

Does Limit on Work-In-Progress (WIP) matter?

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Abstract

Contents

1	Introduction	1
1.1	Motivation	1
1.2	Research Question	2
1.3	Approach	2
1.4	Contribution	3
1.5	Chapter overview	3
2	Background	5
2.1	Waterfall	5
2.2	Scrum	6
2.3	Lean	7
2.4	Kanban	9
2.4.1	Kanban Board	10
2.4.2	WIP limit	11
2.4.3	Limit WIP vs. Unlimited WIP	12
2.4.4	Benefits with setting WIP limit according to various articles . . .	13

2.5	Lead time	14
2.6	Just-In-Time	15
2.7	Throughput	16
2.7.1	Example of throughput measurement	16
2.8	Code churn	17
2.9	Software Innovation	17
2.9.1	Teams	18
3	Research Methods	21
3.1	Case study	21
3.2	Choice of case	22
3.2.1	Software Innovation's development process	24
4	Data collected and calculations	27
4.1	WIP per day	28
4.1.1	Step 1: Gather all unique dates into a ArrayList	28
4.1.2	Step 2: Gather the remaining dates	29
4.1.3	Step 3 Measure WIP	30
4.1.4	Example	31
4.2	Rest of the variables	34
4.2.1	Throughput	35
4.2.2	Churn	36
4.2.3	Lead time	36

4.3	Lead time and churn	38
4.4	Bug and feature	38
4.5	SPSS	39
5	Results	41
5.1	Introduction	41
5.2	Correlation - WIP	42
5.3	Correlation - Leadtime	43
5.4	Correlation - Bugs	44
5.5	Correlation - Throughput	45
5.6	Correlation - Churn	46
5.7	Team 1 - Descriptive Statistics	47
5.8	Team 2 - Descriptive Statistics	50
5.9	Team 3 - Descriptive Statistics	53
5.10	Team 4 - Descriptive Statistics	55
5.11	Team 5 - Descriptive Statistics	58
5.12	Team 6 - Descriptive Statistics	60
5.13	Team 7 - Descriptive Statistics	63
5.14	Team 8 - Descriptive Statistics	65
5.15	Team 9 - Descriptive Statistics	67
5.16	Team 10 - Descriptive Statistics	70
6	Discussion	73

I Notes	75
6.0.1 WIP correlation	77
6.0.2 Throughput	82
6.0.3 Bugs	84
6.1 Team 2	85
6.1.1 WIP	85
6.1.2 Lead time	86
6.1.3 Analyzed data per quarter	87
6.2 360	93
6.3 Krypton	98
6.4 Neon	102
7 Discussion	107
8 Conclusion	109

List of Figures

2.1	Waterfall model	6
2.2	Example of a Kanban board	11
2.3	JIT example	15
4.1	Illustrating the WIP timeline for example stated in section 4.1.4	32
6.1	WIP, Throughput, Lead time and Bugs for 360 per quarter	87
6.2	WIP, Throughput, Lead time and Bugs for Frontend per quarter	88
6.3	WIP, Throughput, Lead time and Bugs for Krypton per quarter	89
6.4	WIP, Throughput, Lead time and Bugs for Neon per quarter	91

List of Tables

2.1	Throughput	17
2.2	Optional caption for list of figures	18
2.3	Optional caption for list of figures	18
2.4	Optional caption for list of figures	19
3.1	Excerpt from the data set	22
3.2	Information about the columns from the SI dataset	23
3.3	Relationship between variable and columns from SI	24
4.1	The standard of the data set	28
4.2	Variables of the WIP objects	28
4.3	Showing Task ID, Date From and Date to	32
4.4	How churn is presented in the excel document	37
4.5	How lead time is recorded in the excel document	37
4.6	Example of how tasks are labeled	38
4.7	A excerpt from the result data produced by the program	39
5.1	Correlation - WIP	42

5.2	Correlation - Leadtime	44
5.3	Correlation - Bugs	45
5.4	Correlation - Throughput	46
5.5	Correlation - Churn	47
5.6	Optional caption for list of figures	48
5.7	Optional caption for list of figures	48
5.8	Optional caption for list of figures	49
5.9	Optional caption for list of figures	49
5.10	Optional caption for list of figures	50
5.11	Optional caption for list of figures	50
5.12	Optional caption for list of figures	51
5.13	Optional caption for list of figures	51
5.14	Optional caption for list of figures	52
5.15	Optional caption for list of figures	52
5.16	Optional caption for list of figures	53
5.17	Optional caption for list of figures	53
5.18	Optional caption for list of figures	54
5.19	Optional caption for list of figures	54
5.20	Optional caption for list of figures	55
5.21	Optional caption for list of figures	55
5.22	Optional caption for list of figures	56
5.23	Optional caption for list of figures	56

