

Telemetry-based Optimisation for User Training in Racing Simulators

François Buhagiar
francois.buhagiar.12@um.edu.mt

ABSTRACT

Motorsports requires training and dedication to master, supplemented by hours of rote learning and mentoring by experts. This study explores the question of whether a serious game is a powerful enough pedagogical tool to be gainfully employed in the training of race drivers. A system of heuristics is proposed for a novel telemetry-based feedback model for contextual real-time suggestions. The model has been integrated into a racing simulation game and a study of its performance reported here. The study consists of 27 participants, partitioned into two groups, to provide a control for the experiment. Two questionnaires have been used to acquire demographic information about the participants and help control for factors such as experience. Quantitative results show that there is an improvement for the group using the feedback system, although this improvement dissipates when the feedback is disabled again for the feedback group. Analysis of the initial results are encouraging, with the model showing promise. Additionally, the lack of cognitive retention on behalf of the participants when feedback was disabled merits further investigation and future work.

Keywords

Sim Racing, Motorsport Training, Serious Games

1. INTRODUCTION

The gamification of areas of activity such as marketing, problem solving and education [12] has validated the use of serious games beyond their initial military use in training strategic skills [4]. Serious games simulate real-world processes designed for the purpose of solving a problem, making their main purpose that of training or educating users. Their popularity has been steadily increasing, as has their adoption, with military [4] and emergency service providers (e.g. firefighters [12]) employing them to train for specific scenarios that might be encountered on the respective jobs. Motorsports cover a broad range of activities and vehicles, and as with all major forms of sporting activities, require

training and dedication, with a pedagogic aspect arising in rote learning and mentoring by experts. The arenas in which motorsport events take place are called circuits; there is a large selection of the latter, ranging from purposely-built race tracks to public roads to natural formations such as hills and quarries. There is also a diverse selection of vehicles that take part in motorsports, with the greatest demarcation existing between motorbikes and cars. The focus of this dissertation is that of unifying serious games and motorsport racing; specifically, it will try to show whether a serious game is a powerful enough pedagogical tool that can be used to tangibly improve the performance of race drivers. The scope of the project is limited to four-wheeled cars racing on purposely-built confined circuits with a smooth tarmac surface.

1.1 Aims and Objectives

The aim of this paper is to demonstrate whether serious games can be used to teach a particular brand of motorsports. In order to establish whether this is possible or otherwise, the following objectives have been set out:

1. Research and develop a model for assessing race driver performance
2. Develop a system of heuristics for providing feedback from the aforementioned model
3. Devise an experimental methodology for evaluating how effective the feedback model is (if at all) in training race drivers
4. Design and develop the main software and support tools for integrating the feedback model into a racing simulation game
5. Carry out a user study based on devised experimental methodology to gather data for analysis
6. Perform statistical analysis on the gathered data to answer research question

2. BACKGROUND WORK

In this section fundamental concepts relevant to this paper are given a brief overview. The section start by explaining what motor sports is and what is expected off a race drive. The section continues by mentioning fundamental concepts such as the racing line and how to achieve the limit of the car. An explanation of telemetry data is given and why it is important. The section concludes by explaining the differences between video games and serious games.

Permission to make digital or hard copies of all or part of this work for personal or classroom use is granted without fee provided that copies are not made or distributed for profit or commercial advantage and that copies bear this notice and the full citation on the first page. To copy otherwise, to republish, to post on servers or to redistribute to lists, requires prior specific permission and/or a fee.

2.1 Motorsport Racing

In circuit motorsport racing, motorised vehicles go round a course for a set number of times. There are various racing disciplines or series, each one having its own specific rules. However, at the core, participants in all disciplines aim to complete a full lap of the circuit in the shortest time. This paper will focus on one such discipline, that of confined car racing, which takes place on smooth asphalt surfaces in purpose-built race tracks in which the aim is to perform the fastest lap possible.

