain.



Prior to joining Silver Creek Systems, Boyd successfully led the repositioning of Ariba, a spend management technology company, and has held several senior and management marketing roles for companies such as Oracle, Lucas Management Systems and IBM. Martin holds a Masters degree in Engineering from Strathclyde University.



Product Data Quality

– Different Problem, Different Solutions

Martin Boyd, VP Marketing, Silver Creek Systems

MIT Information Quality Symposium, July 15-17 2009

Agenda

Product Data Quality – A large and growing market

Product Data is Different

- Understanding the Product Data Problem
- Comparison with 'traditional' customer Data Quality

Product Data Quality – Applied Use Cases

- Leading Healthcare Alliance
- World-class Retailer
- Semantic Recognition & Transformation Examples

Next-generation Solutions for Product Data Quality

- Solution Requirements
 - Semantic understanding
 - Rapid learning
 - Integrated Governance
- Solution Demonstration

MDM Segment Size & Growth (Gartner, Nov 08)

	<u>2007</u>	<u>5 Year CAGR</u>
Customer (CDI)	\$335m	21%
Product (PIM)	\$401m	22%
Procurement	\$36m	29%
Asset	\$56m	28%

Customer Data Quality

Product Data Quality

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Product Data is *Different*

- Understanding the Product Data Problem
- Comparison with 'traditional' Customer Data Quality

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Product Data Quality

- “One of the most difficult type of data to master is **undoubtedly product data** – the items, assemblies, parts and SKUs that are core to many businesses.
- Product data is inherently variable, and its lack of structure is **generally too much for traditional, pattern-based data quality** approaches.
- Product and item data **requires a semantic-based approach** that can quickly adapt and ‘learn’ the nuances of each new product category. With this as a foundation, standardization, validation, matching and repurposing are possible. Without it, the task can be overwhelming and is likely to include lots of **manual effort, lots of custom code – and a whole lot of frustration.**”

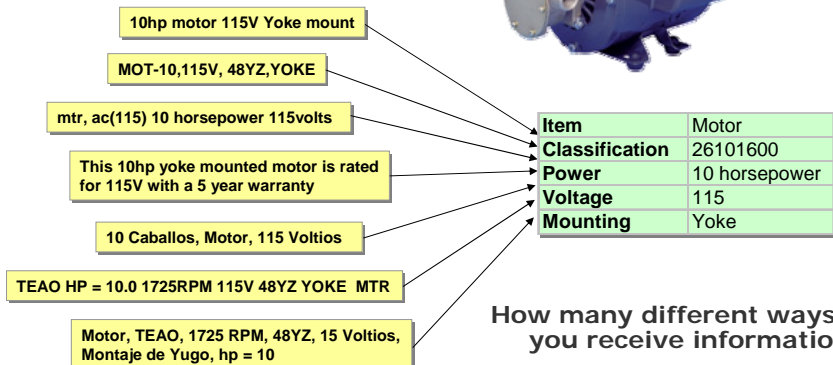
Andrew White, Research VP, MDM and Supply-chain **Gartner**

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The Product Data Problem

What is this?



How many different ways can you receive information?
How many ways do you need it?

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Typical Product Data Problems

The greatest threat to your PIM/MDM initiative

Inconsistent names (representing same business)		(Often) Rich information, but mostly non-standard		Attributes non-standard, missing or invalid		
Product ID	Manu- facturer	Description	Product Type	Power	Voltage	Mount
ABC123	AA Inc.	10hp motor 115V Yoke mount	Motor, AC/DC	10hp	115V	Yoke
abc-123	A.A.	mtr, ac(115) 10 horsepower 115volts	AC/DC Motor	10	115 AC.	
ABC/123/Q	AA/Craft	10 Caballos, Motor, 115 Voltios	Mot-AC	10 H-pow	115	
QA-ST5	Craft	TEAO HP = 10.0 1725RPM 115V 48YZ YOKE MTR	26101604			
Z99	Z99	MOT-10,115V,48YZ,YOKE	Z99			
		Motor powered pulley, 3/4"	Motor			

Widespread duplication (often hard to spot)

Inconsistent formats (extra characters often added)

Mis-classified item (not a motor)

Inconsistent classifications & misclassifications

Companies struggle with the basics of PIM

80% companies are not confident in the quality of their product data

73% find it "difficult" or "impractical" to standardize product data



'PIM Business & Technology Trends - Survey', Sept 2007

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Product Data – Common Characteristics

Multi-domain, Multi-attribute

- 5 to 5 thousand "domains" per system
- 2 to 30 required attributes per domain/item
- Many requirements, validations, rules per attribute

Too complex for custom code

"Poor" data

- Little structure
- Few standards
- Incomplete information

Too 'messy' for traditional tools

High volumes/Turnover

- 10k to 10M items
- 5 to 500% turnover (annual)

Too much volume for manual effort

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Typical Product Data 'Solutions'

The value of having 'the right tool for the job'

Current methods [for product data quality] often don't work

66% companies use "manual effort" or "custom code"

- 75% say it is **too unreliable**
- 64% say it is **too slow**
- 56% say it is **too expensive**
- >50% say 'all of the above'



Semantic-based Product Data Mastering (DataLens™) outperforms



- **Manual Effort:** Premier Healthcare is saving \$4-5M/year in manual cleansing and matching
- **Custom Code:** Avnet replaced 5 years worth of custom code within 90 days and improved their match rate to quote on \$millions more items
- **Traditional DQ:** A leading hospital group replaced a well-known DQ platform to avoid the constant, expensive and time-consuming script maintenance

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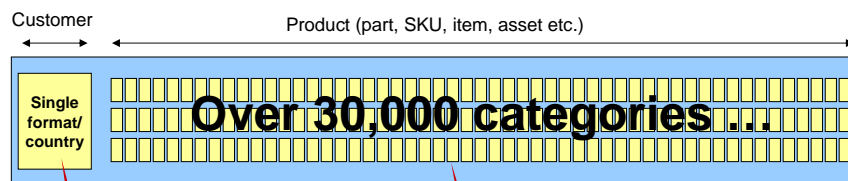
Leading hospital group

