



Glass Half-full:

Using Machine Learning to keep clean water flowing in Tanzania

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Statement of Work

RBAW Consulting will aid the Tanzanian government in analyzing waterpoints to improve their function and water availability.

Steps:

- Explore and understand problem and dataset
- Create a classification model
- Analyze model and provide recommendations

An oasis, a challenge...



Developing nation

African Great Lakes

56M people

More than half travel more than
1 Km to water

Challenge accepted!



Significant investment in water infrastructure since the 1950s

88% of funding is from external donors

Urban communities benefiting most

Not all have been successful

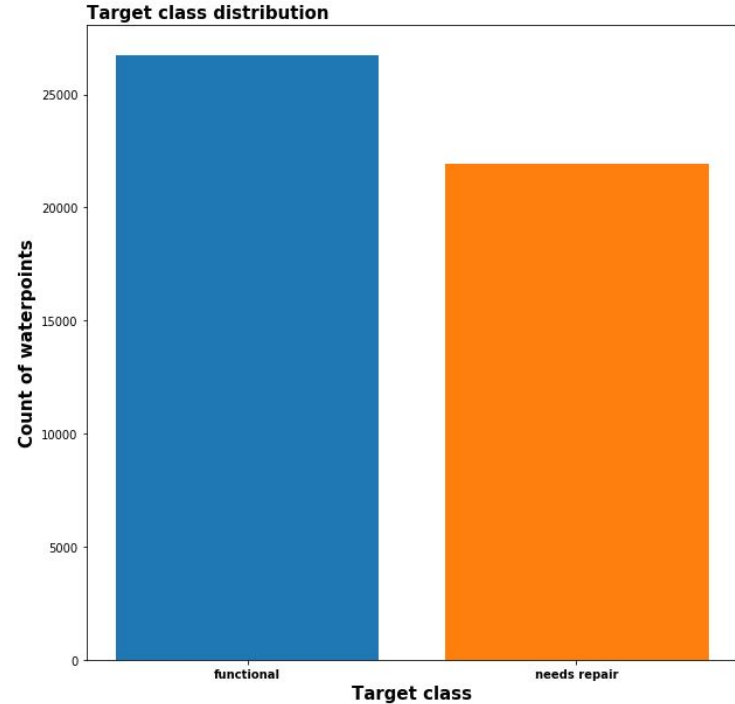


What we want to discover

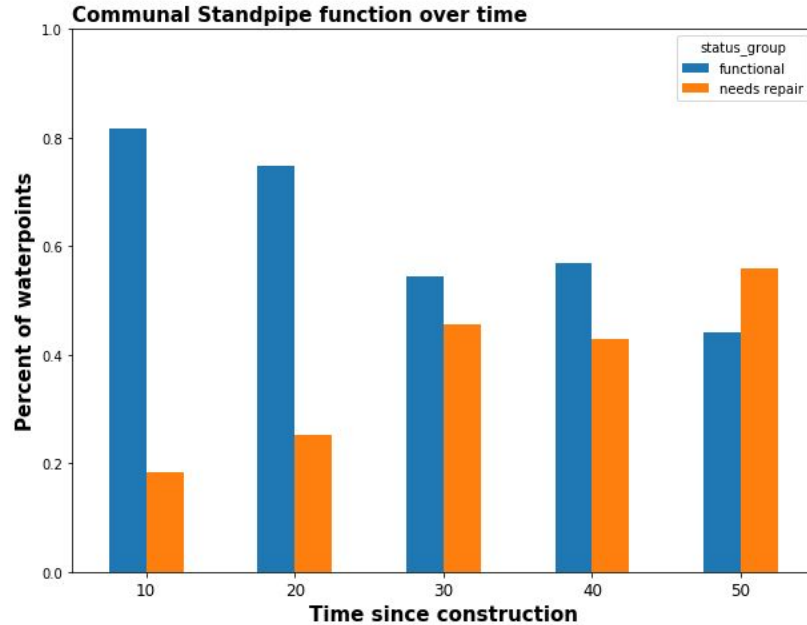
1. Which waterpoint features ensure waterpoint success?
2. Who should fund and install waterpoints?
3. How well can we identify (predict) waterpoints that need repair?