2.2 Racing Line

A race driver needs to figure out how to go round a piece of asphalt in the minimum amount of time [10]. In order to do so, he or she needs to develop techniques for more advanced vehicle control. One such technique is that of mastering the racing line, which is considered the fundamental skill a race driver must understand and master before moving on to anything else [10]. The racing line is the best path through a circuit: if followed, it is the path that yields the shortest time at the highest average speed [2]. The trickiest part in achieving this is to master the racing line of a corner. Corners are split in three sections. The first section is the braking part, where the car needs to sufficiently decelerate in preparation for the *turn-in point*. Thus, the second partition of the racing line at a corner is the segment between the turn-in point and the apex point, which is the inside mid-point of the corner (see Figure 1). After the turn-in point, the driver aims for the apex point. The final section of the racing line in a corner lies from the apex point onwards, where the driver must gradually accelerate out of the corner, while still turning, aiming for the outside apex (see Figure 1).

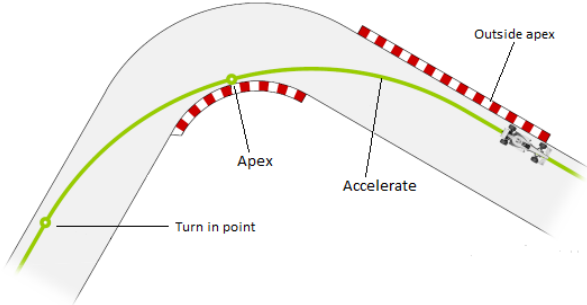


Figure 1: Racing line through a 90° right corner

2.3 Limit Of The Car

After the driver develops a good grasp of the racing line, the limit of the car must be found. This is the highest speed the car can be driven while still retaining some measure of control. Various studies have been carried out to define such a limit in terms of the physical properties of the car and its environment [2]. The most important property is the level of grip the car can achieve and sustain on track. A number of factors contribute to the level of grip. Most notably, one very important factor is the tyres as they are the only contact the car makes with the track, and allow for braking, accelerating and turning forces to be transferred to the asphalt.

Each tyre has two properties which are of particular interest: the slip ratio and slip angle. The slip ratio refers to the level of slip occurring between tyre rotational velocity and the asphalt which occur during acceleration and deceleration. The *slip ratio* is expressed as a percentage: a slip percentage of 100% means that the tyre is rotating but the road is stationary. In jargon, this is called *wheel spin*. On the other hand, a percentage of -100% indicates that the tyre is not rotating but the road beneath is moving. This can occur when braking too hard and is called *locking the wheels*. Both events need to be avoided by the driver as they not only put excessive wear and tear, they also impact negatively the performance of the driver. For an optimal braking procedure, the slip ratio should be between 10% to 15% [10] and no slip should occur during acceleration.

The slip angle is the angle between the tyre's desired direction (perpendicular to the axis of rotation of the tyre) and the tyre's actual direction (the direction the car is moving in). Given both the actual direction of travel (\mathbf{d}_t) and the desired direction (\mathbf{d}_d) are known, the slip angle s_a is calculated as follows:

$$s_a = \cos^{-1}(\hat{\mathbf{d}}_d \cdot \hat{\mathbf{d}}_t), \quad (1)$$

where $\hat{\mathbf{d}}_d = \frac{\mathbf{d}_d}{|\mathbf{d}_d|}$ and $\hat{\mathbf{d}}_t = \frac{\mathbf{d}_t}{|\mathbf{d}_t|}$ are the normalised direction vectors for desired and travel directions respectively.

Whenever the slip angle is above 0° ($s_a > 0$) the tyre is said to be in an understeering situation. Understeer can be caused by active factors such as cornering speed, throttle application, braking, steering inputs and weight transfer. A tyre has an optimal slip angle at which grip is maximised during cornering. The optimal slip angle for a road tyre is about 5° , whereas for a slick tyre, which is purposely constructed for racing, is about $8^\circ - 10^\circ$ [2].