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Customer Data Quality vs. Product Data Quality

Different problems, different technologies



Name & Address Data

- Relatively fixed syntax
- Mis-spellings and name equivalents
- Match based on probabilities

Pattern-based tools work well

Product Data

- No fixed syntax – few standards
- Infinite variability – format, content, syntax
- Different rules for each product category

Must have **semantic understanding** and ability to **learn new domains quickly**

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TDWI – Product Data Quality

- Product data differs from other domains, so it has unique uses and requirements
- Customer-oriented data quality techniques and tools can be retrofitted to operate on other data domains, but with limited success
- **Standard data quality techniques don't work with product data without significant adaptation**
- Customer data has a base standardization, product data doesn't
- **Customer data has predictable patterns and syntax, whereas product data doesn't.**
- With data quality solutions, one size rarely fits all.
- Product data cleansing and standardization are greatly facilitated by a semantic approach
- **Semantics-driven data quality capabilities are crucial with product data**
- With product data, exception management is more complex and manual than with most data domains
- Product data transformations depend on the context of each process or application for which it is repurposed



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MDM Implementation Effort

10% - MDM software implementation

40% - Establish governance & document master data architecture

50% - Data remediation
Clean-up to meet the new rules

- Find duplicates
- Eliminate discrepancies
- Fill gaps
- ...

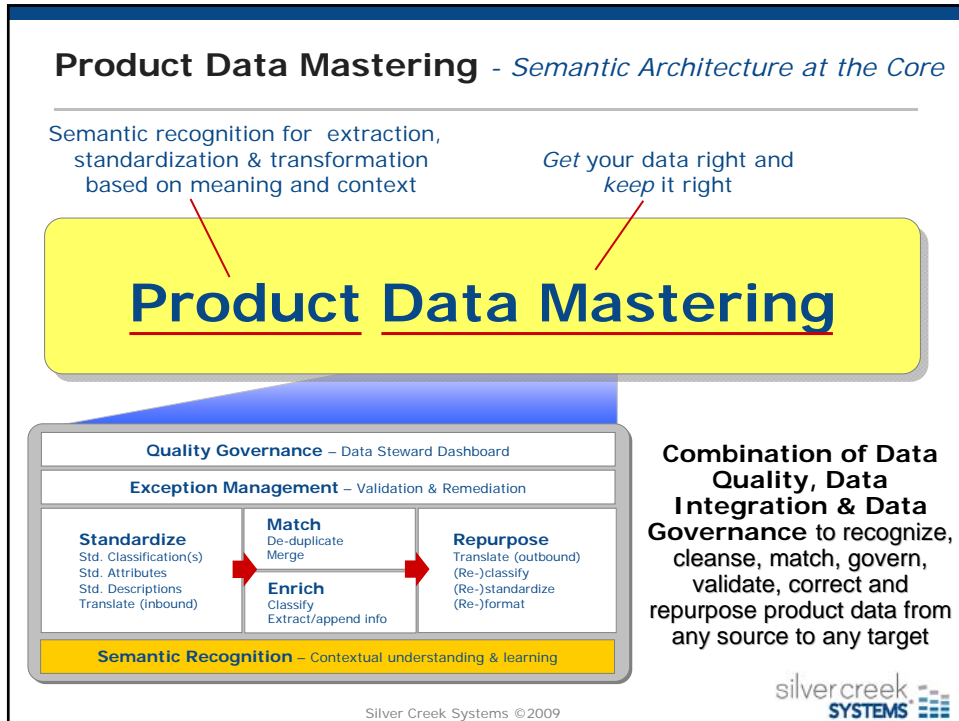
Data Mastering

Getting your data right and keeping it right

AMR Research - MDM Strategies for Enterprise Applications, April 2007

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Product Data Quality
– Applied Use Cases

- Leading Healthcare Alliance
- World-class Retailer

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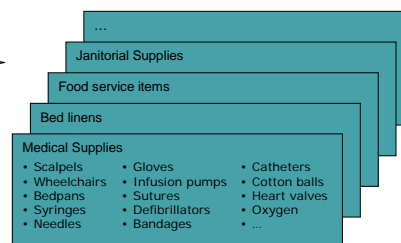
Leading Healthcare Alliance – Premier Inc.

Excerpt of Presentation at Gartner MDM Conference,
November 2009

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Product MDM – The Practical Challenges

- **Lots of data**
 - Over 7 million items/SKUs
 - Each with up to 50 part numbers and an infinite number of descriptions
- **Many disparate data sources:**
 - 3 Legacy systems
 - 1200+ Suppliers
 - 50+ Distributors
 - 1700+ Hospitals
 - 40,000+ Healthcare Facilities
 - 10+ Third Party Data Suppliers
- **No Standards**
 - Supplier Identification Number
 - Product Identification Number
 - Packaging
 - Descriptions
 - Attributes...



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Data Challenges – How Many Ways Can You Say “3M”?

