USE CASE REFERENCE

WATER AND WASTE DEPARTMENT DATA ANALYTICS AND INSIGHTS



Data: The Key to the Utility of the Future

The Water and Waste Department (WWD) can leverage Business Intelligence and Analytics (BIA) to gather insights regarding services offered and make better factbased decisions to realize synergies, minimize costs, and deliver greater value for customers.



Opportunities and Challenges



In 2018, the Department and its divisions were engaged to provide immediate ideas on what critical opportunities and challenges need to be addressed to optimize performance, improve citizen confidence, sustain operations and service delivery, and more.

These ideas were captured as **Crunchy Questions** which form the basis for developing robust **Use Cases** that will be addressed through the offering of BIA products and services.

Crunchy Questions Prioritization Map



A prioritization map is essential for distilling key business questions into what has value, what's complex, and thus answering what should be targeted as initial BIA efforts.



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USE CASE PRIORITIZATION SUMMARY

OVERVIEW OF USE CASES TO BE DEVELOPED IN ORDER OF PRIORITY, VALUE AND EASE OF IMPLEMENTATION



									Data I	Format				Perceived
Priority	Cruno	thy Question	Use Case	Area of Impact	Objective	Requirements	Key Data Sources	Database	Extract	Digital	Paper	Data Structure	Volume	Data Quality
1	15	How do we reduce	Safety Analytics	😌 Human Resources	Reduce the number and	Supervisors should be	PeopleSoft	\checkmark				Structured		****
		incidents and injuries to improve health and		Resources	frequency of	able to view safety data to take necessary corrective	WCB Claims Database		\checkmark			Structured		****
		safety at the workplace?			injuries and other incidents to create	actions.	SmarterU	\checkmark				Structured		***
		Dimensions & Measures Incidence Event, Incidence			a safer workplace.	Data should be able to give us factors and	Job Planning			~	~	Semi-structured		-
		Date, Severity, Severity Score, Frequency, Cost Centre, Lost Hours, Claim Cost, Training			Reduce financial, legal, and	predictors of safety incidents.	Safe Work Procedures			\checkmark		Unstructured	•	-
		Hours, Claim Cost, Training History, Certifications, Location, Action, Job			reputational liabilities.	Visualizations should	Work Observations			~	~	Semi-structured		-
		Description, etc.			iddinities.	allow users to drill-down a granular level to explore	Incident Investigations			\checkmark	\checkmark	Semi-structured	•	*
						and improve analysis.	Safety Talks			\checkmark	\checkmark	Unstructured		-
							Equipment Maintenance			\checkmark		Structured	•	-
							Regulatory			\checkmark	\checkmark	Structured		-
							Corporate Policies			\checkmark		Unstructured	•	-
							Hazard Assessment			\checkmark		Semi-structured		-
2	13	How do we optimize meter population?	Water Meter Life Cycle	Finance and Administration	Determine the optimum time to	Ability to identify the optimum time to replace	Oracle Utilities Customer Care and Billing (OUCCB)	~	~	~		Structured		****
		Dimensions & Measures	Analytics		exchange a meter (i.e., weighing	each meter and demonstrate the return	Meter Test Data			\checkmark		Structured	•	****
		Water consumption meter reads (estimated and actual), Service Points, Addresses,				on this investment.	Meter Maintenance Report	\checkmark	\checkmark	\checkmark		Structured		****
		Meter Type, Meter Location, Meter Age, Billed Usage, etc.			unmetered revenue)?	Ability to group meters by various characteristics.								



