

Data4Good Hackathon



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• by Maria Ronacher



Team

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HILFSWERK



Hilfswerk Austria

24-hour care services

- Household services
- Support in lifestyle
- Keeping company
- Assistance with relocation
- Nursing and medical activities



A shirtless man with a ponytail and glasses is performing a deadlift with a barbell. He is wearing dark shorts and has several bracelets on his wrists. The background is a gym setting with wooden walls and equipment.

CHALLENGE

Help revealing conflicts in ongoing relationships

Within the framework of their 24-hour care services for people with physical disabilities, Hilfswerk Österreich provide a matching service between patients and care providers. Cancellations are undesirable.

GOAL

Examine historical cases, in order to get insights on which data features are associated with cancellations.

24-Stunden-Betreuung - Visitenblatt

Betreute Person/en: _____

RV/zust. Fachkraft: _____ Blatt Nr./Datum: _____

Betreuer/in: _____

Beschäftigung	korrekt	mangelhaft	Tätigk. durch Angehörige	Anmerkungen/Änderungen zur Betreuungssituation/Maßnahmen	
Gestaltung des Tagesablaufes	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Einbeziehung KU in Tagesablauf	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Freizeitgestaltung/Beschäftigung einfach/aufwändig	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Haushaltsführung	korrekt	mangelhaft	Tätigk. durch Angehörige	Anmerkungen/Änderungen zur Betreuungssituation/Maßnahmen	
Reinigung Haushalt	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Reinigung persönl. Dinge (Prothese, Brille, Hörapparat, Leibstuhl),...	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Sorgt für eine sichere und saubere Wohnumgebung, Beseitigung erkennbarer Gefahrenquellen für PB und KU	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Wäscheversorgung	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Versorgung der Tiere/Pflanzen	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Müllentsorgung	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Einkauf, Besorgungen und Botengänge	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Essen und Trinken /Kochen	korrekt	mangelhaft	Tätigk. durch Angehörige	Anmerkungen/Änderungen zur Betreuungssituation/Maßnahmen	
Unterstützung Nahrungs- und Flüssigkeitsaufnahme	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Zubereiten Mahlzeiten	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Adäquate Mahlzeit (Diät, Wunschkost,...)	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		
Unterstützung Nahrungs- und Flüssigkeitsaufnahme bei Kau & Schluckstörungen	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>		

DATA

Records of visits and phone calls

The data about **cases** came as a set of PDF forms with records of visits and phone calls made by Hilfswerk employees.

- Two classes: normal or conflict
- Cases: few to several records in time order
- Records: provided services and conversations with the caregivers and patients

PREPARING THE DATA

1. Extraction
2. Anonymisation
3. Cleaning
4. Feature engineering
5. Splitting into training and test sets

Hackathon objectives

- Text mining and sentiment analysis of the text data (conversations with the clients and caregivers)
- Time-series analysis of individual cases (conflict trends)
- Creating a machine learning model to predict status (normal/conflict)



Hackathon accomplishments

- Created multiple random forest classification models
- Performed text mining using different techniques
- Carried out sentiment analysis of conversations with clients and caregivers
- Engineered additional input variables which increased the performance of the models
- Assessed the feasibility of time-series analysis on the available data