Manufacturer	Manufacturer	Manufacturer	Manufacturer	Manufacturer
3M SOUTHWARD TECHNOLOGY 3M	3M 800-327-5386	3M CIO ECUAER	3M MED SURGICAL SALE 3M/CROSC	3M CARDIOVASCULAR
3M CO PHOTO PRODUCTS DIV	3M CO	3M CIO FLUID PACKAGING	3M MEDICA	ESPAÑE
3M DIAGNOSTIC SYSTEMS INC	3M DENTAL 800-237-1650	3M CIO GORECH INC	3M MEDICAL	ESPE AMERICA INC
3M ELECTRICAL SPECIALTIES DIV	3M ESPE DENTAL DIVISION 800-364-3877	3M CIO HORIZON MEDICAL	3M MEDICAL SURGICAL	ESPE AMERICA INC
3M HEALTH	3M ESPE UNITED STATES	3M CIO INNOVATIVE TECH LTD	3M MEDICAL ADVANCED INC	ESPE AMERICA, INC
3M HEALTH CARE CO	3M ESPE	3M CIO JAMES ALEXANDER CORP	3M MEDICAL AND SURGICAL PROD	3M PUERTO RICO
3M HEARING COMPONENTS	3M HEALTH CARE 800-521-2818	3M CIO LUXLOW TECH PRODUCTS	3M MEDICAL SURGICAL	3M SPECIALTY CHEMICAL
3M INDUSTRIAL TAPES LTD	3M HEALTHCARE PRODUCT	3M CIO NAKSA	3M MEDICO I CLODAD JUREZ	3M CIO BERNLEY SURGICAL
3M MEDICAL DEVICE DIV	3M HEALTHCARE	3M CIO NORTH SAFETY PRODUCTS	3M MEDICOCO JUAREZ	3M CANADA INC
3M MEDICAL IMAGING SYSTEMS DIV	3M MEDSURGE	3M CIO OVERLAND ROLLING	3M MINNESOTA MINN	3M CIO METLA TEXTILE CORP
3M MEDICAL PRODUCTS DIV	3M MINNESOTA MINN MFG OFFICE	3M CIO REMINGTON PRODUCTS, INC	3M MINNESOTA MINN & MFG CO	3M PHARMACEUTICAL SUB OF MINNESOTA
3M MEDICAL SURGICAL DIV	3M MINNESOTA MINN & MFG CO	3M CIO SANMAR LAB, INC	3M MINNESOTA MINN & MFG CO	THREE M
3M MEDICAL SURG	3M OCC HEALTH AND ENV SAFETY DIV	3M CIO SCAPA TAPES/REAFREY	3M MINNESOTA MINN & MFG CO	THREE M DISPENSION THERAPY
3M PHARMACEUTICALS AND MEDICAL S	3M OCC HEALTH AND ENV SAFETY DIV	3M CIO THAI HOSP PROD CO LTD	3M MINNESOTA MINN & MFG	THREE M COMPANY
3M MEDICAL SURGICAL	3M SARGSCDI	3M CIO THAI HOSPITAL PRODUCTS	3M OCCUPATIONAL HEALTH	THREEM
3M OCCUPATIONAL AND SAFETY DIV	3M SURGICAL	3M CIO THERMO	3M OCCUPATIONAL HEALTH AND ENV	THREEMESPE
3M MINNESOTA MINN & CO	3M UNITEK 800-423-4588	3M CIO THERMO	3M OENKIT PRODUCTS	S P RICHARDS
3M FEDERAL GOVERNMENT	3M UNITEK	3M CIO W PHARMACEUTICAL BVCS	3M OFFICE SUPPLY & HOUSEKEEPING CO	MINNESOTA MINN & M
3M FEDERAL SYSTEMS DEPARTMENT	THREE M ESPE	3M CIO WALK CORP	3M OH & ES DASHON PLANT	MINNESOTA MINN & MANUFACTUR
3M HEALTH CARE SYSTEMS	3M COMPANY CO YWHL CORP	3M COMMERCIAL OFFICE SUPPLY	3M ORTHOPEDIC	MINNESOTA MINN & MFG
3M HEALTHCARE 825 MINN IN ORDER	MINNESOTA SCIENTIF	3M COMMERCIAL OFFICE SUPPLY	3M PHARM	MINNESOTA MINN & MFG
3M HEALTHCARE (MINNESOTA MINN)	CORPORATE ALLIANCE 3M CUSTOMER SERV	3M COMPANY	3M PHARMACEUTICAL	MINNESOTA MINN AND MANUFACT
3M MEDICAL CREDIT CARD	3M HEALTHCARE	3M COMPANY ABERDEEN PLANT	3M PHARMACEUTICAL SUB OF MINNESOTA	MINNESOTA MINN AND MFG CO
3M MEDICAL PRODUCTS	3M UNITEK CORP	3M COMPANY BROOKINGS PLANT	3M PHARMACEUTICAL SUB OF MINNESOTA M	MINNESOTA MINN AND MFG CO 3M DENTA
3M OCC HEALTH AND ENV SAFETY DIVISION	3M	3M COMPANY CIO ED MED	3M PHARMACEUTICALS INC	MINNESOTA MINN AND MFG CO ADHESIVE
3M OCCUPATIONAL AND SAFETY DIV	3M COMPANY	3M COMPANY IRVINE PLANT	3M PHARMACEUTICALS INC	MINNESOTA MINN AND MFG CO DENTAL P
3M SAFETY DIVISION	3M COMPANY CIO O	3M COMPANY BROOKINGS SD	3M PHARMACEUTICALS	MINNESOTA MINN AND MFG CO DENTAL P
3M DENTAL PRODUCTS DIVISION	3M COMPANY CIO OEM PRODUCTS	3M CONSTRUCTION MARKETS	3M PHARMACEUTICALS	MINNESOTA MINN AND MFG CO DASHON
3M HEALTH CARE	3M HEALTHCARE	3M CONSUMER HEALTH CARE, CIO 3	3M PHARMACEUTICALS	MINNESOTA MINN AND MFG CO ELECTRIC
3M DENTAL PRODUCTS DIV	3M	3M CORPORATE ALLIANCE	3M TEADERM	MINNESOTA MINN AND MFG CO HEALTH C
3M UNITEK CORPORATION	3M	3M DENTAL	3M UNITEK 800-521-2818	MINNESOTA MINN AND MFG CO INDEUTHT
3M UNITEK DENTAL PRODUCTS	3M PUERTO RICO	3M DENTAL PRODUCTS	3M UNITEK CORP	MINNESOTA MINN AND MFG CO INTL SUP
3M BIOLOGICAL	3M SPECIALTY CHEMICAL	3M DEUTSCHLAND OMH	3M UNITEK CORP	MINNESOTA MINN AND MFG CO MEDICAL
3M ESPE DENTAL PRODUCTS	3M N SW NW	3M HEALTHCARE	3M UNITEK CORP	MINNESOTA MINN AND MFG CO OCCUPAT
3M HEALTH CARE (MEDISURG PROD)	3M CULZAD	3M HEALTH CARE LTD	3M UNITEK CORP	MINNESOTA MINN AND MFG CO PACKAGING
3M CO CHEOPONT NETO	3M MINNESOTA M	3M HEALTH CARE LTD	3M UNITEK CORP	MINNESOTA MINN AND MFG CO PERSONAL
3M CANADA PLANT	3M MINNESOTA MINN & MFG CO	3M HEALTH CARE SERVICE CENTER	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SALES CE
3M HEALTH CARE PLANT	3M MINNESOTA MINN & MFG CO	3M HEALTH CARE MEDICAL SURGICAL	3M UNITEK CORP	MINNESOTA MINN AND MFG CO STATION
3M MINNESOTA MINN AND MFG	3M AND COLOPLANT	3M HEALTH INFORMATION SYSTEMS	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SURGICAL
3M MINNESOTA MINN AND MFG	3M BUSINESS PRODUCTS	3M HEALTHCARE	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SURGICAL
3M MINNESOTA MINN AND MFG	3M CO ACCUPAC	3M HEALTHCARE OEM	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SURGICAL
3M HEALTHCARE ALLIANCE	3M CO ALBA VALDENHOF	3M HEALTHCARE PRODUCT	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SURGICAL
3M HEALTHCARE	3M CO CELESTE INDUSTRIES	3M HOME & COMMERCIAL CARE DIV	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SURGICAL
3M - SCOTCH		3M INFUSION THERAPY/VM	3M UNITEK CORP	MINNESOTA MINN AND MFG CO SURGICAL