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Priority	Crunc	thy Question	Use Case	Area of Impact	Objective	Requirements	Key Data Sources	Database	Extract	Digital	Paper	Data Structure	Volume	Data Quality
3	23	How can we identify unaccounted water	Non-Revenue Water (NRW)	Finance and Administration	Reduce non- Revenue Water	Ability to distinguish between a meter slowly	Oracle Utilities Customer Care and Billing (OUCCB)	√	~	\checkmark		Structured		****
		including its theft (based on factors such as water	Identification Analytics		(NRW) by identifying specific	degrading in accuracy versus a sudden change	Meter Maintenance Report	\checkmark	\checkmark	\checkmark		Structured		****
		consumption, meter age, and inspection date)?			meter issues for review (e.g., significant change	in consumption (could be theft – meter tampering, open by-pass, change of	CM ERT List (16mm AMR from OUCCB)		~	\checkmark		Structured		****
		Dimensions & Measures Water Consumption Meter Reads (estimated and actual), Service Points, Addresses,			in consumption occupancy / p implying theft or change of Ability to group	occupancy / process) Ability to group these	By-law Enforcement (Theft Records)		~	\checkmark		Structured		***
		Meter Type, Meter Location, Meter Age, etc.			occupancy).	meters by various characteristics and drill- down for deeper analysis.	Annual Water Audit (AWWA)			\checkmark		Unstructured	•	-
					down for deeper analysis.	Pumpage Reports			\checkmark		Unstructured	•	****	
							Broken Seal Data			\checkmark		Structured	-	-
							Bypass Seal Data (from OUCCB)	√	~	\checkmark		Structured	-	-
4	21	How do we go from >50% to 0% unplanned maintenance?	Wastewater Predictive Maintenance I	Wastewater Services	Optimize resource allocation.	Aspire towards 0% unplanned maintenance.	Distributed Control System (DCS)	\checkmark	1	~		Structured		***
		Dimensions & Measures Asset Type, Asset Age, Asset	(Major Pumps)		Ensure equipment uptime and	Ability to anticipate likelihood of	Supervisory Control And Data Acquisition (SCADA)	\checkmark	~	~		Structured	-	-
		Costs, Asset Location, Flow, Pressure, Temperature, Vibrations, Work Orders,			performance. Mitigate	process/system failure and prescribe preventative measures.	Oracle Work Asset Management (OWAM)	√	~	\checkmark		Structured		***
		Labor Costs, Specifications, etc.			occurrence and impacts to service delivery and		Manuals, Specifications and other Documents			\checkmark	~	Semi-structured		*
					quality due to unplanned maintenance.									
					Ensure regulatory compliance.									



									Data F	ormat				Perceived
Priority	Crunc	chy Question	Use Case	Area of Impact	Objective	Requirements	Key Data Sources	Database	Extract	Digital	Paper	Data Structure	Volume	Data Quality
5	3	How do we optimize landfill management by guiding services, controlling revenue loss, and adjusting the pricing model? Dimensions & Measures Customer Contacts, Staff, Wages and Salaries, Scale Weights, Accounts Payables, Accounts Receivables, Payment Transactions, Check-ins, Manual Overrides, Material Types, Material Volumes, Diversion, Landfill Capacity, Arrears, etc.	Landfill Service and Revenue Analytics	Solid Waste	Ensure that scale transactions are accurate. Ensure that landfill service levels match required service. Ensure controls are in place to minimize revenue loss by identifying transactional anomalies.	Reduce transactional anomalies. Optimize revenue and expenses.	WasteWORKS PeopleSoft	1	J J	1		Structured Structured		****
6	14	How do we enhance monitoring of compliance? Dimensions & Measures	Environmental Compliance Analytics	 Water Services Wastewater Services Environmental Standards 										
7	24	What are the collective financial implications of a given work order and how can we leverage this information to forecast future costs/effort? Dimensions & Measures Work Orders, Work Activities, Effort, Equipment, External Costs, Supplies, Salaries, QPS coordinates, Permits, etc.	Work Order Cost Analytics	Water Services	Optimize maintenance activities with respect to cost, resource availability and more effectively prioritize maintenance activities.	Ability to measure actual cost and apply to forecasting models. Ability to account for total cost of a work order.	PeopleSoft REPA Water Cuts Fleetbridge Winnipeg Fleet Management Oracle Work Asset Management (OWAM)			√ √		Structured Structured Structured Structured Semi-Structured Structured		**** **** - - **