5.24	Optional caption for list of figures	57
5.25	Optional caption for list of figures	57
5.26	Optional caption for list of figures	58
5.27	Optional caption for list of figures	58
5.28	Optional caption for list of figures	59
5.29	Optional caption for list of figures	59
5.30	Optional caption for list of figures	60
5.31	Optional caption for list of figures	60
5.32	Optional caption for list of figures	61
5.33	Optional caption for list of figures	61
5.34	Optional caption for list of figures	62
5.35	Optional caption for list of figures	62
5.36	Optional caption for list of figures	63
5.37	Optional caption for list of figures	63
5.38	Optional caption for list of figures	64
5.39	Optional caption for list of figures	64
5.40	Optional caption for list of figures	64
5.41	Optional caption for list of figures	65
5.42	Optional caption for list of figures	65
5.43	Optional caption for list of figures	66
5.44	Optional caption for list of figures	66
5.45	Optional caption for list of figures	67

5.46	Optional caption for list of figures	67
5.47	Optional caption for list of figures	68
5.48	Optional caption for list of figures	68
5.49	Optional caption for list of figures	69
5.50	Optional caption for list of figures	69
5.51	Optional caption for list of figures	70
5.52	Optional caption for list of figures	70
5.53	Optional caption for list of figures	71
5.54	Optional caption for list of figures	71
5.55	Optional caption for list of figures	72
6.1	Team one - Correlation - WIP	77
6.2	Descriptive statistics for WIP - Team one	77
6.3	Descriptive statistic for throughput - team one	78
6.4	Descriptive statistic for throughput feature - team one	79
6.5	Descriptive statistic for throughput bugs - team one	79
6.6	Number of throughput divided into bugs and feature - Team one	79
6.7	The percent number of bugs finished in the same quarter as reported - Team one	80
6.8	Descriptive Statistic for churn feature - Team one	81
6.9	Descriptive Statistic for churn bugs - Team one	81
6.10	Team one - Correlation - Throughput	82
6.11	Descriptive statistic for throughput - team one	82

6.12 team one - Average churn for feature and bugs - Bugs	83
6.13 Lead time for throughput feature and bugs per quarter	83
6.14 Descriptive statistic for churn - team one	84
6.15 Team two - Correlation - Throughput	84
6.16 360 - Descriptive statistic - Bugs	85
6.17 Team two - Correlation - WIP	85
6.18 Descriptive statistic - WIP - Team two	86
6.19 Team one - Correlation - Throughput	86
6.20 Team one - Correlation - Leadtime_union	86
6.21 Descriptive statistic - Throughput - Team two	86
6.22 360 - Correlation	93
6.23 Descriptive statistic - Lead-time and churn - 360	94
6.24 Frontend Correlation	95
6.25 Descriptive statistic - Lead-time and churn - Frontend	96
6.26 Frontend - Descriptive statistic - Bugs	97
6.27 Frontend - Descriptive statistic - TP feature	97
6.28 Frontend - Descriptive statistic - TP bugs	98
6.29 Krypton - correlation	98
6.30 Descriptive statistic - Lead-time and churn - Krypton	99
6.31 Frontend - Descriptive statistic - Throughput	100
6.32 Krypton - Descriptive statistic WIP	100
6.33 Krypton - Descriptive statistic - Bugs	101

6.34 Krypton - Descriptive statistic - TP feature	101
6.35 Krypton - Descriptive statistic - TP bugs	101
6.36 Neon - Correlation	102
6.37 Descriptive statistic - Lead-time and churn - Neon	103
6.38 Neon - Descriptive statistic - Throughput	104
6.39 Neon - Descriptive statistic - WIP	104
6.40 Neon - Descriptive statistic - Bugs	104
6.41 Neon - Descriptive statistic - TP feature	105
6.42 Neon - Descriptive statistic - TP bugs	105

Listings

4.1	Gather all unique dates into ArrayList	29
4.2	Gather WIP object to the right data structure	29
4.3	Gather the remaining dates.	30
4.4	WIP measurement	31
4.5	Creating WIP-object	33
4.6	Creating WIP-object	33
4.7	Pseudocode example of how throughput objects are added	35
4.8	Pseudocode example of how throughput is measured	36
4.9	Pseudocode example of how throughput is measured	36
4.10	Pseudocode example of lead time is measured	37

Preface

Chapter 1

Introduction

In this master thesis the focus will be on limit Work In Progress (WIP) who is one of the principles in Kanban. The focus will be to see what impact WIP limit have in a development process. In order to do so, a data set gathered by an in house software company in Norway called Software Innovation (SI) is used. SI is a Scandinavian software company that delivers Enterprise Content Management applications.