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Data Challenges – Same Product, Different Numbers

Different distributors and hospitals use different identification numbers

Allegiance - M8630
Owens & Minor - 4509008630
BBMC-Colonial - 045098630
BBMC-Durr - 081048
Kreislers - MINN8630
Midwest - TM-8630
Pacific - 3/M8630
UnitedUMS - 001880

Industry Distributor Numbers for 3M Product # 8630:

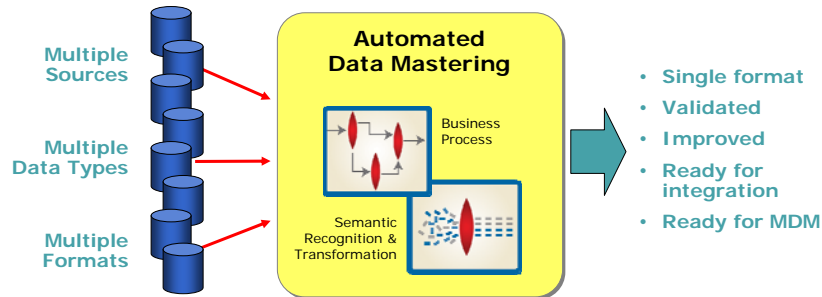


3M™ DuraPrep™ Surgical Solution (Iodine Povacrylex [0.7% available Iodine] and Isopropyl Alcohol, 74% w/w) Patient Preoperative Skin Preparation

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What is Data Mastering?



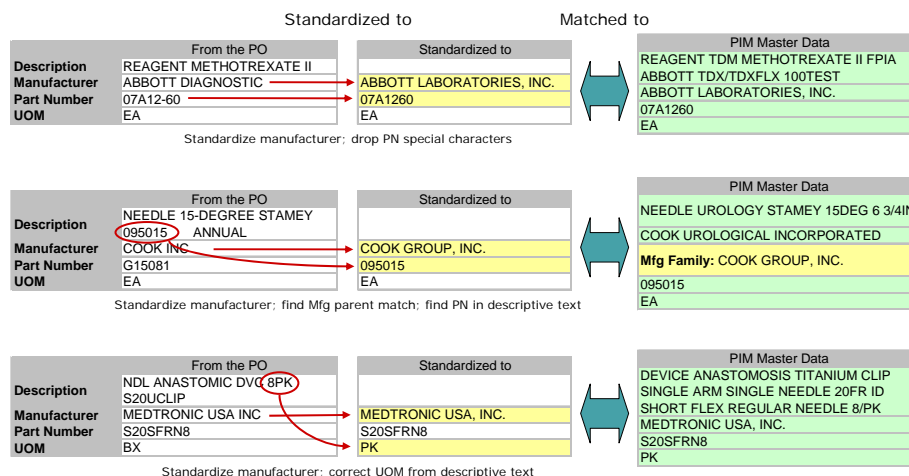
Data Mastering: The ability to understand, recognize and 'handle' data from any source as a real-time process

- | | | |
|---------------|-------------|--------------|
| ✓ Standardize | ✓ Match | ✓ Remediate |
| ✓ Enrich | ✓ Translate | ✓ Re-purpose |
| ✓ Classify | ✓ Validate | ✓ Govern |

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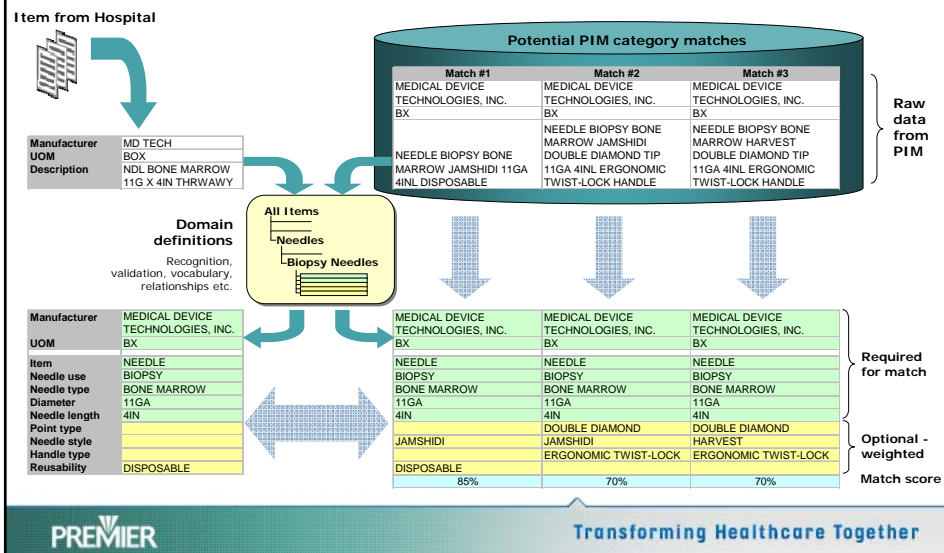
ID and Semantic Matching