An oversteering situation may arise from lack of grip; while understeer is caused by a lack of grip in the front tyres, oversteer is caused by a lack of grip on the rear tyres. Oversteer is usually denoted by the rear of the vehicle becoming unstable resulting in its rotation such that the driver is facing towards the inside of the corner. Similarly to understeer, the active factors causing oversteer are also cornering speed, throttle application, braking, steering inputs and weight transfer. Oversteer is usually induced by braking during a corner or accelerating too hard in a rear wheel drive vehicle.

2.4 Telemetry Data

In motorsport, telemetry data contains measurements of vehicle dynamics from the engine and other components and is transmitted to receiving equipment for remote monitoring. These measurements can serve to monitor and reconstruct the vehicle state at a particular point in time. Telemetry data in motorsports usually accounts for measurements of speed, engine speed, component temperatures, slip angles, slip ratios, etc. Telemetry is widely regarded as the most important source of information by motorsports engineers; analysing this data can lead to a better understanding of the respective strengths and weaknesses of the car and the driver [7]. In this work, we posit that through the real-time analysis of telemetry data, the pedagogical aspect of sim racing can be exploited to teach race driving to non experts.

2.5 Racing Simulation Rigs

The racing simulation rig (sim racing rig) is a piece of

equipment designed to mimic the cockpit of a real-world car. The quality of a sim racing rig is dependent on its authenticity - how similar it is to a real-world car - and its build quality. These rigs come in various shapes, forms and sizes, from hangar-sized hydraulic-driven car chassis, that cost millions of Euro, to the more modest, built from off-the-shelf commodity hardware. Minimally, a rig should provide a steering wheel, seating and a display. More sophisticated rigs augment the user experience by employing gear shifters, and clutch, throttle and breaking pedals. The more advanced components are furnished with a force feedback mechanism, a form of haptic technology used to replicate the sense of touch by applying forces or vibrations, or motions to the user [9].

2.6 Video Games and Serious Games

The main contrast between video games and serious games is the use of pedagogic activities which aim to educate or instruct knowledge or skill [14] in serious games as opposed to the pure leisurely aspects of the video game. Pedagogy is given preference over the amusement value which in some cases might not be found in serious games [14]. Serious games need to educate the player with a specific type of content, whereas videos games need to entertain the player with whatever; racing, puzzles, it does not really matter, as long as the player enjoys it [5]. On the other hand, serious game designers have multiple objectives, they still need to create a compelling and fun game, but also an educating and realistic game. From this it follows that three aspects as essential for a serious game, fun, learning and validity [5]. The serious game should make use of pedagogical methods and theories to ensure knowledge can be conveyed.

3. RESEARCH METHODOLOGY

This section will provide insight behind the research methodology used in this study. The section starts by explaining the experiment design followed by an overview of the hardware and software used during the experiments. The experiment procedure is explained and the section concludes by going over the statistical tests which will be used.

3.1 Experiment Design

In the experiment, each group would be utilising the same car and racetrack. Bastow et al. [1] suggest that cars equipped with a front wheel drivetrain may be easier to handle. The Fiat 500 Abarth was the car chosen for the experiments, partially based on Bastow et al.'s findings. The car is relatively low-powered and thus, easier to use by beginning drivers. The Silverstone National race track has the desirable properties of being flat and smooth, without uneven surfaces or bumps which may result in loss of control in rookie drivers. Furthermore, the way the track is structured, with wide run-off areas located along the circuit where drivers are most likely to lose control of the car, allows the car to slow down before colliding with barriers or other stationary objects.

Two feedback mechanisms have been considered for this experiment, *visual*, through the use of a heads-up-display (HUD) superimposed on the simulation display, or *auditory*, by means of descriptive speech projected through loud speakers. Leahy et al. [8] argue that auditory feedback is less intrusive than visual clues; based on these findings, it was decided that the system should provide feedback using auditory clues.

3.2 Experiment Materials

The setup of the experiment was divided into three material categories: *simulation environment*, *simulation hardware* and *simulation software*, with each category subscribing to a number of desirable properties:

Environment The experiment should be carried out in an isolated, noise-free and well-lit room. Participants would be let in the room one at a time, to ensure the experiment is conducted without any distractions.