									Data	Format				Perceived Data
Priority	Crunc	hy Question	Use Case	Area of Impact	Objective	Requirements	Key Data Sources	Database	Extract	Digital	Paper	Data Structure	Volume	Quality
8	21	How do we go from >50% to 0% unplanned	Wastewater Predictive	Wastewater Services	Ensure that scale transactions are	Reduce transactional anomalies.	Distributed Control System (DCS)	~	~	\checkmark		Structured		***
		maintenance? Dimensions & Measures	Maintenance II (High-Value Assets)		accurate. Ensure that landfill	Optimize revenue and expenses.	Supervisory Control And Data Acquisition (SCADA)	~	~	~		Structured	-	-
		Asset Type, Asset Age, Asset Costs, Asset Location, Flow, Pressure, Temperature, Vibrations, Work Orders,			service levels match required service.		Oracle Work Asset Management (OWAM)	~	~	~		Structured		***
		Labor Costs, Specifications, etc.			Ensure controls are in place to		Manuals, Specifications and other Documents			~	~	Semi-structured		*
					minimize revenue loss by identifying transactional anomalies.									
9	21	How do we go from >50% to 0% unplanned	Wastewater Predictive	Wastewater Services	Ensure that scale transactions are	Reduce transactional anomalies.	Distributed Control System (DCS)	~	~	~		Structured		***
		maintenance? Dimensions & Measures	Maintenance III (Small Pumps)		accurate. Ensure that landfill	Optimize revenue and expenses.	Supervisory Control And Data Acquisition (SCADA)	~	~	~		Structured	-	-
		Asset Type, Asset Age, Asset Costs, Asset Location, Flow, Pressure, Temperature, Vibrations, Work Orders,			service levels match required service.		Oracle Work Asset Management (OWAM)	~	~	~		Structured		***
		Labor Costs, Specifications, etc.			Ensure controls are in place to		Manuals, Specifications and other Documents			~	~	Semi-structured		*
					minimize revenue loss by identifying transactional anomalies.									



									Data F	Format				Perceived
Priority	Cruno	chy Question	Use Case	Area of Impact	Objective	Requirements	Key Data Sources	Database	Extract	Digital	Paper	Data Structure	Volume	Data Quality
10	36	How do we better predict water revenue in the short term?	Unbilled Water Revenue Forecasting	Finance and Administration	Since the utility must balance its budget, it is	Forecast confidently unbilled revenue for current quarter and	Oracle Utilities Customer Care and Billing (OUCCB)	√	√	~		Structured		****
		Dimensions & Measures Customer, Meter Reads Billing Data, etc.	Torcasting		important to know whether revenue will be above/below budget in a timely manner.	forthcoming year with ability to drill-down to individual water meters.								
11	11	Can we predict customer payment behavior, i.e., which customers will fall	Customer Payment Behavior	Finance and Administration	Reduce frequency and volume of unpaid accounts,	Ability to predict the likelihood of non- payment based on a	Oracle Utilities Customer Care and Billing (OUCCB)	\checkmark	~	\checkmark		Structured		****
		in arrears?	Predictive Analytics I		and prescribe proactive	customer's past behavior and utilize this data to	Oracle Work Asset Management (OWAM)	~	\checkmark	~		Structured		***
		Dimensions & Measures Bill and Payment History, Notices, Water Turn-Off History, Turn-off Requests, Pay Pans, Adjustments, Property Taxes, Service Requests, etc.			measures to ensure reliable revenue collection.	prioritize our collection activity. Ability to apply a model that monetizes the risk of delaying collection activity.								
12	11	Can we predict customer payment behavior, i.e., which customers will fall	Customer Payment Behavior	Finance and Administration	Maximize revenue collection and margins.	Ability to estimate ROI for prioritizing water shut-offs to ensure reliable	Oracle Utilities Customer Care and Billing (OUCCB)	~	√	~		Structured		****
		in arrears? Dimensions & Measures Bill and Payment History,	Predictive Analytics II			collection of revenues from water usage.	Oracle Work Asset Management (OWAM)	~	√	~		Structured		***
		Notices, Water Turn-Off History, Turn-off Requests, Pay Plans, Adjustments, Property Taxes, Service Requests, etc.												