The data set has already been interpreted by another study. That study investigated Scrum vs. Kanban for SI. For interested readers the case study can be found in the article "Quantifying the Effect of Using Kanban versus Scrum: A Case Study" (Sjøberg, Johnsen and Solberg, 2012).

1.1 Motivation

In software development the processes and methods are important in order to deliver the right product on time. In software development one rarely solve two identical problems for different stakeholders. And the problems are getting bigger and more complex, which means that new processes and methods are introduced and the already existing processes and methods needs to adapt to solve the complex problems in the most efficient ways. The number of popular software development methods (e.g. Extreme programming, Spiral, Scrum and Kanban) emerged in the recent years proves the assumption (Gandomani et al., 2013) (Marko Ikonen et al., 2010).

This is why this thesis will focus on software development methods, the method in each development project is such a key element. Within software development methods, the main focus of this thesis will be the Kanban method and the principle to limit Work

In Progress (WIP). In Kanban the WIP limit is used to limit the number of tasks each developer can work on at each workflow state to prevent bottlenecks and to ensure flow of tasks through the development cycle (Gandomani et al., 2013) (Marko Ikonen et al., 2010).

There are published various literature on Kanban in software development such as "Kanban: Successful Evolutionary Change for Your Technology Business" (D. J. Anderson, 2010), "Kanban and Scrum - making the most of both" (Kniberg, 2010) and "Lean Software Management: BBC Worldwide Case Study" (Middleton and Joyce, 2012). Although there is various literature, there is no information on how to apply WIP limit, even though most of the experience Kanban enthusiasts agree that WIP limit is an important principle. There is no research backing the statement. The literature states that one should experiment with WIP limits in order to find the best WIP limit for one's case (M. Ikonen et al., 2011) (Kniberg, 2010).

Since there is lack of available research on WIP limit my motivation is to investigate WIP limit in this thesis.

1.2 Research Question

In this thesis the overall research question will be to study the effects of WIP limits for an in house software company, and to see if the research will give answers to the following question:

- Do WIP limit in software development matter?
- How to best find the optimal WIP limit?
- Which parameters to consider in order to optimize WIP?

1.3 Approach

This thesis will use case study as an approach in order to answer the research questions. To conduct the case study a data set from an in house software company will be used. The data set will be calculated and analyzed. The first part of the analyze will be done by a program. The program was made for this thesis in order to calculate the data set. The program will turn the data set from quantitative into more suited quantitative data set.

The analyzed data will be evaluated on team level. The most valuable teams will be picked and their data will be extracted from the data set by the program. The most valuable teams will be picked on the basis of number of tasks labeled with their name in the data set. After the program has calculated the most valuable teams, statistical analysis will be used to compute correlation and descriptive statistic.

The correlation and descriptive statistic will be represented in chapter 5.

1.4 Contribution

My contribution to the research on WIP and WIP limit consists of creating a Java-based program that will measure WIP for each day based on a data set. For the program to work, the data set given as a parameter needs to have the same format as the data set in this thesis.

1.5 Chapter overview

Chapter 1: Introduction:

The first chapter will consist of a section where the motivation behind this thesis is stated. A section where the research questions this is stated. A section which gives a brief description of how I will approach the data set in order to answer the research questions and a section where my contribution to the research of WIP limit will be stated.

Chapter 2: Background:

Chapter 2 consists of background information which gives a brief introduction to concepts and methods in software development as well as information about the in house software company, Software Innovation. These methods and concepts are referred to later in the thesis.

Chapter 3: Research Methods:

Chapter 3 introduces and explains the research methods used in the thesis as well as complementary information about Software Innovation and why the data set from Software Innovation is used in this thesis.

Chapter 4: Data collected and calculations:

Chapter 4 gives information about the data set and the calculations. Complementary information about how the program operates is given in the chapter as well as information about how the output data from the program is measured using statistical analysis.

