

Feature Engineering

From the lab to the real world of online gambling

Tilman Lesch
Tilman.Lesch@psych.ubc.ca

CENTRE for GAMBLING RESEARCH at UBC











What is gambling?

Feature Engineering – Behavioural Markers

Example: Chasing

Challenges & Outlook

Agenda

What is gambling?

What is gambling?

Gambling, noun

- 1. The activity or practice of playing at a game of **chance** for money or other **stakes**.
- 2. the act or practice of risking the loss of something important by taking a chance or acting recklessly.

UK Gambling Act 2005:

Gambling is defined as **betting**, gaming or participating in a lottery.

Glücksspielstaatsvertrages (§ 3 Abs. 1):

Ein **Glücksspiel** liegt vor, wenn im Rahmen eines Spiels für den Erwerb einer **Gewinnchance** ein **Entgelt** verlangt wird und die Entscheidung über den Gewinn ganz oder überwiegend vom **Zufall** abhängt.

Online gambling, more commonly known as Internet gambling, is typically betting on casino or sports type games **over the Internet**. The temperament of gambling may vary from sports bets to casino style games, e.g.: roulette, poker, slots, lotteries, bingo and keno. It can also be called.

http://www.gamblingcommission.gov.uk

Problem Gambling / Gambling Addiction

Problem gambling / gambling addiction is an urge to gamble continuously despite harmful negative consequences or a desire to stop.

Prevalence:

- 80-90% will loose interest quickly
- Between 5% and 15% are at risk
- Up to 5% are addicted

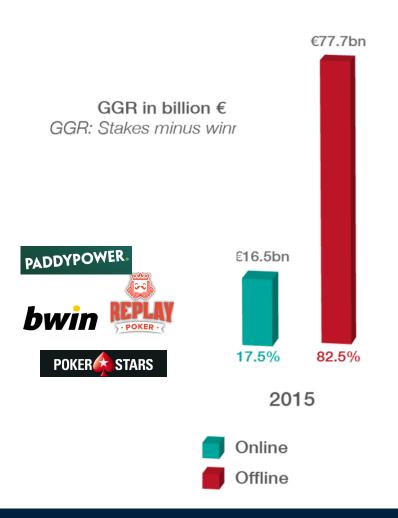
Recognized as 1st behavioural addiction since 2014

DSM-5 Diagnostic Criteria for Gambling Disorder

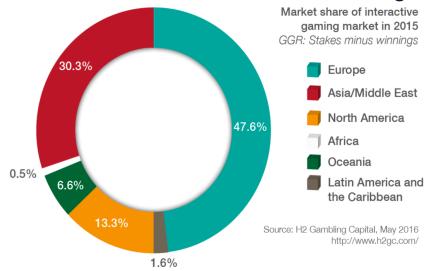
- Development of Tolerance
- Symptoms of withdrawal
- Unsuccessful control of play
- Preoccupation with gambling
- Gambling when feeling distressed
- Loss Chasing
- Concealment of play
- Jeopardize significant relationship, job, or educational or career opportunity