Hardware The hardware components identified for this experiment are the (i) display output, (ii) audio output, (iii) steering wheel, (iv) gear shifter, (v) acceleration, brake and clutch pedals and (vi) seating frame.

Software The software aspect of the experiment, which is primarily the racing simulator, should have a number of desirable properties. In particular, the simulator should provide (i) a realistic driving model, (ii) driving aid customisation, (iii) high-fidelity graphics, (iv) real-world tarmac circuits, (v) and telemetry data access through an interface that is intuitive to use.

3.3 Experiment Procedure

Participants are gathered through various methods, ranging from word-of-mouth to mailing lists, where each participant would reserve an experiment time slot. Participants are split randomly into two groups. The first group is referred to as the *feedback group*, the second as the *control group*.

Introduction Each participant is introduced to the setup and given an overview of the experiment procedure.

Demographic Questionnaire The experiment starts by having the participant responding to a brief questionnaire, aimed to gather more insight about the general participant demographics.

Rig Configuration The user climbs inside the rig; the seating position is adjusted to accommodate the user, making sure he or she is sitting comfortably. Participants are given a second, more in-depth overview of the components of the rig and how they operate.

Practice (10 minutes) The participant is given ten minutes to get used to the rig setup, track and car.

Break (5 minutes) A short break (5 minutes maximum) is given to each participant.

1st Session (10 minutes) In this session, the participant drives the racing car around the track for ten minutes. Participants in the feedback group have the feedback system turned on, while for the control group, this is turned off.

Break (5 minutes) A short break (5 minutes maximum) is given to each participant.

2nd Session (10 minutes) A second ten minute session is held; participants in the feedback group have the feedback system turned on, while for the control group, this is turned off.

Break (5 minutes) A short break (5 minutes maximum) is given to each participant.

3rd Session (5 minutes) A final five minute driving session; the feedback system is turned off for participants in both groups.

Feedback Questionnaire The experiment concludes by the participant responding to a questionnaire about experiment structure, apparatus quality, performance perception and free-form participant feedback.

3.4 Data Analysis

In order to evaluate the performance of each of the two groups (control and feedback) and perform meaningful statistical comparisons between them, the collected data were subjected to Independent T-Test [13] and the Mann-Whitney U Test [11]. These are appropriate tests for independent groups [3]. In our case, the groups are indeed independent because a participant from the control group may not make part of the feedback group and vice versa. The null hypothesis is that there is no significant difference across the groups, while the alternative hypothesis is that there is significant difference across the groups.

4. DESIGN AND IMPLEMENTATION

This section starts by giving an overview of the core requirements for the main software artefact which we refer to as *Telemetry Assisted Racing (TeAR)*

4.1 Content Creation and Annotation

The telemetry data stream read-out from Assetto Corsa does not provide sufficient information about the environment for TeAR to make informed decisions about possible feedback. The feedback mechanism used in TeAR is highly dependent on the racing line, which in turn, is a function of the track geometry. The creation of the *Track Splicer and Visualiser*, a supporting tool that extracts track information from the Assetto Corsa data files and provides additional annotations to this data was required by TeAR.

4.2 Persistence of Telemetry Data

Log files containing telemetry data from each user session are inserted into a database management system for offline analysis. An extraction transfer loading (ETL [6]) process was purposely built, which takes as input a log file and inserts processed data as records into a database. This database is then used to run SQL queries related to the evaluation of the experiment.

4.3 System Architecture

4.4 Telemetry Input Interface

This component handles all data input, either static on a per-track basis or real-time during a user's session. Static inputs include data generated by the track splicing tool. Real-time input is generated by Assetto Corsa which exposes a UDP server for TeAR to connect to and receive telemetry data.