Data and Assumptions

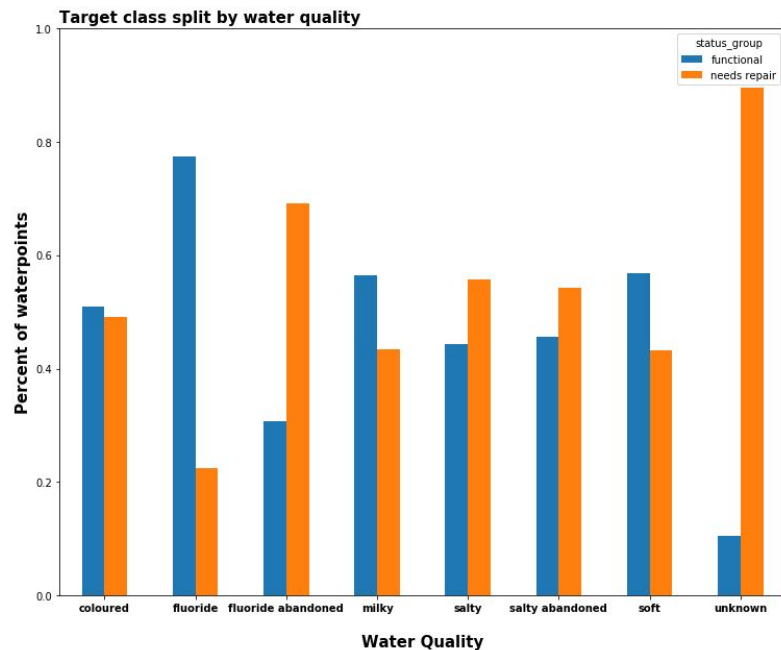
- DrivenData competition
- Specific to Tanzanian waterpoints
- Data collected from March 2011 to September 2011



Waterpoint function declines over time



Waterpoints with fluoride may be most effective?



Water Point Mapping - Data Entry Form

Date of record _____		Recording Organisation _____	
Region _____		Village Longitude _____	
District _____		Village Latitude _____	
Water _____		Village registration no _____	
Village _____		Village Photo ID _____	
Sub village _____			
WP name _____		GPS waypoint Number _____	
Scheme name _____		WP Longitude _____	
Funder _____		WP Latitude _____	
Installer _____		Elevation _____	
Year constructed _____		WP Photo ID _____	