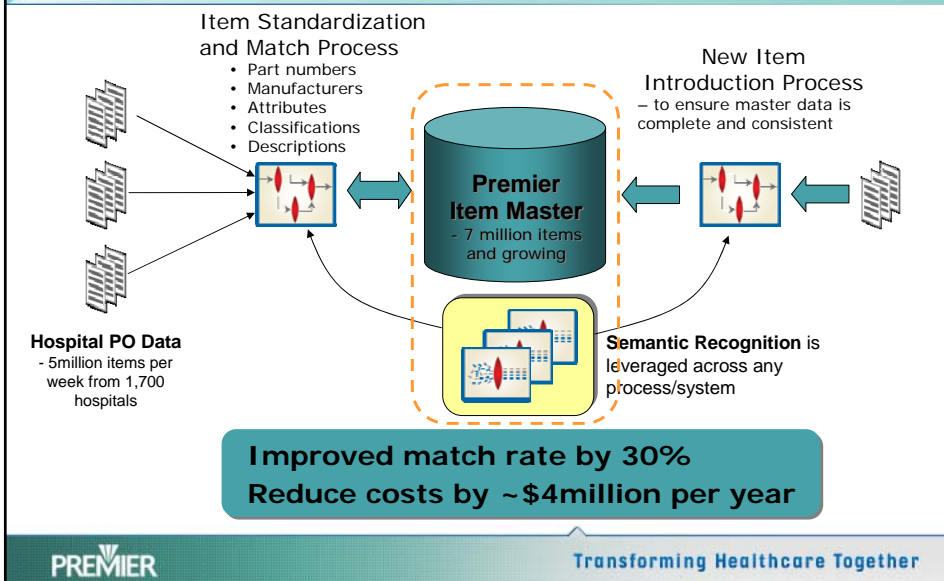
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Semantic Match with Alternatives



Data Mastering for Premier



Semantic-based Data Mastering (using Silver Creek Systems)

- **Enhanced approach** solves many persistent problems
 - Semantic-based approach handles unstructured & non-standard data
 - Rapid deployment across hundreds of categories
 - Specialized matching capabilities eliminates significant manual effort
- **Ease of use** puts business rules in hands of business user
 - Clinical experts can maintain rules
 - Less dependence on IT
- **Fast deployment** for early ROI
 - 'Auto-learn' capability reverse-engineers rules from existing data
 - Phased deployment category by category
- **Flexibility**
 - Make changes in minutes instead of months
 - Services-based deployment can plug-in to any process

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World-class Retailer

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World-class Retailer

Problems:

- Review of website show significant 'blind spots' (insufficient product attributes for guided navigation)
- 20 weeks to put merchandising rule changes into production
- Need to rapidly scale-up website SKU-count

Count of Level 3 #SKUS - range	Dimensions									Grand Total
	0	1	2	3	4	5	6	7	8	
<25	297	36	22	39	16	3	2		1	416
25-49	152	29	15	28	7	2	6	3	4	246
50-74	41	6	9	8	2	3	2	1	3	75
75-99	25	14	2	1	2			3		48
>=100	12	4		4	2	1	2	1		26
Grand Total	527	89	48	80	29	9	12	8	8	811
Blindspots	230	24	2	4						260

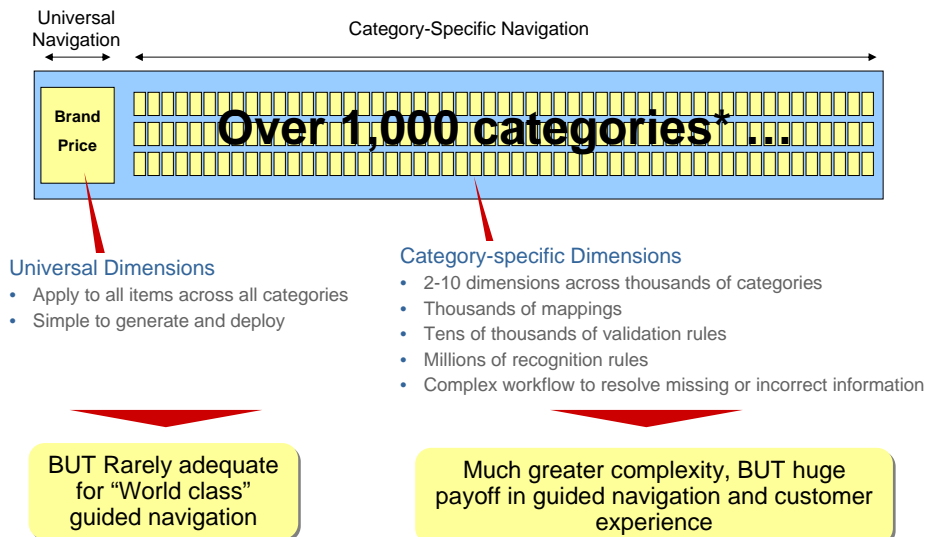
- 65% of categories have no category-specific navigation
- Half of these categories have > 25 SKUs

Poor website usability

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The Challenge: Category-specific Information



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*typical retail scenario

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Category-Specific Information



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Attributes must be extracted and standardized



Short Description
Bullets
 Disney - Tinker Bell Metallic Tote Bag
 Novelty graphics Zippered main compartment Zippered interior pocket
 Double O-ring straps Measures approximately: 12"W x 11"H x 4"D; 9" drop
 Imported fuschsia