Chapter 5: Results:

Chapter 7: Discussion:

Chapter 8: Conclusion:

Chapter 2

Background

In this chapter there will be a brief introduction to Waterfall (Section 2.1), Scrum (Section 2.2), Lean (Section 2.3) and Kanban (Section 2.4) with affiliated tools. There will also be given a brief introduction to the software development company Software Innovation (Section 2.9)

2.1 Waterfall

"The waterfall model is the classical model of software engineering. This model is one of the oldest models and is widely used in government projects and in many major companies" (Munassar and Govardhan, 2010).

The main goal of the waterfall model is to plan in early stages to ensure design flaws before coding is started. Since planning is so critical in the waterfall method it fits project where quality control is a major concern (Munassar and Govardhan, 2010).

The waterfall method consist of several non-overlapping stages as shown in figure 2.1. The figure is an example of the waterfall model with a life cycle of establishing system requirements and software requirements and continues with architectural design, detailed design, coding, testing and maintenance (Munassar and Govardhan, 2010).

One of the main principles of the waterfall method discourage return to an earlier phase. For example returning from detailed design to architectural design. However, if returning to an earlier phase is needed, it involves costly rework. When a phase is completed the phase requires formal review and extensive documentation

development. Therefore, if something is missed out the architectural design phase it is expensive to correct later (Munassar and Govardhan, 2010)

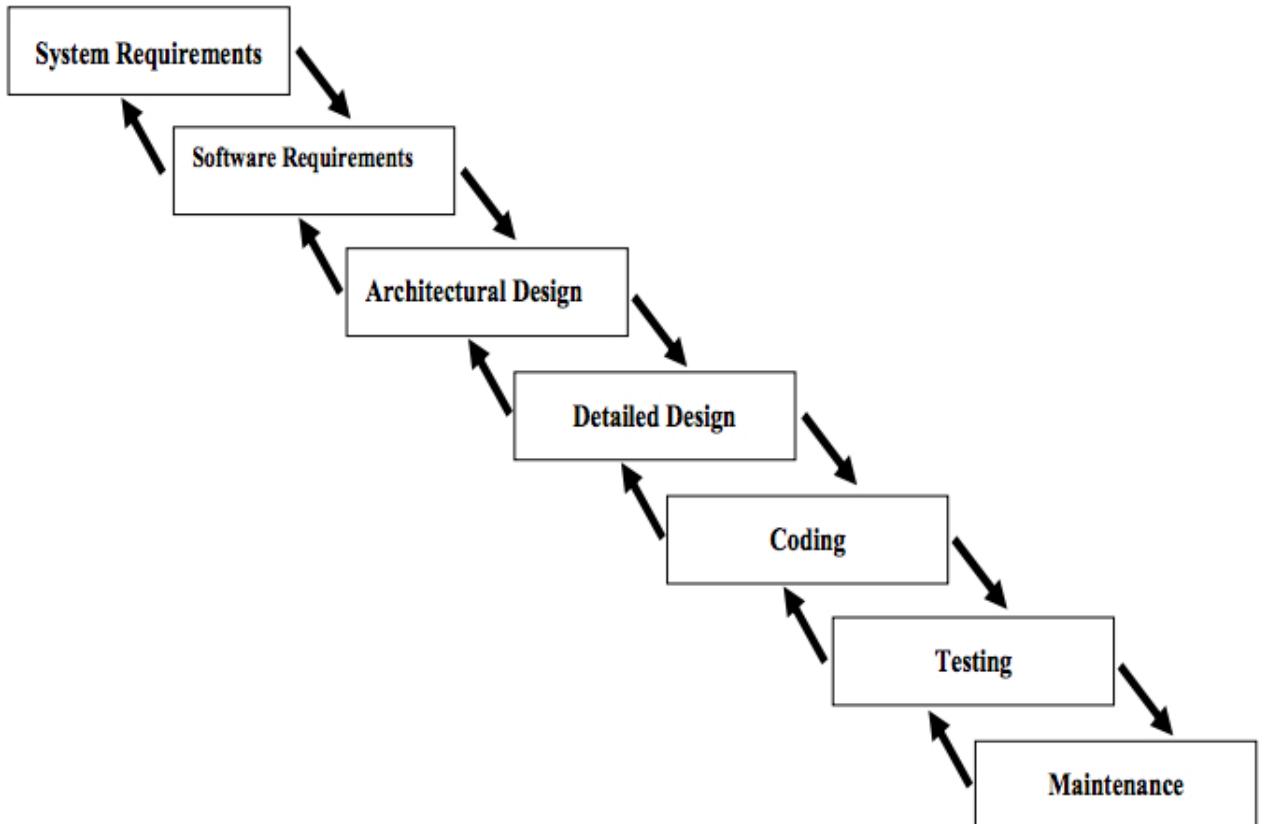


Figure 2.1: Waterfall model

2.2 Scrum

"Scrum is the best-known of the Agile frameworks. It is the source of much of the thinking behind the values and principles of the Agile Manifesto" (Alliance, 2012).