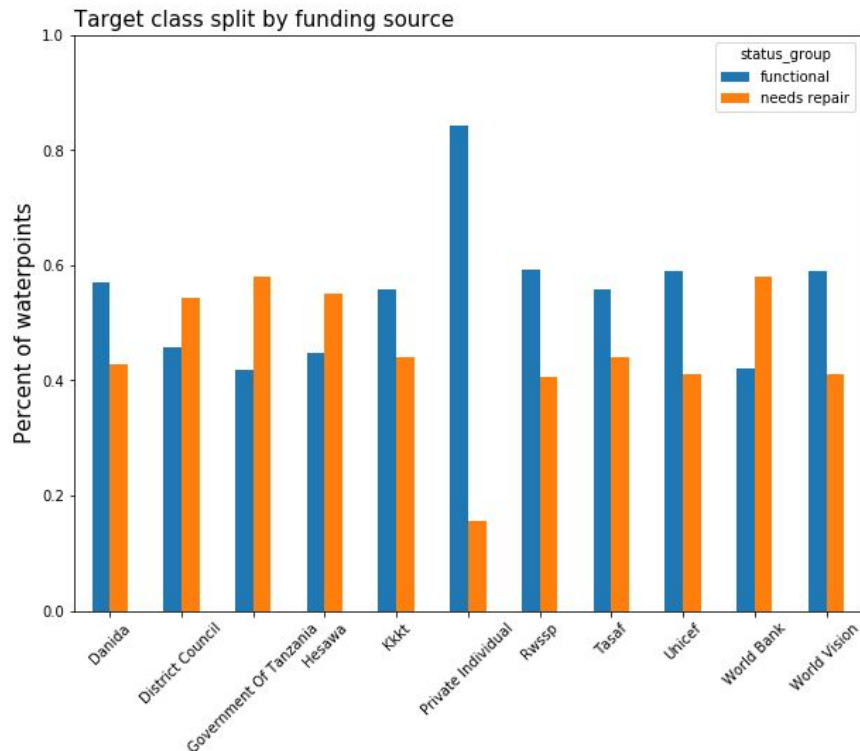
Source Type	Extraction system	Water point type
<input type="radio"/> Shallow well	<input type="radio"/> None	<input type="radio"/> Afridev
<input type="radio"/> Hand-drilled tube well	<input type="radio"/> Mono	<input type="radio"/> Nira/Tanira
<input type="radio"/> Machine-drilled borehole	<input type="radio"/> Cemo	<input type="radio"/> SWN 80
<input type="radio"/> Dam	<input type="radio"/> Climax	<input type="radio"/> India mark II
<input type="radio"/> River/Lake	<input type="radio"/> KSB	<input type="radio"/> Walimi
<input type="radio"/> Spring	<input type="radio"/> Submersible	<input type="radio"/> Windmill
<input type="radio"/> Rainwater Harvesting	<input type="radio"/> Gravity	<input type="radio"/> Other...
<input type="radio"/> Other...		

Status	Main hardware problem	Water quantity	Water quality
<input type="radio"/> Functional	<input type="radio"/> None	<input type="radio"/> Tank out of use	<input type="radio"/> Enough
<input type="radio"/> Non Functional	<input type="radio"/> Source damaged	<input type="radio"/> Pipe broken	<input type="radio"/> Insufficient
	<input type="radio"/> Pump broken	<input type="radio"/> Tap poorly sited	<input type="radio"/> Seasonal
	<input type="radio"/> Pump Stolen	<input type="radio"/> Tap broken	<input type="radio"/> Dry
	<input type="radio"/> Engine broken	<input type="radio"/> Under construction	
	<input type="radio"/> Engine stolen		

Breakdown date	Other reason WP not functional
_____	_____

Scheme Ownership	WP Management	Water Payment	Public meeting about income and expenditure?
<input type="radio"/> VWC	<input type="radio"/> VWC	<input type="radio"/> Pay per bucket	<input type="radio"/> Yes
<input type="radio"/> WUG	<input type="radio"/> WUG	<input type="radio"/> Pay monthly	<input type="radio"/> No
<input type="radio"/> WUA	<input type="radio"/> WUA	<input type="radio"/> Pay annually	<input type="radio"/> Don't know
<input type="radio"/> Company	<input type="radio"/> Company	<input type="radio"/> Pay when scheme fails	
<input type="radio"/> Trust	<input type="radio"/> Trust	<input type="radio"/> Never pay	
<input type="radio"/> Water Board	<input type="radio"/> Water Board	<input type="radio"/> Other	
<input type="radio"/> Parastatal	<input type="radio"/> Parastatal		
<input type="radio"/> Private individual	<input type="radio"/> Private operator		
<input type="radio"/> Other...	<input type="radio"/> Other...		

