Data Basics: Defining, Sourcing and Harmonizing Data

Masterclass Series (Class 1) February 17th, 2021

https://events.ethisphere.com/events/data-analytics-masterclass-series/





ETH SPHERE® GOOD, SMART, BUSINESS, PROFIT.®



Thank you for joining!
Before we get started...

Q&A

Please submit your questions using the Questions feature in your Zoom Experience.

CHAT

Need assistance? The Chat feature will be open throughout the webcast.

RECORDING & PPT

Today's presentation, recording and additional resources will be provided via email after the webcast.

DON'T FORGET

Join us for the extended masterclass series!

March 3rd | Using Data: Generating

Compliance

March 17th | Practical Data Analytics: Deep Dives Into Specific Use Cases

Speaker



Andy Miller

Chief Analytics Officer @ Lextegrity

Helping organizations mitigate risk across the enterprise, specifically through employing advanced analytics to expose fraud, bribery, corruption, conflicts of interest and sanctions violations within enterprise data.

Contact me @ amiller@lextegrity.com

Learn more @ https://www.lextegrity.com/





The Lextegrity & Ethisphere Partnership

Knowledge & Best Practices Sharing
 https://ethisphere.com/what-we-do/lextegrity/

Data Analytics Working Group

 Integrity Analytics Collective <u>https://www.lextegrity.com/collective</u>



Lextegrity's Mission

Data-Driven + Intuitive + Integrated

FIRST GENERATION



INTEGRITY GATEWAY

Cross-Risk
Pre-Approval
Workflows

Connecting Approval Information to Spend





CONTINUOUS RISK FEEDBACK

Spend Filtered Through Risk Algorithms

Intuitive, Multilingual, Desktop & Mobile



Continuous Monitoring on All Spend



Agenda

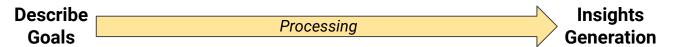
- Introductions
- Raw Data to Information to Insights
- Q&A

The goal is to turn data into information, and information into insight.

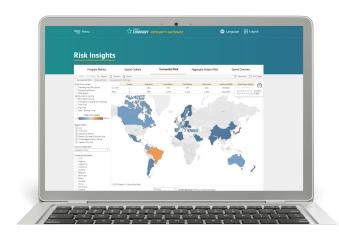
CARLY FIORINA, FORMER CEO OF HP



Raw Data to Information to Insights

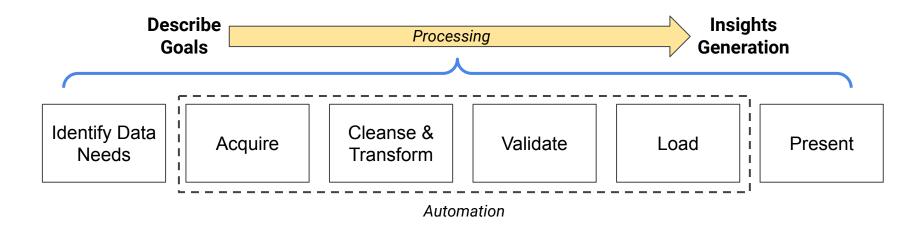


- "Having a pulse on organizational spend"
- "Preventing & detecting fraud, bribery, corruption, conflicts of interest, and sanctions violations"
- "Monitoring higher-risk spend / vendors / employees"
- "Prioritizing spend items for additional review when exhibiting higher-risk attributes"

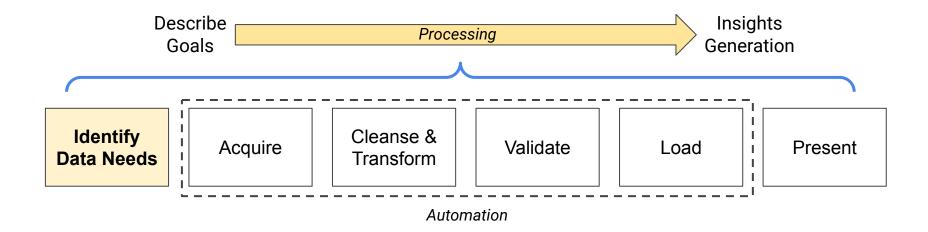




Raw Data to Information to Insights







The 5 V's of Data

Volume

Scale of Data

Variety

Different Forms of Data

Value

Potential of Data

Velocity

Fast Moving Data

Veracity

Uncertainty of Data



Relevant Data for Compliance

Transactional

- ERP (e.g. Oracle, SAP)
- T&E Systems (e.g. Concur, Expensify)
- Third Party Due Diligence

Master Data

- HR Systems (e.g. Workday, SuccessFactors)
- Master Data Sources (e.g. vendor/customer lists, HCPs, etc.)