									Data I	Format	-			Perceived Data
Priority	Crunc	hy Question	Use Case	Area of Impact	Objective	Requirements	Key Data Sources	Database	Extract	Digital	Paper	Data Structure	Volume	Quality
13	35	How do we ensure we are billing for all services	Billing and Services	Finance and Administration	Develop standards and	Ability to quantify potential for unbilled	Oracle Utilities Customer Care and Billing (OUCCB)	√	~	~		Structured		****
		provided? Dimensions & Measures	Reconciliation		systems that more streamlines revenue	revenue for suspected revenue gaps.	Collections Management Services (CMS)	√	~			Structured		***
		Service Points, Addresses, Carts, Dwelling Assessments, GPS, Property Types, Service			assurance.	Ability to trigger investigation of possible	MANTA/Taxation	√	\checkmark			Structured	-	****
		Connections for Water and Sewer, Asset Type, Service				unbilled service and to track results of	GIS	\checkmark	\checkmark			Structured	-	***
		Requests, etc.				investigation (or send to another system).	Oracle Work Asset Management (OWAM)	√	~	~		Structured	-	****
14	16	How can we predict cart damage and	Cart Life Cycle Analytics	Solid Waste	Ensure that sufficient funds	Determine indicators of cart damage (e.g.,	Fleetmind	\checkmark	\checkmark			Structured		****
		replacement (asset planning)?	Analytics		and replacement assets are	neighborhood, pick route, customer, seasonal	Collections Management Services (CMS)	~	~			Structured		***
		Dimensions & Measures			available to replace carts that	events, number of transactions (i.e., how	311 / KANA	\checkmark	\checkmark			Structured		****
		Status Code, GPS, Vehicle Number, Cart Details, Photos, Videos, Inventory, Service			are damaged or reach end of life	many times it was picked))	Photos of Damaged Carts			\checkmark		Unstructured		***
		Information, Customer, Service Location, Service Requests, Damage Reports, etc.			ldentify causes of damage in order to reduce financial impact	Study indicators as an input to allocate/budget sufficient funds to replace cart assets Determine number of carts repaired or replaced due to avoidable causes (i.e. contractor damage).								

USE CASE VALUE PROPOSITION

WHY ARE THESE USE CASES IMPORTANT? HAVE OTHER UTILITIES DONE THE SAME AND ACHIEVED THE DESIRED RESULT?



A value proposition tells us 'Why' an organization should undertake an initiative or use case, what success would look like to the user and ultimately, the benefit to the organization.