The Scrum method relates to value as

Individuals and interactions over processes and tools
Working software over comprehensive documentation
Customer collaboration over contract negotiation
Responding to change over following a plan

These principles are not so rigid as the principles of the Waterfall method. Some may say that Scrum is the opposite of the Waterfall method (Cocco et al., 2011).

Scrum have three main roles, the Product Owner, the Scrum Master and the members of the development team. The Product owner in collaboration with the Scrum Master decides which work to be prioritized in the backlog. The backlog represents the tasks to be done in order to complete the project. The Scrum Master acts like a team leader and helps the development team and the organization to take best advantages of Scrum. The development team works on tasks specific for the sprint there in (Alliance, 2012).

Sprint is a time-boxed interval over a given time. The Scrum framework suggests duration of sprints to be from one to four weeks. Before each sprint, a sprint planning meeting is conducted with all the team members attending. A Sprint planning meeting is held so the team can discuss tasks from the backlog and come to an agreement of which tasks to be put in the minimal backlog (Alliance, 2012).

In each sprint a minimal backlog is created so the developer knows which tasks to work on in the current sprint. The Product Owner and the team members discuss and decide which tasks from the backlog to be added to the minimal backlog. After the minimal backlog is complete, the Product Owner and the team members discuss each task in order to get a better and shared understanding of what is required in order to complete the tasks (Alliance, 2012).

One of the main principles in Scrum is that it requires that a new feature is ready for release after each sprint. The feature should be a visible part of the product in order to get feedback from end-users. So all the tasks in the minimal backlog combined should be a visible part of the product. (Alliance, 2012).

2.3 Lean

"Lean is all about getting the right things to the right place at the right time the first time while minimizing waste and being open to change" (Raman, 1998)

The Lean approach was introduced around 1948 in manufacturing in Japan. In 1975, Toyota was able to create almost 50 more production units per employee than in 1948 due to the Lean approach (Manning, 2013). Lean strives to maximize the value produced by an organization and delivered to customer. This is done by finding and eliminate waste, controlling variability and maximizing the flow of delivered software all within the culture of continuous improvements (D. Anderson et al., 2011). In 2003 Mary and Tom Poppendieck first introduced Lean thinking to software development. Poppendieck published the book "Lean Software Development: An Agile Toolkit" (M.

Poppendieck and T. Poppendieck, 2003). Poppendieck stated that an important tool to manage work flow is the concept of pull-systems, which means tasks are put in production only when a customer asks for it (M. Poppendieck and T. Poppendieck, 2009). The pull-system based method Kanban, has in the recent years been introduced more and more to software development, and is becoming one of the keys to Lean practice in software development (D. Anderson et al., 2011).

There are eight fundamental principles in Lean. The eight principles are:

1. **Start Early:** Don't wait for details. As soon as enough information is gathered start the development activity. Get everyone involved in figure out the details.
Don't build any walls between people, make people collaborate and start a two-way communication as soon possible. This will start the learning cycle as well.
2. **Learn Constantly:** Start with a breadth-first approach, explore multiple options.
The system is expected to change, so focus on creating simplicity code and robustness so the system is easy to change
3. **Delay Commitment:** In order to delay commitment, automated testing and refactoring are essential for keeping code changeable.
4. **Deliver Fast:** Deliver fast mark of excellent operational capability. The whole idea of **delaying commitment** is to make every decision as late as possible when one have the most knowledge.
5. **Eliminate Waste:** The only thing worth doing is deliver value to the customer, anything else is waste. See waste and eliminate it is the first key of Lean. Lean suggests using a value stream map for removing waste. A Value Stream Map (VSM) is a map over the whole company chain. VSM helps visualize where waste are located within the company.
6. **Empower the team:** When one are going to deliver fast, there is no room for central control. The work environment should be structured so work and workers are self-directing.
7. **Build Integrity In:** Lean software is build with integrity. That's why one of the principles in Lean suggests that test are integrated into software development just as any code, so it becomes a part of the delivered product.
8. **Avoid Sub-optimization:** In software development it's normal to break down a complex problem into small parts of the problem in order to minimize the complexity. If some of the parts are sub-optimized, bottleneck can occur. For example, if ten developers are hired to work on tasks, but only three testers are hired. The development process is sub-optimized since the developers will likely produce more than the tester can test and that will cause bottleneck.