Attribute	Extracted	Standardized
Item_Name	Tote Bag	Tote Bag
Brand or Model Name	Disney	Disney
Characters	Tinker Bell	Tinker Bell
Size	12"W x 11"H x 4"D	Large
Color	Fuschia	Pink
Closure	Zippered main compartment	Zippered
Strap type	Double O-ring straps	Dual Straps
Drop length	9"	9 to 11 inches

Category-specific extraction and standardization

Colors	Standardized Colors
apple	
foamy aqua	
asparagus	Green
Bronze	Blue
Cement	Green
Cogniac	Brown
eggplant	Gray
emerald	Brown
Expresso	Purple
faded yellow	Green
fuschia	Brown
Ivory	Yellow
jade	Pink
khaki	White
lavander	Green
bright lemon	Brown
	Purple
	Yellow

Sample Standardizations

Character
Cuties
Eeyore
Grumpy
hannah montana
Hannah Montana
High School Musical
HighSchool Musical
Mickey Mouse
Mickey Mouse East/West
Sponge Bob Square Pants
SpongeBob SquarePants
Tinker Bell
Tinker Bell East/West
Tinker Bell Pop
Tinker Bell Shimmer
Tinker Bell Sketch

Standardized Characters
Cuties
Eeyore
Grumpy
Hannah Montana
High School Musical
Mickey Mouse
SpongeBob SquarePants
Tinker Bell

Drop Length	Standardized Drop Length
10" drop	
11" drop	
12" drop	
13" drop	
19" drop	
20" drop	
4.5" drop	
5" drop	
5.5" drop	
6" drop	
7" drop	Under 6 inches
7.5" drop	6 to 8 inches
8" drop	9 to 11 inches
8.5" drop	12 inches or More
9" drop	
9.5" drop	

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Live with 1,000 product categories in 10 weeks

Extract
+ Standardize
+ Maintain
+ Map

- Significant improvement in data quality & 'searchability'
- Huge savings in manual data preparation
- Scalable process & infrastructure
- 40x faster merchandising rule changes (20 weeks to <24 hours)

Handbags
Purses
Backpacks
Lipsticks
Thermoses
MP3 Players
Coffee Makers

Wall Coverings
Chairs
Seafood
Picture Frames
Toasters
Hand Blenders
Printers
Printer Cables
Frying Pans
Shoelaces
Light Bulbs

Quick Stats:

- > 1,000 product categories covered
- Extracting 1684 attributes across categories
- 65,000 SKU's processed in 45 mins
- 10 weeks from training to go-live

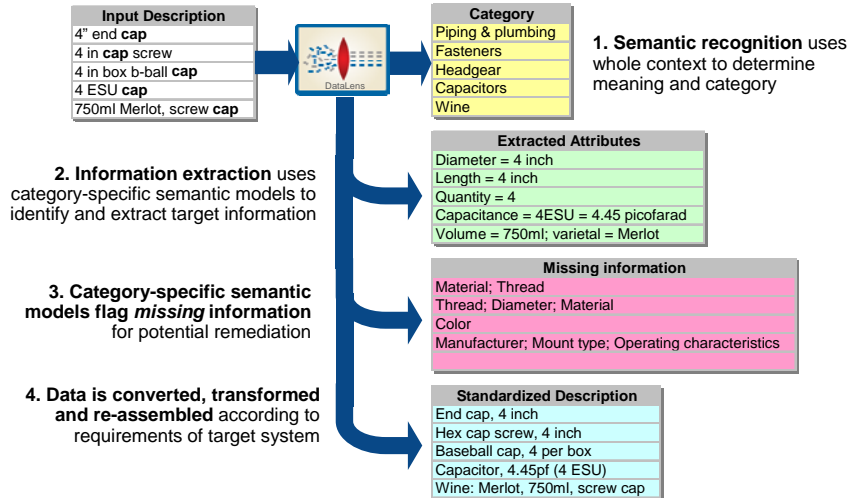
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Semantic Recognition & Transformation Examples

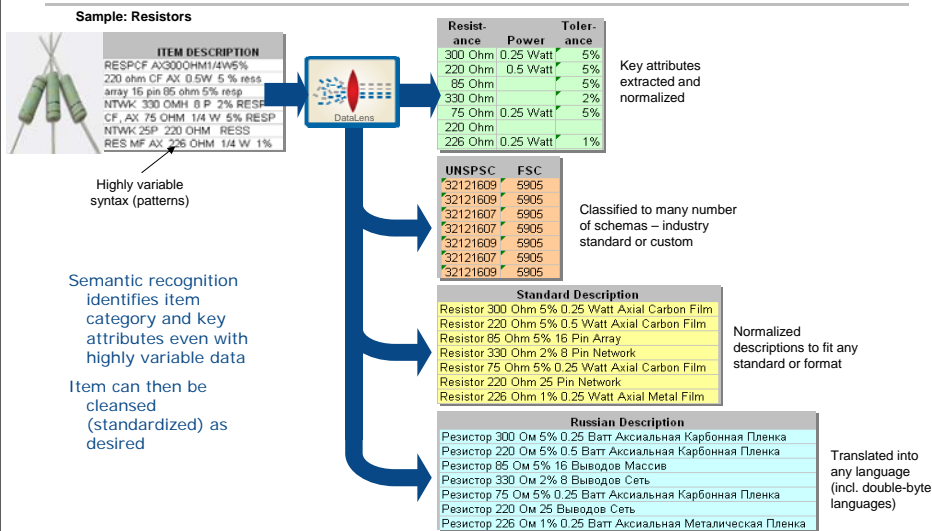
Step 1 – Semantic Recognition of Category