						N/s1 as	Decision		Real	World Application
Priority	Cruno	chy Question	Use Case	Area of Impact	Desired Success Outcome(s)	Value Drivers	Business Champion	Key Users	Client	Success Outcome(s)
1	15	How do we reduce incidents and injuries to improve health and safety at the workplace?	Safety Analytics	🕀 Human Resources	Ability to analyze safety data in a more meaningful manner. Raise awareness, design, develop and implement more effective corrective and preventative actions to safety incidences. Improve quality and timeliness of safety-related decisions.	◆ ▶ \$	Floyd Buhler	Safety Officer Division Manager Branch Heads Supervisors	General Industry Trends in the Canadian Workplace ¹	Cost avoidance of penalties/sanctions; reduction in direct cost of WCB premiums; reduce daim costs; improve productivity; and avoid litigation attributed to regligence daims in avoidable safety incidents.
2	13	How do we optimize meter population?	Water Meter Life Cycle Analytics	Finance and Administration	Ability to identify the optimum time to replace each meter and demonstrate the return on investment. Ability to analyze meter asset information by various characteristics, categories and groupings.	\$ * >	Jason Enns	Superintendent Meters Division Manager Assistant Controllers Branch Heads Planners Supervisors	Clayton County Water Authority (CCWA) in Morrow, Georgia ²	3% of residential meters were under- registering on average \$6 per meter. Nonresidential meters were under- registering on average at \$67 per meter. Total revenue loss amounted to more than \$585,000 over a four-year period. 22 meters were prioritized for replacement and uncovered \$200,000 in lost revenue over the next five-years.
3	23	How can we identify unaccounted water including its theft (based on factors such as water consumption, meter age, and inspection date)?	Non-Revenue Water (NRW) Identification Analytics	Finance and Administration	Ability to distinguish between a meter slowly degrading in reading accuracy versus a sudden change in consumption that could be caused by theft, tampering, open by-pass, change of occupancy, etc. Ability to analyze meter asset information by various characteristics, categories and groupings.	\$ * *	Jason Enns	Superintendent Meters Division Manager Assistant Controllers Branch Heads Planners Supervisors	Multiple-US utilities observed for trends in non-revenue water ^{2,3}	Data analytics help utilities account for and combat 20-30% of annual NRW and accelerates the adoption of Advanced Metering Infrastructure (AMI). Annual global NRW is estimated to be over \$14 billion USD.
4	21	How do we go from >50% to 0% unplanned maintenance?	Wastewater Predictive Maintenance I (Major Pumps)	Wastewater Services	Ability to identify top causes of failures, their probability of occurrence and criticality to operations and service delivery in order to minimize impacts to citizens. Ability to predict when maintenance is needed.	 <!--</th--><th>Richard Ramrattan</th><th>Engineers Division Manager Branch Heads Planners Supervisors</th><th>Multiple-US utilities that implemented Specific Energy Inc.'s Intelligent Pump Station Optimization and Analytics Solution⁴</th><th>Pump optimization and management with data analytics unlocked anywhere from a 18-21% reduction in annual energy costs by minimizing specific energy and ensuring pumps operated within preferred operating ranges (POR).</th>	Richard Ramrattan	Engineers Division Manager Branch Heads Planners Supervisors	Multiple-US utilities that implemented Specific Energy Inc.'s Intelligent Pump Station Optimization and Analytics Solution ⁴	Pump optimization and management with data analytics unlocked anywhere from a 18-21% reduction in annual energy costs by minimizing specific energy and ensuring pumps operated within preferred operating ranges (POR).

WATER AND WASTE DEPARTMENT



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						Value	Business		Real	World Application
Priority	Cruno	chy Question	Use Case	Area of Impact	Desired Success Outcome(s)	Drivers	Champion	Key Users	Client	Success Outcome(s)
5	3	How do we optimize landfill management by guiding services, controlling revenue loss, and adjusting the pricing model?	Landfill Operations Optimization Analytics	Solid Waste	Ability to anticipate and identify anomalous transactions. Ability to prescribe corrective and preventative actions to reduce anomalous transactions and therefore, optimize revenue collection, reduce expenses and prevent revenue leakages. Ability to more accurately and reliably build pricing models that reflect operating costs.	\$ * >	Justin Læ	Planners Division Manager Branch Heads Supervisors Frontline Staff		
6	14	How do we enhance monitoring of compliance?	Environmental Compliance Analytics	 Water Services Wastewater Services Environmental Standards 			Courtney Diduck	Branch Head Division Manager Auditors		
7	24	What are the collective financial implications of a given work order and how can we leverage this information to forecast future costs/effort?	Work Order Cost Analytics	• Water Services	 Ability to easily compare forecasted cost and actual cost by work order and GL. Ability to drill-down to what is still pending for each work order and their cost, labor and material implications. Ability to accurately cost work tasks based on past work and input costs (i.e., labor, materials, equipment, etc.). Use cost data to accurately budget for maintenance activities. Optimize maintenance activities with respect to cost, allowing better decisions to optimize discretionary maintenance activities. 	\$	Michael Szmon	Engineers Division Manager Branch Heads Planners Supervisors	Gwinnett County Department of Water Resources (GCDWR), Lawrenceville, Georgia ⁵	It has benefited from a 70% increase in maintenance work order execution rate, increased it's preventative maintenance work orders by 40%; and reduce it reactive maintenance work order from 67% to 34%.