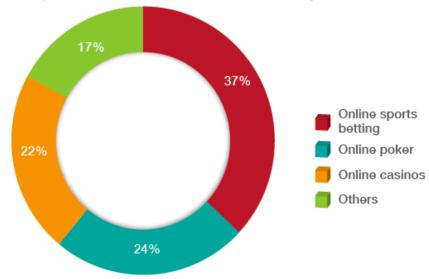
The online Gambling Market



Global Market Share of online Gambling



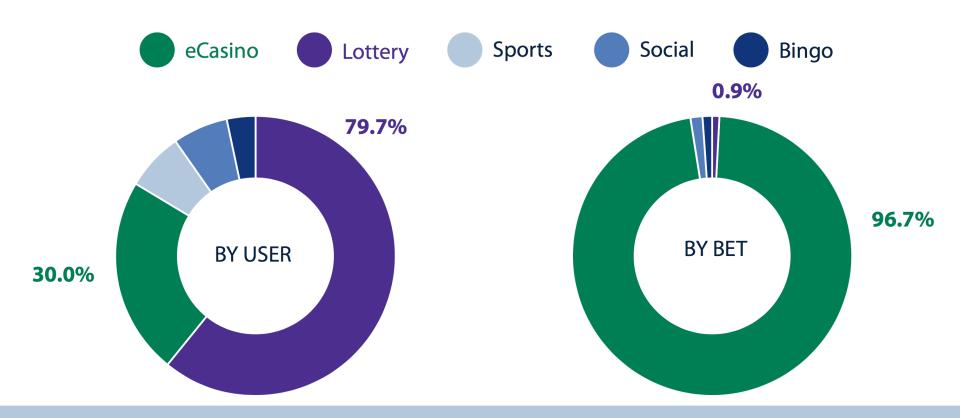
Types of Online Gambling



http://www.egba.eu/facts-and-figures/market-reality/



Games played and bets placed



ONE MONTH OF PLAY (June, 2015), 41,401 USERS, OVER 48 MILLION BETS WITH A TOTAL WAGER OF OVER \$118 MILLION

Source: Online Gambling in British Columbia, Lesch & Clark, 2017



Lottery vs. Casino players

The average (MEDIAN) player made 17 bets of \$3 over the month with a total wager of \$57.80. They played 6 sessions over 5 days, and 4 different games. But average player behaviour varied considerably across game type:

LOTTERY

9 bets

\$3.40 per bet

Total wager: \$36

5 sessions, 4 days, 3 products





763 bets

eCASINO

\$1.20 per bet

Total wager: **\$1,048**

6 sessions, 5 days, 6 products

TOP 5% MOST ENGAGED PLAYERS

LOTTERY

1,666 players 32 bets

\$7.80 per bet

Total wager: \$230

Account for 18.5% total wager





eCASINO

619 players

12,594 bets

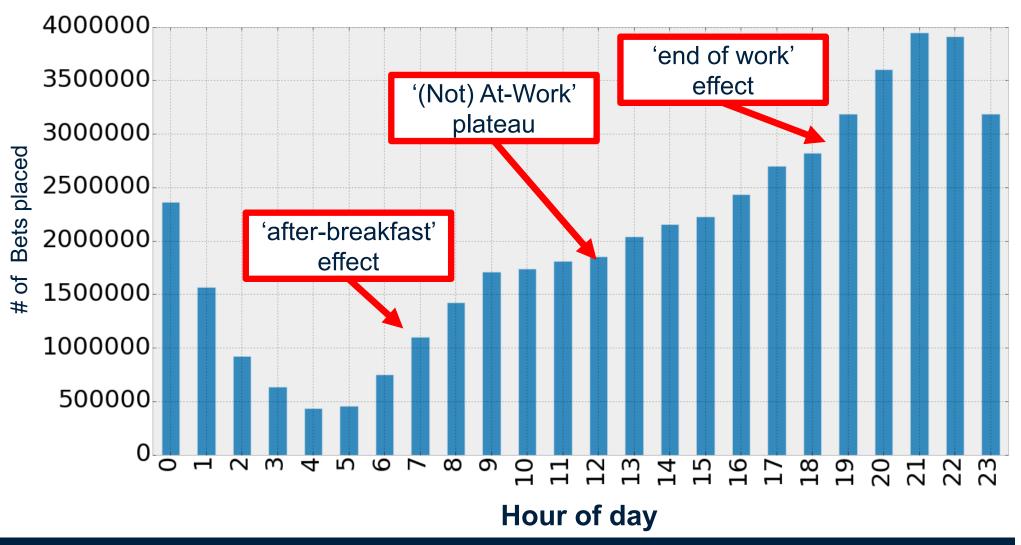
\$6.40 per bet

Total wager: \$66,361

Account for 45.9% total wager

Source: Online Gambling in British Columbia, Lesch & Clark, 2017

Bets placed by Hour of Day



Agenda

Feature Engineering - Behavioural markers

Behavioural markers of online gambling I: *Chasing*

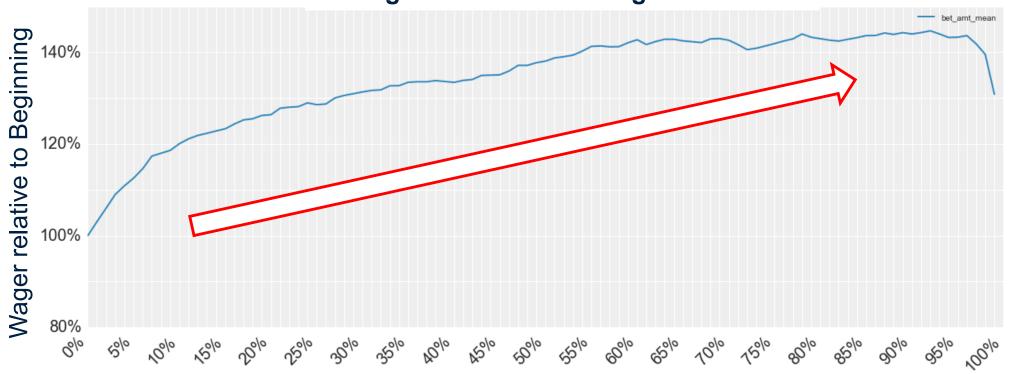
'Loss chasing': Trying to 'win' back previously lost funds