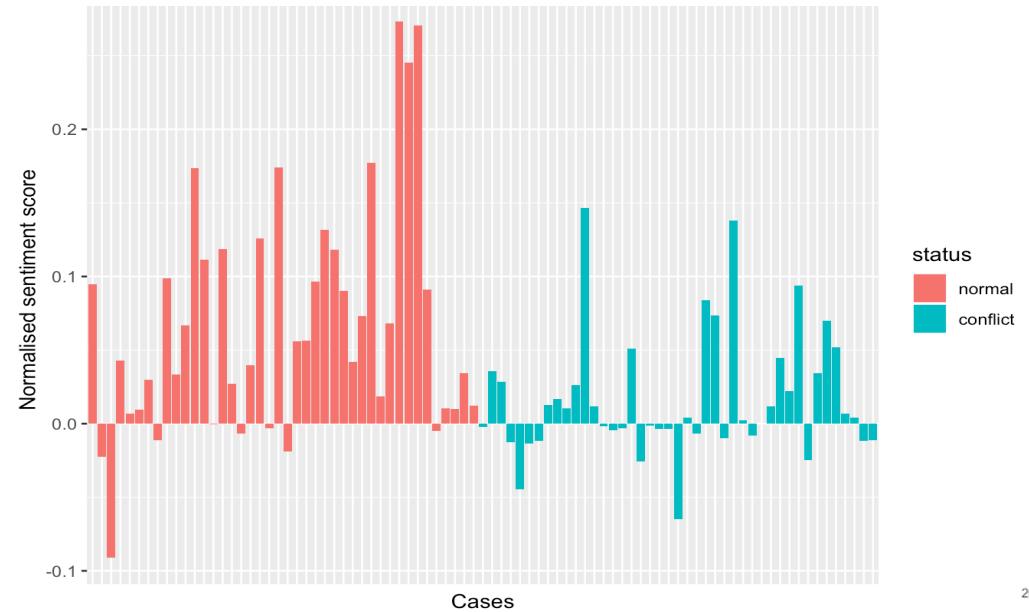


INSIGHTS



Difference in sentiments

- Most normal and conflicted cases have positive sentiment in terms of German language, but the average sentiment score is lower for conflicted cases.
- Records of phone calls have more negative sentiments than records of visits. Larger numbers of telephone calls are associated with conflict.
- Sentiments calculated based on the dataset texts are the most important predictors of whether the case is a conflict or not (overfitting possible!)

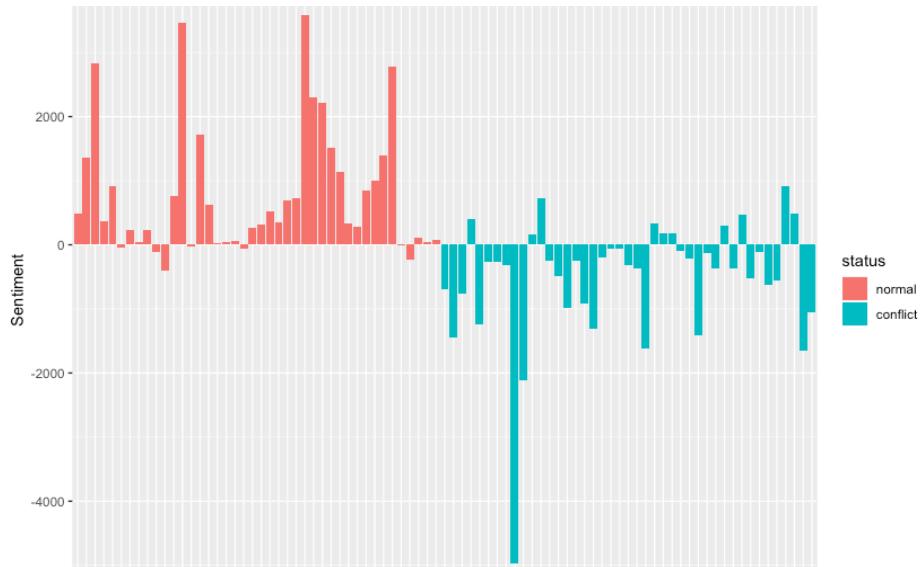


calculated based on
sentiments of German words*

* SentiWS lexicon – a publicly available German-language resource for sentiment analysis

calculated based on the
dataset texts*

* using tf-idf analysis of the normal and conflict
conversations



Possible signs of conflict

- Frequent use of the word ‘nicht’ (especially by the caregiver)
- Usage of family words ('Tochter', 'Mutter', 'Gattin' etc.)
- Many conflicts happen in the first four months of care
- ...

INFERENCE RESTRAINT!

Need more data to validate the hypotheses.

POSITIVE



NEGATIVE



most prominent words
based on tf-idf analysis



most frequent words



POSITIVE

umkehr zurecht
stößt schmerzen
wohl appetit
führt pro gut mobil
trinkt haut intakt
hautdefekte haus
sohnen wc
weiterhin schafft
wochen frisör
unverändert nimmt

NEGATIVE

besprechen schwierig
auftraggeber allerdings
erledigt zimmerdelegation
informiert äußerte
med erste gesagt weiteren
weiß darf braucht
sonde ruft hpif
büro schlecht heute
schlecht telof
jedoch aggressiv
möchte mehrmals
köchen mutter essen
gesprochen gattin
stomaversorgung fördern
verschlechtert betreuerin sprechen

Conclusions

Although we had data and time limitations, we got some valuable results: findings, hypotheses and understanding how to deal with such challenges.

Road ahead

- Validate hypotheses on more data
- More thorough exploration of time trends in the data features, especially the conversations
- Further text mining, e.g. types of important words for normal/conflict cases, caregivers/clients etc.
- Further improvement of the model, e.g. trying different feature sets





THANK YOU!

Website:

<https://trendydots.com/data4good/challenge3.html>

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Questions?