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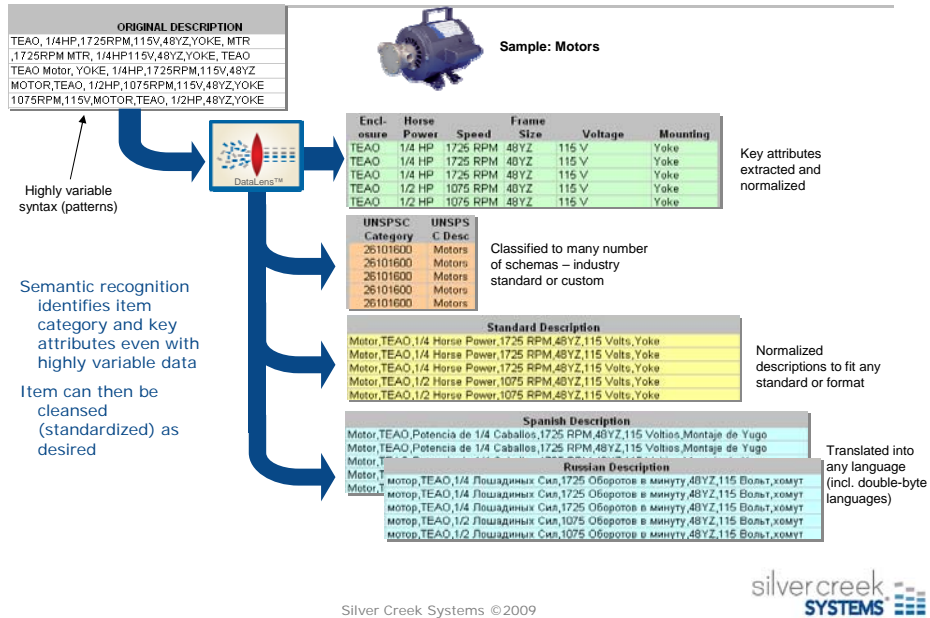
Step 2 – Semantic Transformation to Target Format



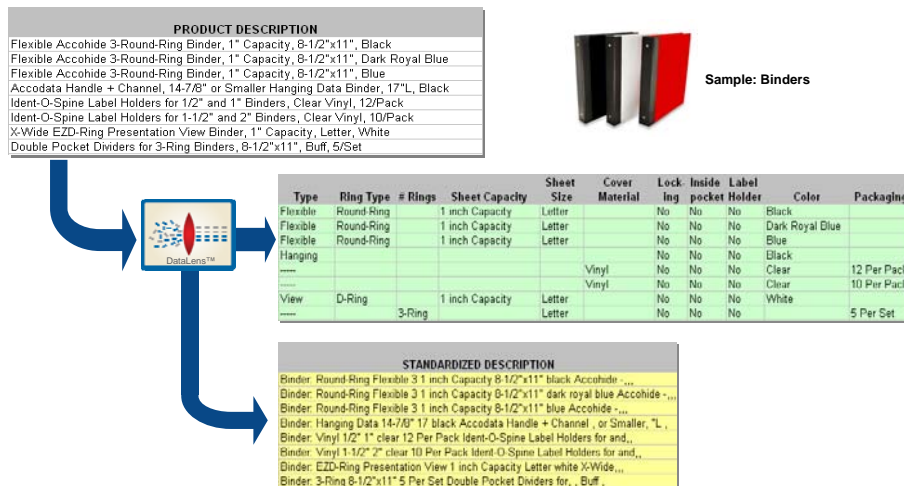
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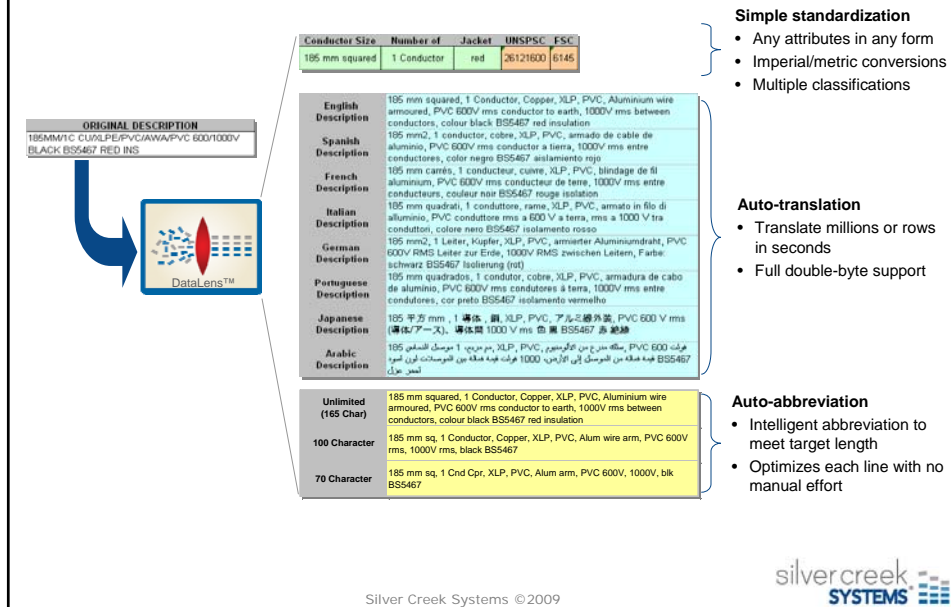
Step 2 – Semantic Transformation to Target Format