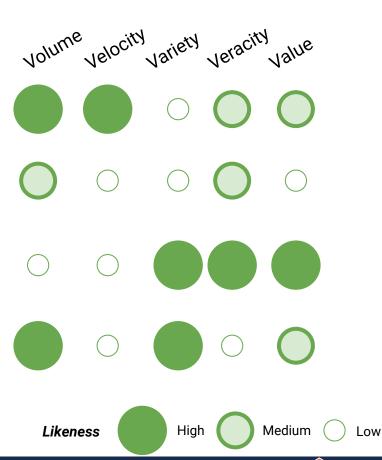
Supportive

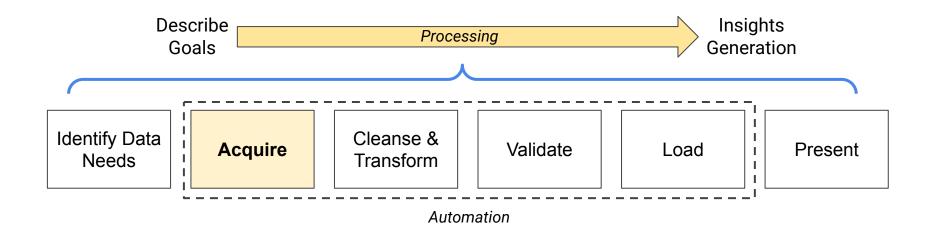
- Risk Program Data (e.g. investigations, training statistics, hotline calls, audit exceptions)
- Aggregated Metrics (e.g., budget to actual financial variances, HR turnover metrics)

Open Source / Publicly Available

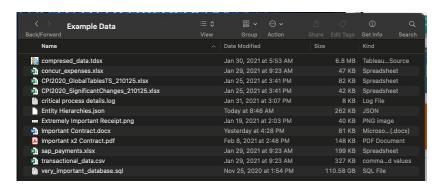
- Industry Competitive Sources / Benchmarks
- Transparency Data (Life Sciences)
- Corruption Perception Index (CPI)