Waterpoint function varies by funders



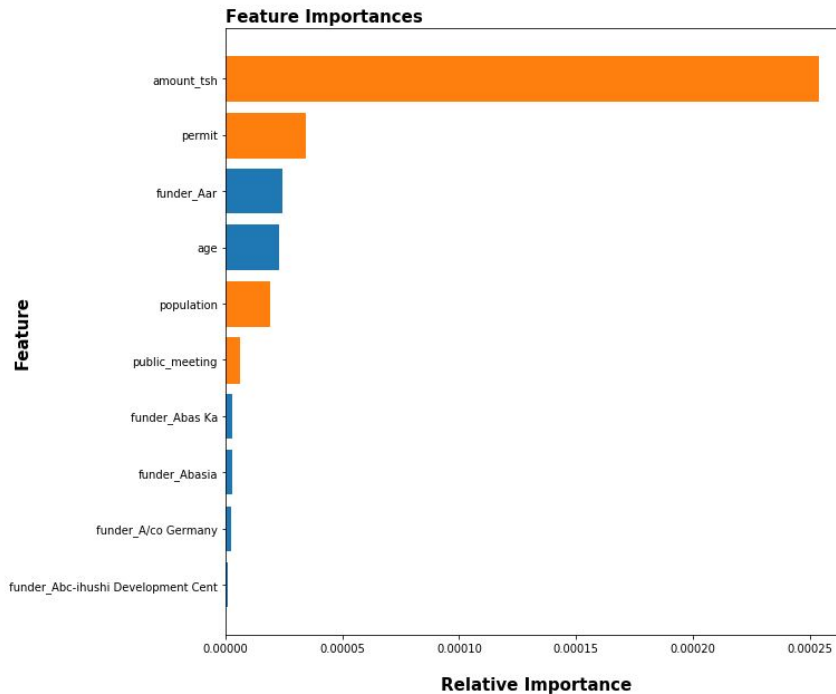
Top 10 funders (by waterpoint count) and their respective functional classes. Is private funding the way?

Model Results

- Our best model was able to correctly classify waterpoints that needed repair **83%** of the time.
- This means maintenance efforts can be coordinated to be tactical and cost-effective

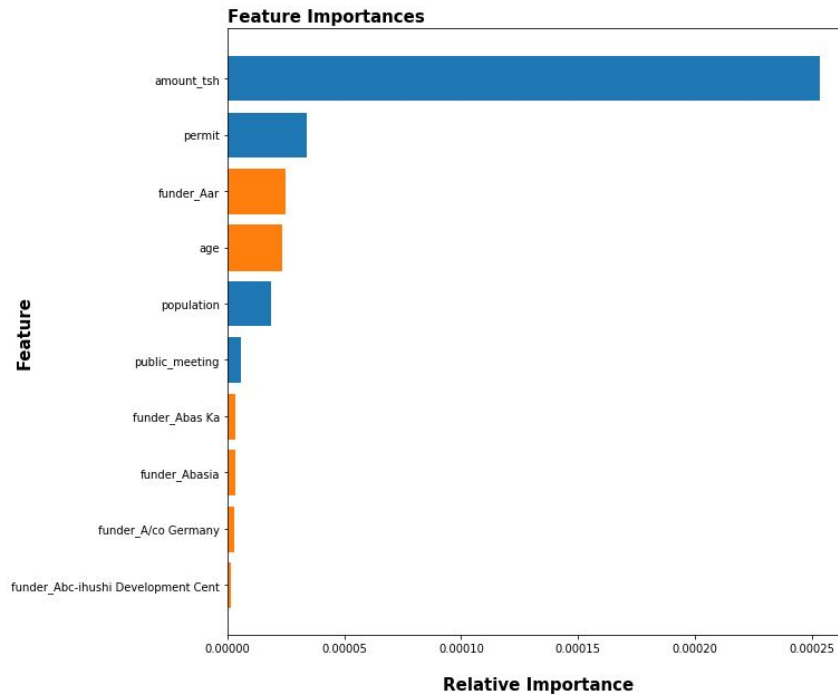
Recommendations

- Waterpoint **total static head**
- **Permittance**
- **Population**
- **Public meetings**



Recommendations

- Partnering with **Funders**



Limitations & Further Research

- The majority of observations had 0 total static head; we would like to know if this is expected or missing data
- We would also like data on waterpoint installation and maintenance cost
- Can we use remote-linked meters to collect data on quality, amount, etc., or is this a 'pipe' dream?





Thank You