4.5 Processing

Telemetry data is consumed by the processing module, which coordinates a number of sub-modules each consuming the same telemetry data in a different way (e.g. Logger,

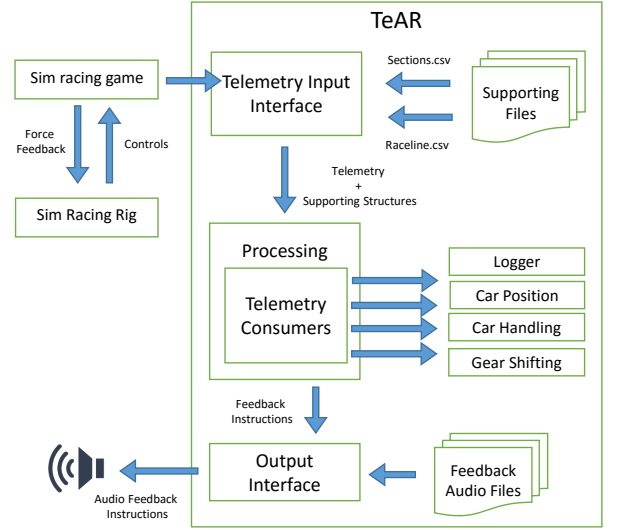


Figure 2: Overview of the system architecture components

Car Handling Feedback). These sub-modules run on separate threads and communicate and synchronise with the main processing module using shared memory. Any feedback notification raised by the sub-modules is captured by the processing module, which in turn forwards the message to the output module.

The feedback processing sub-modules possess a common structure; each module is bound to a telemetry event. These events may be triggered by changes in one or more of the incoming telemetry data values. When an event is triggered, the respective sub-module will start the analysis process related to the respective telemetry information. Eventually, when the corresponding termination event (not necessarily tied to the same telemetry data as the activation event) is triggered, a decision is taken as to whether provide feedback or not, and if so, which feedback.

The system operates using two feedback tiers; initially, at the first tier, only feedback related to the racing line is provided. As the user masters the racing line, the system will switch to the second tier and suggest more advanced feedback.

4.6 Output Interface

The final component in TeAR's pipeline is the Output Interface, through which feedback suggestions coming from the Processing module are presented to the user. This module connects to a repository of audio soundbites that map to the input feedback from the previous module. The audio files in the repository were generated using a free online text-to-speech tool¹. The module does not support concurrent playback of audio feedback by design, since this would overwhelm the user. Furthermore, since feedback is topical, buffering of feedback was intentionally omitted.

5. EVALUATION

In this section findings from the user study are presented. The section start by describing the hardware setup used for

¹<http://www.fromtexttospeech.com>

the experiments followed by an overview of the participants' demographic. Experiments results are presented showing the resulting dataset for the lap times and the outcome of the statistical analysis. Participants' feedback is presented and the section concludes with a discussion resulting from the findings.

5.1 Experiment Setup

The user study has been carried out in line with the methodology described in Section 3. The sim racing rig framework was custom-built, and the Logitech G25 input devices mounted on it. The display device used was a 32" LCD HD Samsung monitor also capable of outputting stereo audio from 2x10W speakers. The racing simulator used in this experiment is Assetto Corsa by Kunos Simulazioni, running in full HD resolution at 60 frames per second (fps). The hardware platform running the simulator is an Intel Core i7-940, with 8GB of RAM and an Nvidia 660Ti video card with 2GB VRAM. The machine is running the retail version of the Windows 10 Professional operating system.



Figure 3: Side view of the racing rig

5.2 Sample Demographic

During the experiments, 27 participants took part most of which were males in their early twenties. Out of 27 participants, 2 did not hold a driving license; 25 had a driving license, although most of them haven't been driving for more than a year. 22 participants claimed to play video games, from which 18 stated to have played racing video games. Out of these 18, a majority of 15 play mostly arcade sim racing games, while the remaining 3 regularly play simulation racing games. 7 out of 27 participants have previously used a racing rig. Random assignment was used to split the participants into the control and feedback/experimental group. The control group had 13 participants, while the feedback group had 14.