The 5 Vs of Data

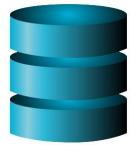




Data Accessibility



Flat Files



Databases



Application Programming Interface



Data Lake



Data Formats: Structured

Database Table

	J≅ id ÷	 key ÷	J ∄ value ÷	₽ code2 ÷	∰ region ÷	II cpi_score ▼ 1
1	6d6b6bb7-0883-4444-a80b-b8e6875d5256	DK	Denmark	DK	Europe	88
2	7396158d-dcff-4c1c-98e9-2ea7fbb4cd4c	NZ	New Zealand	NZ	Western Pacific	87
3	b82b74fe-1a7f-4a28-92c0-3e9d42af7359	CH	Switzerland	СН	Europe	85
4	2d807e73-ba03-49cb-a4b9-e4e2e446c87c	SG	Singapore	SG	Western Pacific	85
5	347bf5cb-22e7-4d7c-a02e-d3b9e7ad84d9	SE	Sweden	SE	Europe	85
6	099ac6ab-742f-4d0f-8abe-38f382a517ec	FI	Finland	FI	Europe	85
7	551d41f2-15b1-4c3a-97e8-0241d1047d1d	NO	Norway	NO	Europe	84
8	1c7c0205-86ed-4d8e-ab70-eacf5229e573	NL	Netherlands	NL	Europe	82
9	43d9d6fa-3501-47a4-b6fe-819cbd6bb116	CA	Canada	CA	Americas	81
10	83ab8d9e-8356-4913-9304-28e6591095a4	LU	Luxembourg	LU	Europe	81
11	ab81ea9e-3619-4f04-a9e9-7c96b1d49c4f	DE	Germany	DE	Europe	80
12	0e2a4fc4-9f1f-4843-a184-5278364a3cfc	GB	United Kingdom	GB	Europe	80
13	d9833297-1155-44df-80e0-d58c17418aaa	AU	Australia	AU	Western Pacific	77
14	2dd87ef5-b836-46a0-aa9d-bae689480e60	IS	Iceland	IS	Europe	76
15	bae72bf1-7dba-41cd-b8eb-35130eda90fa	нк	Hong Kong, SAR China	нк	No Region Specified	76
16	0ce4b142-428e-4b7d-8615-65c6539c6d16	AT	Austria	AT	Europe	76
17	213a714a-0179-4f42-baab-e2a6d5c7e9bf	BE	Belgium	BE	Europe	75
18	0d5809ac-af61-4ebe-8b76-95139413d89a	EE	Estonia	EE	Europe	73
19	1b6ed6c9-9da4-44c7-9741-1eb9432a8ab6	JP	Japan	JP	Western Pacific	73
20	25036070-e159-4f29-8437-e610053b97df	IE	Ireland	IE	Europe	73
21	10d5257c-b574-4da3-ab09-ed8c21c17c95	FR	France	FR	Europe	72
22	804f14f3-1fbd-4afe-b46c-5ef2c631897b	US	United States of America	US	Americas	71
23	1529cb16-70ff-423b-8a2f-601eb772e207	AE	United Arab Emirates	AE	Eastern Mediterranean	70
24	8fc07b50-65ba-466e-adbb-ff8b2bcff2ad	UY	Uruguay	UY	Americas	70
25	4cf7a44a-a521-41de-a311-960d1814d2f3	BT	Bhutan	BT	South-East Asia	68
26	df0011d7-3764-4f97-a1a1-c9ce241740bf	ВВ	Barbados	ВВ	Americas	68
27	812f382a-dbfb-4c97-845c-c436e4ee5c34	CL	Chile	CL	Americas	67
28	4fae67b2-596f-4ce1-864f-cc07bbac1d09	SC	Seychelles	sc	Africa	66
29	9409e504-ea69-41fa-a694-da95c2a24e64	BS	Bahamas	BS	Americas	65
30	b509dc2e-6d55-486d-9c0c-3b65705c5d52	PT	Portugal	PT	Europe	64
31	bffec4f2-099c-4d1b-b41c-3dcea60af682	TW	Taiwan, Republic of China	TW	No Region Specified	63
32	f48fd5b5-4a4d-4195-9af1-82e91ca8607a	BN	Brunei Darussalam	BN	Western Pacific	63
33	0e22de58-15f3-41fb-9199-70c0c34b9286	QA	Qatar	QA	Eastern Mediterranean	62



JSON

Data Formats: Semi-structured

XML

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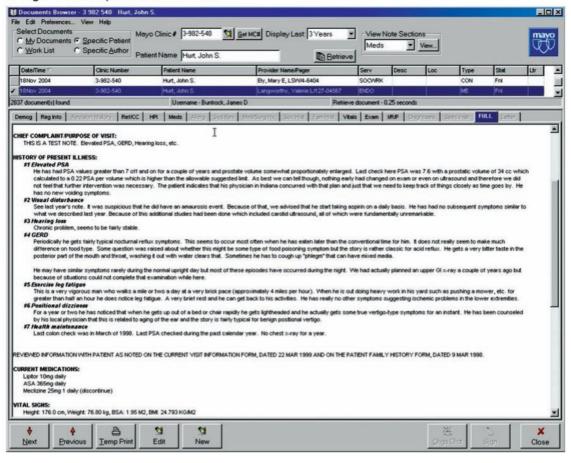
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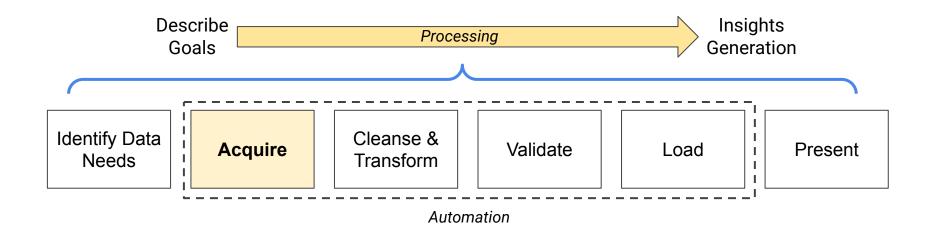
Data Formats: Unstructured