Step 2 – Semantic Transformation to Target Format



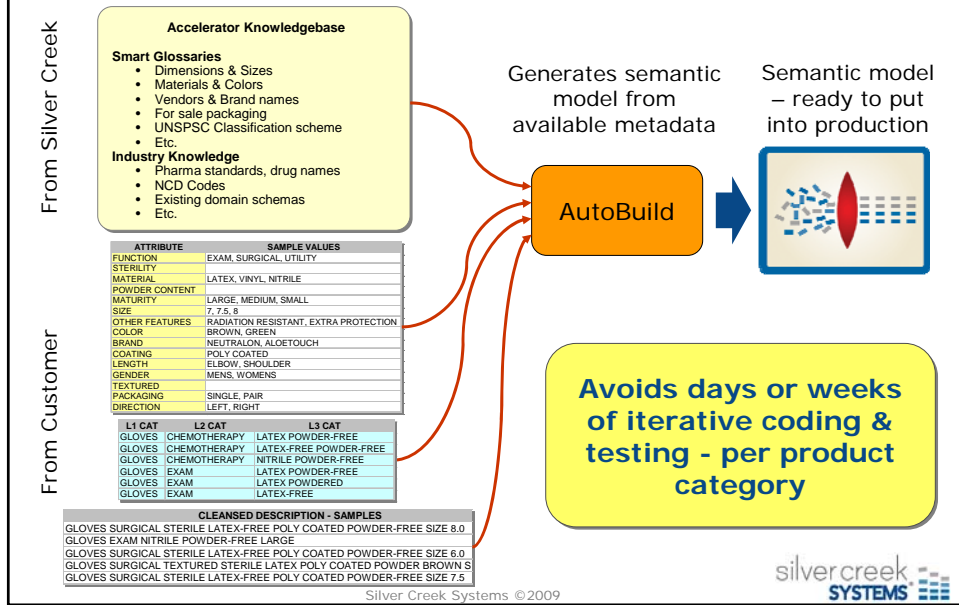
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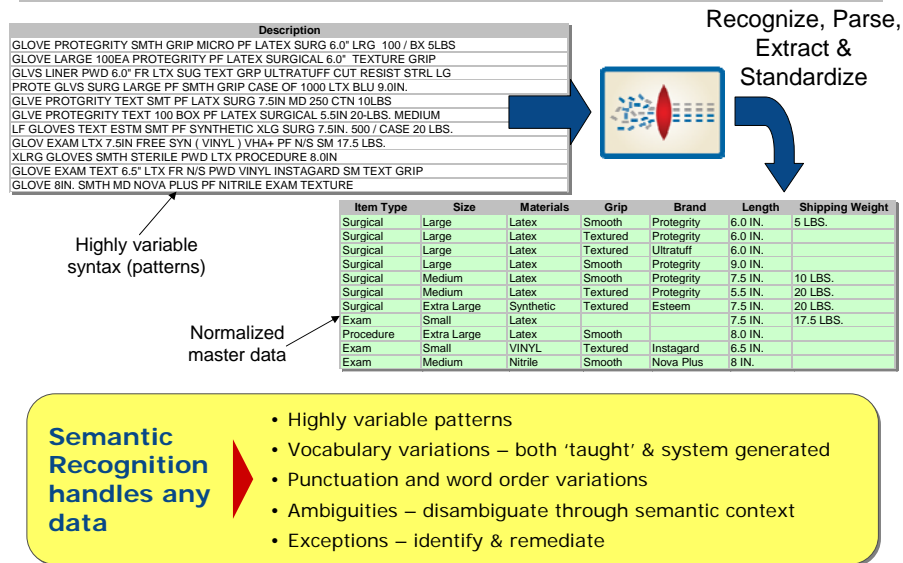
Next-Generation Tools for Product Data Quality

- Semantic-based
- Auto-learning
- Integrated Governance

AutoBuild – Generating the Semantic Model



Semantic Recognition

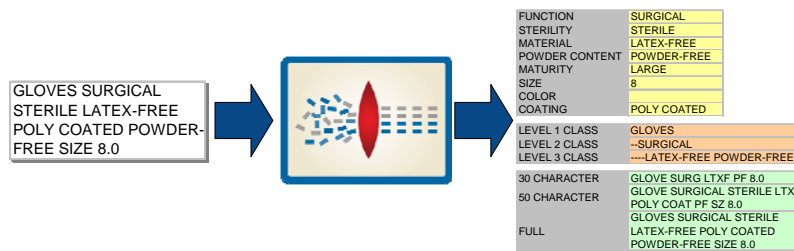


Semantic Recognition is the Key to Control...

Semantic recognition enables:

- **Standardize attributes** – any standard
- **Standardize descriptions** – any length or standard
- **Translate** – from any language to any language
- **Classify** – to any schema – UNSPSC, eClass, custom etc.
- **Validate** – attribute values
- **Enrich** – from external sources
- **Match** – ID match, functional match etc.
- **Merge** – based on survivorship rules
- **Identify gaps** – for enrichment
- **Suggest improvements** – recognition, process etc.

Tough/impossible to replicate in a traditional DQ approach

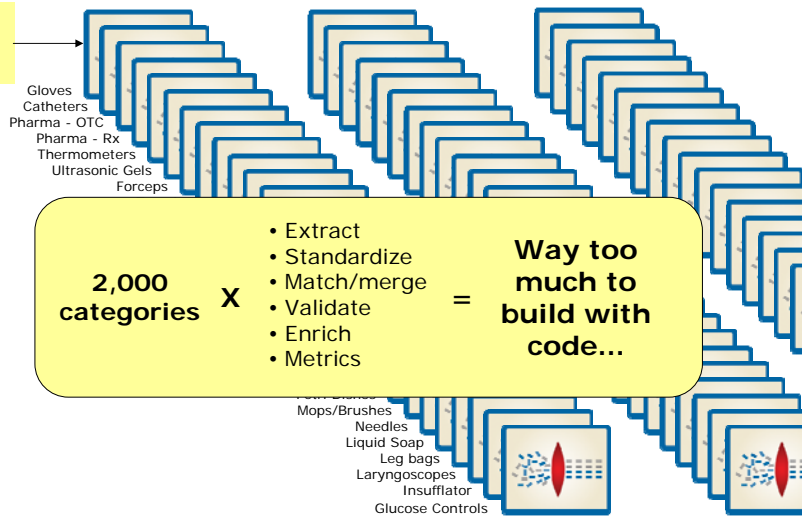


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Scales Across Thousands of Product Categories

Knowledge for a single category



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Summary

Product Data is *Different*

- Variable data
- Variable categories
- Variable uses

Traditional DQ approaches rarely work well with product data

- Wrong technology basis
- Insufficient solution scope (missing capabilities)

New technologies are emerging to meet Product Data Quality needs

- Semantic-based
- Auto-learning
- Integrated Governance