5.3 Experiments Results

The dataset of the 1st session shown in Figure 4 was subjected to the Kolmogorov-Smirnov Test; the result had a p-value of 0.360, with a significance level of 0.05 the null hypothesis is accepted. The groups share the same distribution, hence the Mann-Whitney U Test can be used.

The Mann-Whitney Test is used to determine differences in the groups. The results of the test are shown in Table 1.

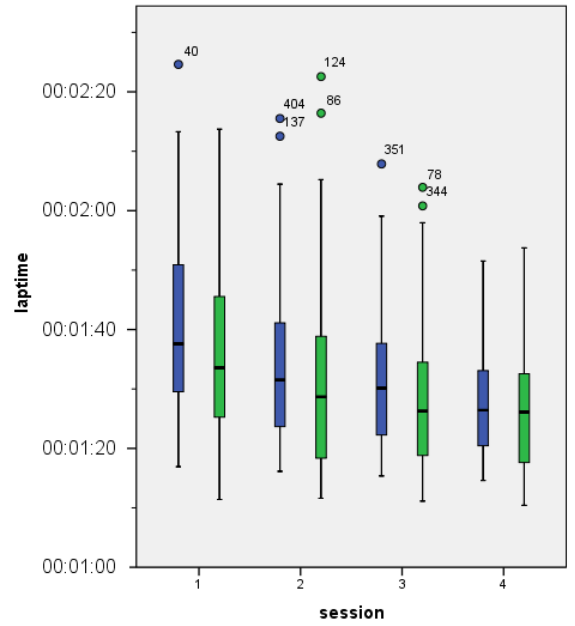


Figure 4: Blue : Control Group, Green : Feedback group

Lap times vs session, clustered by group

For the first session these show a p-value of 0.057, with a confidence interval of 0.95 resulting in no statistical difference between the groups (p-value > 0.05, thus accepting the alternative hypothesis). The tests for the second and fourth session have a p-value of 0.054 and 0.539 respectively; both values are above the significance level of 0.05, resulting in the alternative hypothesis being accepted. The third session, however, has a p-value of 0.029, resulting in accepting the null hypothesis suggesting there is statistical difference in the groups' performance.

5.4 Participant Feedback

The participants reported a good experience overall. The rig setup was found to be realistic and easy to use. With respect to the difficulty of the race track, an overwhelming majority of the respondents reported having issues mastering the second and third corners (referred to as the *s-bend*). When the feedback group was asked about TeAR, they reported the feedback and the output quality of the audio to be intelligible, accurate and helpful. They also said that the feedback hints were somewhat easy to apply. Lastly, when asked whether the feedback was intrusive and possibly distracting, 10 out of 14 respondents reported that it was neither intrusive nor distracting.

5.5 Discussion

The rig setup has been well received, with participants enjoying the driving and awarding it a high score in terms of realism. This suggests that it is possible to achieve a good level of realism using simple off-the-shelf hardware. Both groups show a noticeable improvement from one session to the next, except for the final session in which the shorter time slot allocated might have put additional pressure on the participants, hindering their performance. For the second session, the tests shown no statistical differences in the per-

	LapTime			
	1st Session	2nd Session	3rd Session	4th Session
Asymp. Sig. (2-tailed)	.057	.054	.029	.539

Grouping Variable : Group

Table 1: Mann-Whitney U Test result for Experiments' Sessions

formance of the two groups, albeit this changed for the third session. The lower average lap time for the feedback group suggests that after familiarising with the feedback system, the group started following its instructions more closely, thus improving their performance.

The available sample of participants is too small to test for correlation between gaming experience and lap times. The same argument can be made for a possible correlation between holding a driving licence and driving performance, since all but two participants are in possession of a driving licence.