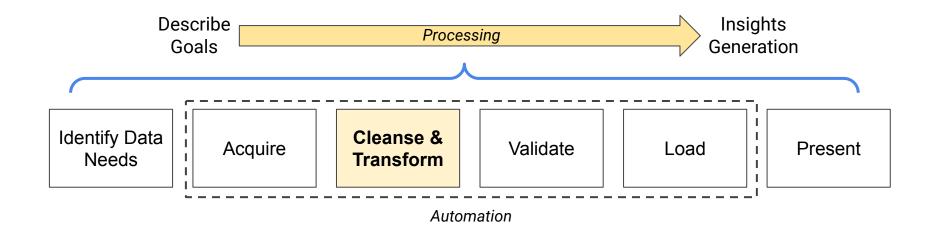
Doctor's Clinical Notes

Figure 2. Example of a Clinical Note

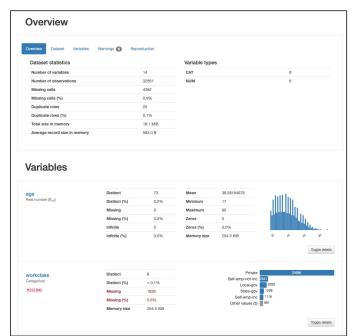








Example of Profiling Report



Reference:

https://github.com/pandas-profiling/pandas-profiling

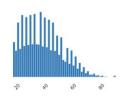
Dataset Analysis

Overview	Dataset	Variables	Warnings 6	Reproduction
Dataset	t statistics	3		
Number	of variables			14
Number	of observat	ions		32561
Missing	cells			4262
Missing	cells (%)			0.9%
Duplicate	e rows			25
Duplicate	e rows (%)			0.1%
Total size	e in memory	,		18.1 MiB
Average	record size	in memory		583.0 B

Variable Analysis







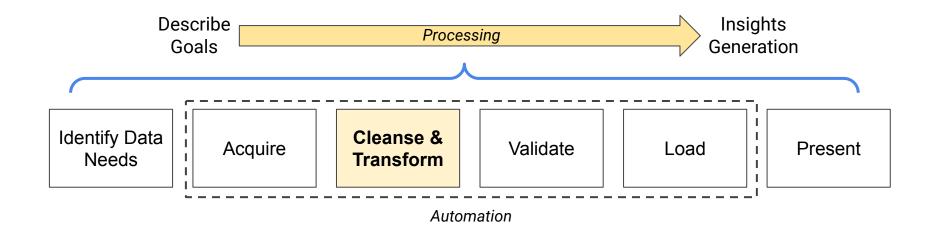
Statistics	Histogram	Common values	Extreme values	
Quantil	e statistics			
Minimur	n			17
5-th per	centile			19
Q1				28
median				37
Q3				48
95-th pe	rcentile			63
Maximu	m			90
Range				73
Interqua	rtile range (IQF	3)		20

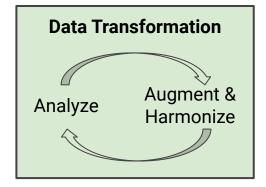
Monotocity

Standard deviation	13.64043255
Coefficient of variation (CV)	0.3535471837
Kurtosis	-0.1661274596
Mean	38.58164676
Median Absolute Deviation (MAD)	10
Skewness	0.5587433694
Sum	1256257
Variance	186.0614002



Not monotonic





Augmentation

High-Risk Subject Logic

- Vendor Type is "Government Related"
- Vendor Title/Profession contains "Government, Govt, Minister, Official, GO, etc."
- Vendor ID matches Third Party Due Diligence review "Risk Level" = "High"
- Vendor pre-approval request government official question is answered yes ("Is the vendor/individual associated with the the government?")

Elimination

123	Field	Key	Data Element	Domain	Data Type	Length	Decimal Places	Short Description
1	■ MANDT		MANDT	MANDT	CLNT	3	0	Client
2	ccc LIFNR		LIFNR	LIFNR	CHAR	10	0	Account Number of Vendor or Creditor
3	CO ANRED		ANRED	TEXT15	CHAR	15	0	Title
4	□ BAHNS		BAHNS	BAHNH	CHAR	25	0	Train station
5	■ BBBNR		BBBNR	NUM07	NUMC	7	0	International location number (part 1)
6	BBSNR		BBSNR	NUM05	NUMC	5	0	International location number (Part 2)
7	■ BEGRU		BRGRU	BRGRU	CHAR	4	0	Authorization Group
8	■ BRSCH		BRSCH	BRSCH	CHAR	4	0	Industry key
9	■ BUBKZ		BUBKZ	NUM01	NUMC	1	0	Check digit for the international location number
10	□ DATLT		DATLT	TEXT14	CHAR	14	0	Data communication line no.
11	DTAMS		DTAMS	DTAMS	CHAR	1	0	Report key for data medium exchange
12	□ DTAWS		DTAWS	DTAWS	CHAR	2	0	Instruction key for data medium exchange
13	ccc ERDAT		ERDAT_RF	DATUM	DATS	8	0	Date on which the Record Was Created

