## Business Data Roles and Companies By Daniel Egger, Duke University Business Metrics for Data-Driven Companies

	Job Title:				
	"Business Analyst"	"Business Data Analyst"	"Data Scientist"	"Senior Software Engineer" /	Taught in Excel to MySQL:
Matching Job Titles to Required Skills	,	· · · · · · · · · · · · · · · · · · ·		"Technology Project Manager"	Business Analytics Techniques
(based on review of US help-wanted advertisements, and interviews, by Daniel Egger, June 2015)					4-Course Specialization
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1 Identify critical business metrics (will be industry-specific)	Yes	Yes	Yes	No	1 YES Course 1 2 YES Course 2
2 Find and apply appropriate models for each metric 3 Evaluate the effectiveness of models used	Yes	Yes Yes	Yes Yes	No No	2 YES Course 2 3 YES Course 2
	Yes	Yes		No No	4 YES Course 3
4 Interview "clients" to define project requirements ("client" may be internal to the Corporation)  5 Excel skills - import data sets, run analyses, and display results using charts and graphs	Yes	Yes	Yes  Yes	No No	5 YES Course 2
6 Presentation Skills - effective verbal and written communication skills	Yes	Yes	Yes	No No	6 YES Course 3
	Yes			No No	
7 Data Visualization Skills with Tableau	Yes	Yes	Yes	NO	7 YES Course 3
8 Able to identify new ways to combine business data to achieve business process improvement	No	Yes	Yes	No	8 YES Course 4
9 Ability to "pull" needed data and recombine it using SQL Queries	No	Yes	Yes	No	9 YES Course 4
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1 Modeling Tools: R, Matlab, or SAS - intermediate to advanced skills in at least one	No	No	Yes	No	
2 Advanced Statistical Methods	No	No	Yes	No	
3 Bayesian Learning and Probabilistic Models; Machine Learning for Algorithms for Predictive Analytics	No	No	Yes	No	
4 Ability to populate and optimize SQL Databases - design basic relational database schemas	No	No	Yes	Yes	
5 Python, Java, and Javascript	No	No	Yes	Yes	
6 Experience Managing distributed/unstructured data - using Hadoop/Mapreduce/Hive/Spark	No	No	Yes	Yes	
7 Natural language processing - text sentiment analysis	No	No	Yes	Yes	
8 Experience with Amazon Web Services (AWS) or other equivalent cloud-based data-hosting and processing services	No	No	Yes	Yes	
C++ or egivalent	No	No	No	Yes	
Experience with Oracle, Teradata, or other large commercial databases or low-latency cloud-based database structures	No	No	No	Yes	
Experience Leading Data Analytic Teams	No	No	No	Yes	
Project Management, Budgeting and Planning Experience	No	No	No	Yes	
Experience integrating real-time data feeds	No	No	No	Yes	
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The Relative Demand for Data-Centric Employees by Job Title in the Five (5) Types of Companies					
Categories of Companies - a subjective representation of relative hiring rates in each of the 4 job categores above	"Business Analyst"	"Business Data Analyst"	"Data Scientist"	"Senior Software Engineer" /	
(results ranked by their relative need in each category for Business Analysts & Business Data Analysts)	Dusiness Analyse	Business Butu Analyst	Data Scientist	"Technology Project Manager"	
results tained by their relative need in each category to business analysis a business battle maryers,				recimology i roject manager	
Traditional Strategic Business Consulting - General	30%	6 40	0%	20% 10%	
Examples: Argus, Comscore, Deloitte Consulting, McKinsey				<u> </u>	
Traditional "Bricks and Mortar" Businesses	20%	/ 2/	0%	30% 20%	
Examples of Companies Using Best Practices: Bank of America, Costco, UPS, Walmart	207	5	176	30% 20%	
examples of companies using best fractices, bank of America, Costco, or 3, wannant					
Strategic Business Consulting - with a focus on Software and IT Systems Integration	109	6 20	0%	30% 40%	
Examples: Accenture, Opera Solutions, Palantir					
Hardware & Software Companies	10%	6 10	0%	30% 50%	
Hardware: Intel, AMD, Cisco; Enterprise Software: IBM, Oracle,SAP;					
Commercial Desktop Software: Microsoft, Tableau, SAS,Matlab.					
Digital Businesses	09	6 10	0%	30% 60%	
Examples: Airbnb, Amazon, Facebook, Google, If(We), Zillow					