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8	21	How do we go from >50% to 0% unplanned maintenance?	Wastewater Predictive Maintenance II (High-Value Assets)	Wastewater Services	Ability to identify top causes of failures, their probability of occurrence and oriticality to operations and service delivery in order to minimize impacts to citizens. Ability to predict when maintenance is needed, rather than performing planned maintenance on a set schedule or unplanned maintenance.	<!--</th--><th>Richard Ramrattan</th><th>Engineers Division Manager Branch Heads Planners Supervisors</th><th>Gwinnett County Department of Water Resources (GCDWR), Lawrenceville, Georgia⁵</th><th>GCDWR was able to increase it's equipment availability from 70% to 92% within a 3 year period after leveraging the power of data analytics.</th>	Richard Ramrattan	Engineers Division Manager Branch Heads Planners Supervisors	Gwinnett County Department of Water Resources (GCDWR), Lawrenceville, Georgia ⁵	GCDWR was able to increase it's equipment availability from 70% to 92% within a 3 year period after leveraging the power of data analytics.
9	21	How do we go from >50% to 0% unplanned maintenance?	Wastewater Predictive Maintenance III (Small Pumps)	Wastewater Services	Ability to identify top causes of failures, their probability of occurrence and oriticality to operations and service delivery in order to minimize impacts to citizens. Ability to predict when maintenance is needed, rather than performing planned maintenance on a set schedule or unplanned maintenance.		Richard Ramrattan	Engineers Division Manager Branch Heads Planners Supervisors	Gwinnett County Department of Water Resources (GCDWR), Lawrenceville, Georgia ⁵	GCDWR was able to increase it's equipment availability from 70% to 92% within a 3 year period after leveraging the power of data analytics.
10	36	How do we better predict water revenue in the short term?	Water Demand and Unbilled Water Forecasting	Finance and Administration	More confidently make mid-year revenue forecasts. Ability to calculate the amount of unbilled revenue at the end of the fiscal year with a high degree of confidence.	\$	Wanda Burns	Assistant Controller Division Manager Planners		
11	11	Can we predict customer payment behavior, i.e., which customers will fall in arrears?	Customer Payment Behavior Predictive Analytics I	Finance and Administration	Ability to predict the likelihood of non-payment based on a customer's past behavior and utilize this data to prioritize revenue collection activity. Ability to apply a model and monetize the risk of a non-payment event and consequences of delaying revenue collection.	\$ * >	Wanda Burns	Assistant Controller Division Manager Customer Service		



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Priority	Cruno	chy Question	Use Case	Area of Impact	Desired Success Outcome(s)	Drivers	Champion	Key Users	Client	Success Outcome(s)
12	11	Can we predict customer payment behavior, i.e., which customers will fall in arrears?	Customer Payment Behavior Predictive Analytics II	Administration	Ability to estimate ROI for prioritizing water shut-offs to ensure reliable revenue collection from water usage.	\$ * *	Wanda Burns Jason Enns	Assistant Controller Superintendent Meters Division Manager Customer Service Water Shut-off Crew		
13	35	How do we ensure we are billing for all services provided?	Billing and Services Reconciliation	Finance and Administration	Improve confidence and accuracy of billing for all services provided in a timely manner. Reduce the number of staff dedicated to revenue assurance. Address disjointed information coming from multiple sources of truth (CCB vs CMS vs MANTA vs GIS, etc.).	\$ • >	Wanda Burns	Assistant Controller Division Manager Customer Service		
14	16	How can we predict cart damage and replacement (asset planning)?	Cart Life Cycle Analytics	Solid Waste	 Ability to determine indicators of cart damage (e.g., neighborhood, pick route, customer, seasonal events, number of transactions (i.e., how many times it was picked)) Ability to study indicators as an input to allocate/budget sufficient funds to replace cart assets. Ability to determine number of carts repaired or replaced due to avoidable causes (i.e. contractor damage). 	 ♦ ♥ ▶ 	Justin Lee	Planners Division Manager Branch Heads Supervisors Frontline Staff		

Value Drivers: \$ Financial ♦ Internal ♥ Citizens > Innovation

REFERENCES

ANALYTICS USE CASES SUPPORTED BY REAL WORLD EVIDENCE

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