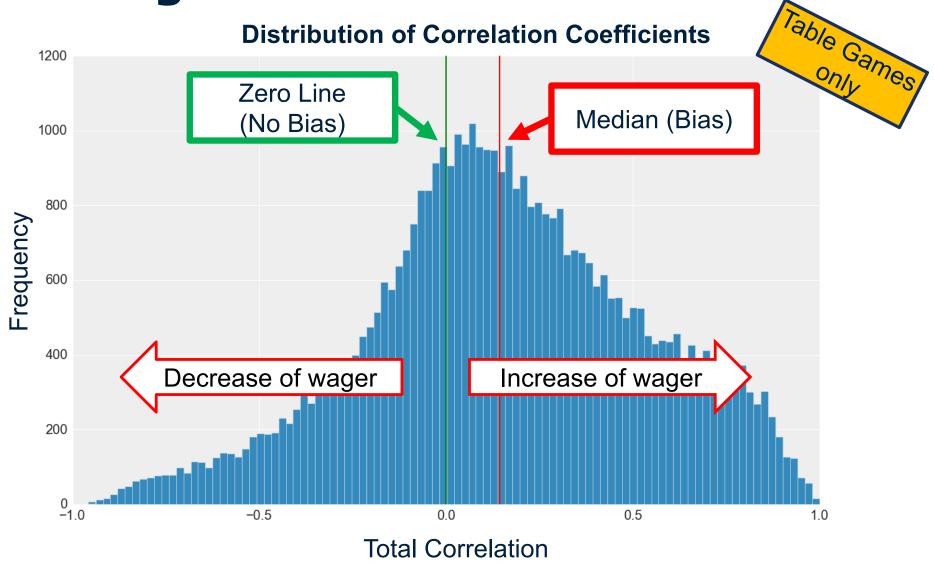
Operationalisations:

- increase bet size
- accelerate betting
- play longer
- play quicker again

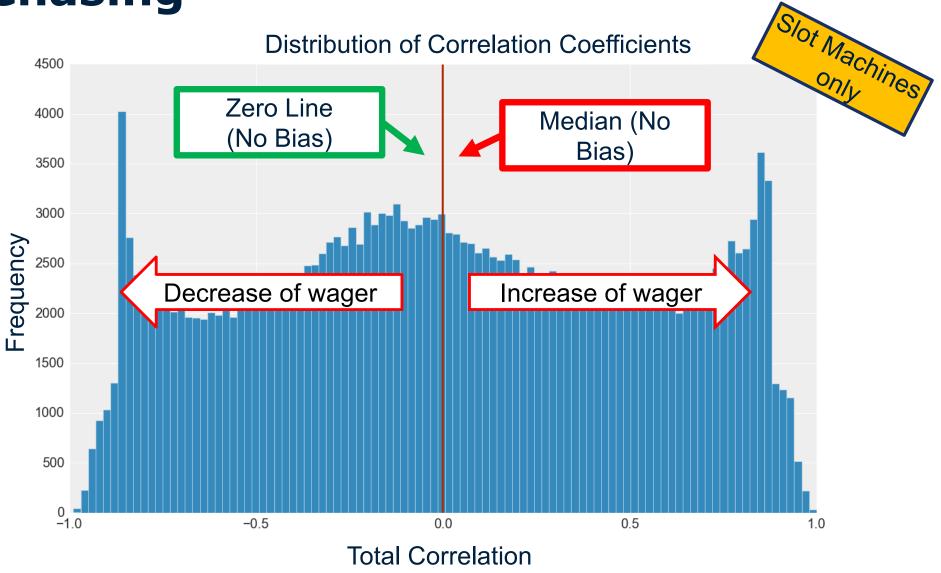
Average amount bet throughout session



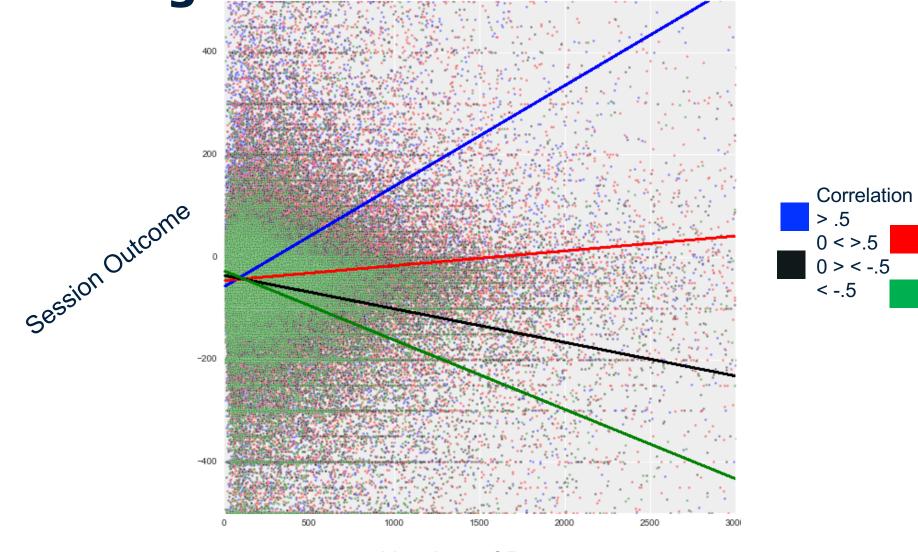
Relative time in session





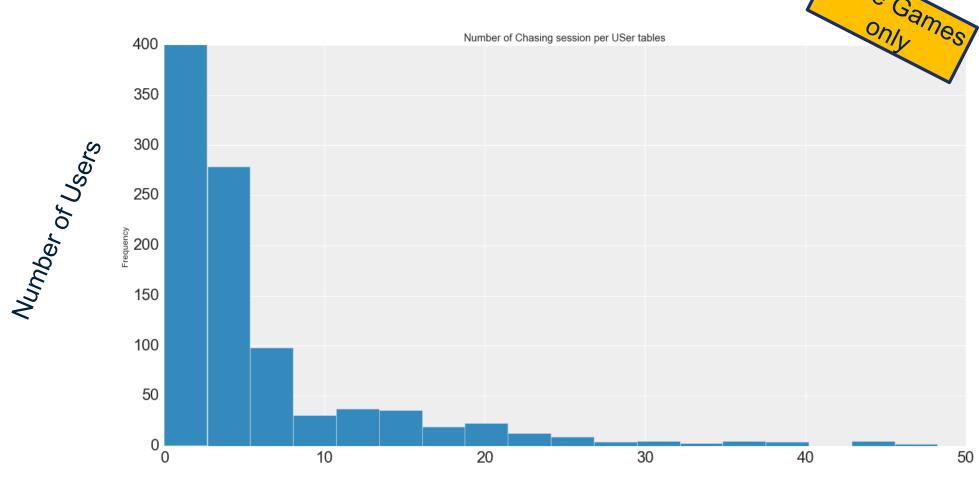






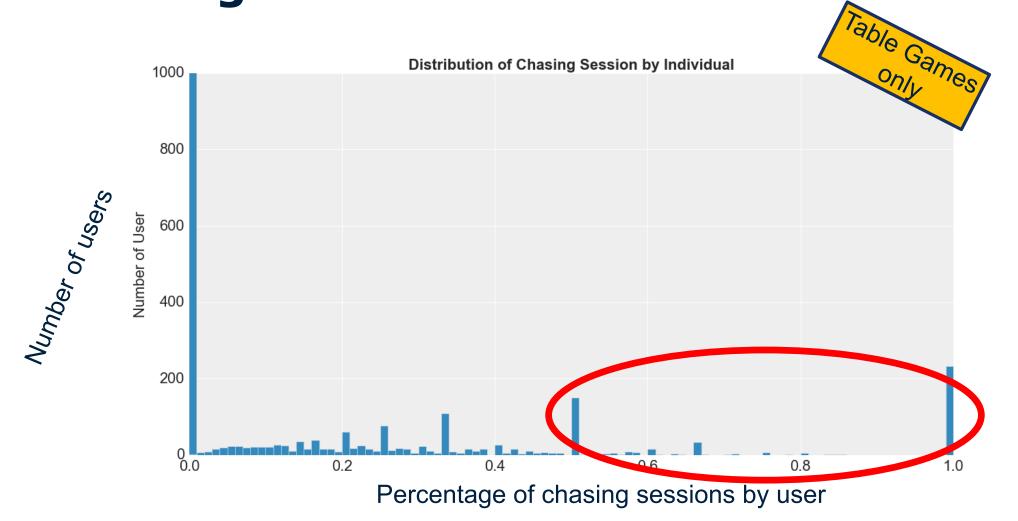
Number of Bets











Outlook and Challenges

- Dilemma of clustering vs. classifying
 - What are the 'right' measures/markers for problematic gambling
 - What what do any method's results have to say about real behaviour?
- The Learning Dilemma
 - What is 'the' addicted gambler?
 - Where is their data?
- The People Dilemma
 - Getting the getting people with the right skills.
- Commercialization.