SAP LFA1 table components (Vendor Details)

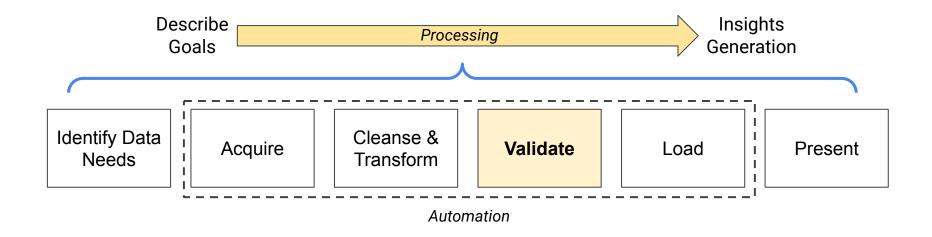
Harmonization

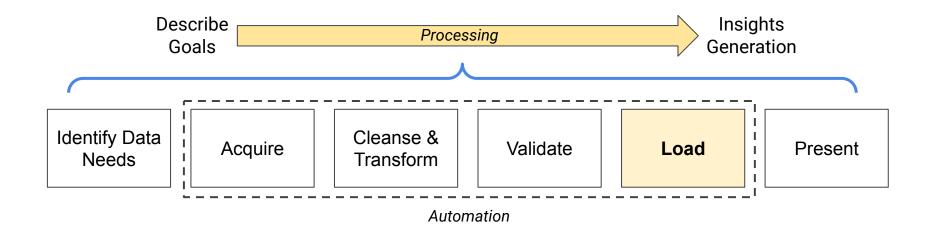
- Airfare Overseas
- Airfare Domestic
- Airfare First Class (EU)
- Airfare Business Class (EU)
- Non-Employee Airfare
- Travel Airfare Costs
- Airfare > \$5K

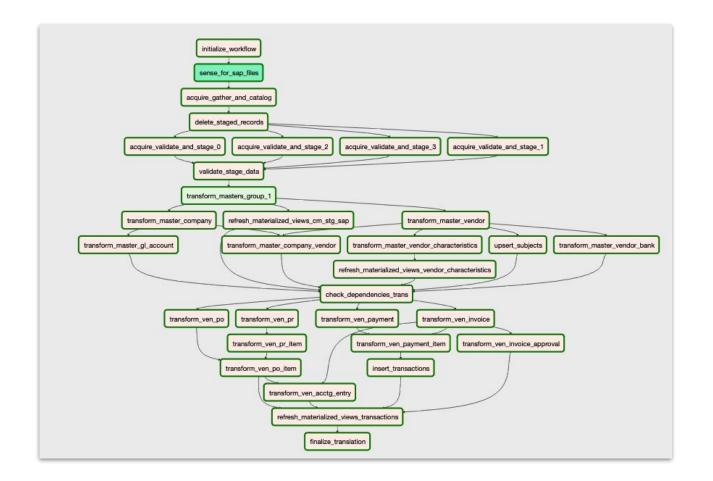


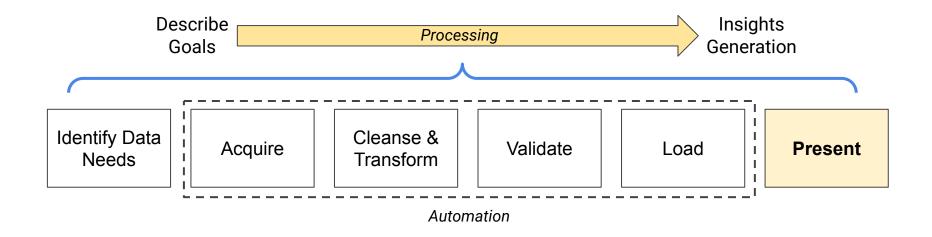
Airfare





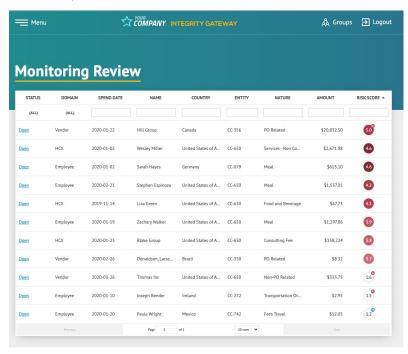






Detailed Data

Summary Data





Aggregation





Questions?