6. CONCLUSIONS

The skills required to become a good motorsport driver are generally learned through practice, and suggestions provided by more experienced drivers. Our hypothesis for this work is that an automated telemetry-based feedback system can be used to simulate this process and thus, to possibly help novice drivers assimilate this knowledge at a higher rate. For this purpose, TeAR was developed, which using a static expert system, presents auditory suggestions to drivers underlining the driving mistakes they are currently making. An was set up to verify this hypothesis with 27 participants taking part. From the data gathered in this experiment, it appears that the real-time feedback was effective to some extent; however, the participants seemed to be having difficulty retaining and applying the suggestions once it was switched off. This lack of cognitive retention may be due to a number of reasons, which could be investigated in future work.

6.1 Future Work

At present, TeAR presents feedback only when the driver is performing something wrong. It would be interesting to determine whether a system which also presents positive feedback, for instance letting the driver know that a previously reported mistake was actually corrected, would lead to any improvements. Furthermore, it is also possible to experiment with a variety of feedback methods, both visual and auditory, on the assumption that different feedback presentation media can lead to changes in the learning rates. Combining both auditory and visual feedback could help in increasing the clarity of the feedback provided. The feedback mechanism of TeAR is entirely based on telemetry data provided by the racing simulation software. However, a number of mistakes cannot be directly extracted from this data. For instance, during the experiment it was noted that some of the participants lacked some basic driving skills such as keeping both hands on the steering, not crossing hands while steering and not resting hands on the shifter. This additional information could be collected through the use of a motion tracking camera which directly feeds TeAR.

TeAR is currently intended to help drivers improve their motorsport driving skills. A future direction could also look into the possibility of using TeAR to automate the driving

process of a racing car. One possibility is that of using neural nets and fuzzy logic controllers, with both models learning how to drive via the feedback provided by TeAR.

7. REFERENCES

- [1] D. Bastow, G. Howard, and J. P. Whitehead. *Car suspension and handling*. SAE international Warrendale, 2004.
- [2] B. Beckman and N. B. R. Club. The physics of racing, part 5: Introduction to the racing line. *online*/ <http://www.esbconsult.com.au/ogden/locust/phors/phors05.htm>, 1991.
- [3] M. De Smith. Statsref: Statistical analysis handbook-a web-based statistics.". 2015.
- [4] D. Djauti, J. Alvarez, and J.-P. Jessel. Classifying serious games: the g/p/s model. *Handbook of research on improving learning and motivation through educational games: Multidisciplinary approaches*, pages 118–136, 2011.
- [5] C. Hartevel, R. Guimarães, I. Mayer, and R. Bidarra. *Technologies for E-Learning and Digital Entertainment: Second International Conference, Edutainment 2007, Hong Kong, China, June 11-13, 2007. Proceedings*, chapter Balancing Pedagogy, Game and Reality Components Within a Unique Serious Game for Training Levee Inspection, pages 128–139. Springer Berlin Heidelberg, Berlin, Heidelberg, 2007.
- [6] R. Kimball and J. Caserta. *The data warehouse ETL toolkit*. John Wiley & Sons, 2004.
- [7] B. Knox. A practical guide to race car data analysis". 2011.
- [8] W. Leahy, P. Chandler, and J. Sweller. When auditory presentations should and should not be a component of multimedia instruction. *Applied Cognitive Psychology*, 17(4):401–418, 2003.
- [9] Q. Li. Can driving in games translate to driving in real life? a study of game based traffic education. *Developments in Business Simulation and Experiential Learning*, 42, 2015.
- [10] C. Lopez and D. Sullivan. *Going faster!: mastering the art of race driving*. Bentley Publishers, 2001.
- [11] H. B. Mann and D. R. Whitney. On a test of whether one of two random variables is stochastically larger than the other. *The annals of mathematical statistics*, pages 50–60, 1947.
- [12] D. R. Michael and S. L. Chen. *Serious games: Games that educate, train, and inform*. Muska & Lipman/Premier-Trade, 2005.
- [13] Student. The probable error of a mean. *Biometrika*, pages 1–25, 1908.
- [14] M. Zyda. From visual simulation to virtual reality to games. *Computer*, 38(9):25–32, 2005.