Thank you for your attention!

Please do talk to me if you:

- are an expert in postgres databases
- have experience in time series analysis
- have experience in logistic analysis
- have similar data
- or... just want to chat.

Acknowledgements

Dr Tilman Lesch
Tilman.Lesch@psych.ubc.ca

<u>CGR</u> Professor Luke Clark BCLC
Dr Kahlil Philander
Bradley Bodenhamer

www.cgr.psych.ubc.ca

Michaela Becker

@CGR_UBC

CENTRE for GAMBLING RESEARCH at UBC



Department of Psychology

Cognitive Biases in Gambling

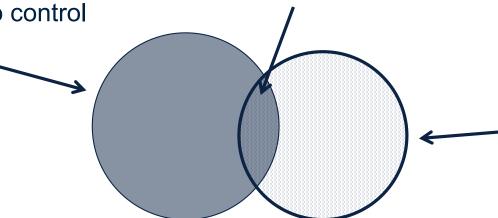
"A cognitive bias is a pattern of deviation in judgment and decision-making, whereby inferences about situations and other people may be drawn in an illogical fashion."

Hot Hand Fallacy:

Illusion of Control: tendency for people to overestimate their ability to control

events.

fallacious belief that a person who has experienced success with a random event has a greater chance of further success in additional attempts.



Sequential/ Streak Effects:

("Gambler's Fallacy": mistaken belief that, if something happens more (less) frequently than normal during some period, it will happen less (more) frequently in the future - balancing).

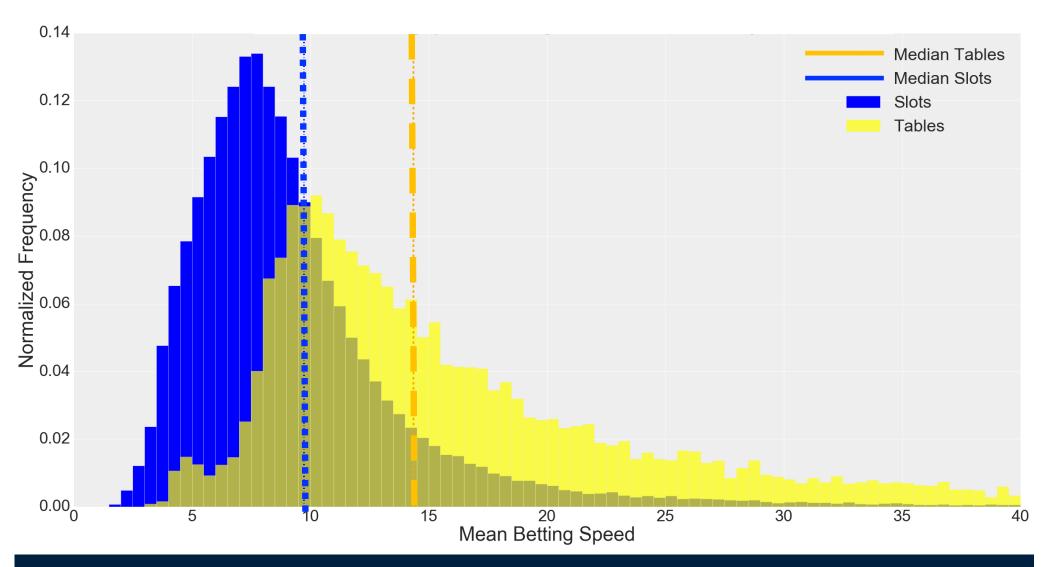
Cognitive distortions play an important role in the development and maintenance of pathological gambling.

Behavioural markers of online gambling II: Betting Speed

Translation for online gambling:

Time between one bet and the next bet within the same session.

Mean overall Betting Speed by individual



CENTRE for **GAMBLING RESEARCH** at **UBC**

Mean Betting Speed difference between winning and losing by individual