(M. Poppendieck, 2003)

2.4 Kanban

"One can define Kanban software process as a WIP limited pull system visualized by the Kanban board" (D. Anderson et al., 2011).

Toyota production system introduced Kanban as a scheduling system for Lean and just-in-time (JIT) production during late 1940's and in the early 1950's in order to catch up with the American car industry. The Kanban method combined with the Lean approach was a success for Toyota. The success was noticed by the software development industry among others (Conboy, 2009), (Ohno, 2001). In the recent years, more software projects adapt to Kanban and Lean (D. Anderson et al., 2011), and this is one of the reasons why this thesis will focus on Kanban and one of its main principle WIP limit.

One of the most important people in Kanban software development, David Anderson also referred to as "father of Kanban in the software development industry" (Gupta, 2013) and author of the book "Kanban: Successful Evolutionary Change for Your Technology Business" has stated "If you think that there was Capability Maturity Model Integration, there was Rational Unified Process, there was Extreme Programming and there was Scrum, Kanban is the next thing in that succession." (Leonardo Campos, 2013)

In software development the Kanban method splits the major problem into many small pieces of problems. When the small pieces are defined by the team, the problems are put up on the Kanban board to visualize the problems, track what others are working on and see potential bottlenecks during development. Shinkle stated that when people start to understand Kanban, they easily discovered where the bottlenecks are (Shinkle, 2009).

In short Kanban systems focus on:

- Continuous flow of work.
- No fixed iterations or sprints.
- Work is delivered when it's done.
- Teams only work on few tasks at the time specified by the WIP limit.
- Make constant flow of released tasks.

(D. Anderson et al., 2011).

One of the main differences between Scrum and Kanban is sprint and estimation. Contrary to Scrum, Kanban do not use the principles of sprints or estimations. In Kanban the tasks do not need to be estimated or finished within a certain time. In the article "simulation of software maintenance process, with and without a work-in-process limit" (Concas et al., 2013) the authors found out that if they let the developers work with small tasks at time and not be interrupted, they will be more effective. They also found out that Scrum was too rigid for the development team because when the team had to estimate tasks they felt interrupted. So the estimation and sprint meetings worked counterproductive. The authors made the developers change to Lean-Kanban. The change implied the removal of sprints and estimation. After removing sprints and estimation the teams increased the ability to perform work, lower the lead time and meet the production dates (Concas et al., 2013).

In the article "Quantifying the Effect of Using Kanban versus Scrum:" the company also felt that the Scrum approach was too rigid. The article also reported positive results when the team changed to Kanban. The company almost halved its lead time, reduced the number of weighted bugs by 10 percent, and improved productivity (Sjøberg, Johnsen and Solberg, 2012). Other article also states that Scrum is too rigid and that's Kanbans advantages over Scrum (Beedle et al., 1999) (Brekkan and Mathisen, 2010) .

2.4.1 Kanban Board

"The Kanban board makes it clear to all the team members the exact status of progress, blockages, bottlenecks and they also signal possible future issues to prepare for"(Middleton and Joyce, 2012).

The Kanban board is one of many tools in Kanban. It's used to control WIP, increase the information flow with visualization and spot bottlenecks (Concas et al., 2013). A Kanban board is illustrated in figure 2.2. Each column in figure has 2.2 an intuitive name in order to describe itself so the developers easily can track where each task is.

Each column is named "Backlog", "In progress" and "Done". Each column can have a WIP limit to specify how many works in progress there are allowed in the column (Middleton and Joyce, 2012). In figure 2.2 the WIP limit is stated under the column name. The backlog column has a WIP limit of 4, In progress has 5 and Done doesn't need a WIP limit.

The yellow stickers represent the tasks. Some follow the path to mark stickers with different colors representing the severities or by marking if its a feature or a bug. In

"Kanban Implementation in a Telecom Product Maintenance" for example, the stickers has three different colors, green, yellow and red depending on how close to overdue the tasks are. If the sticker is red, the task is already overdue, if the tasks are soon-to-overdue its marked with yellow stickers (Seikola, Loisa and Jagos, 2011).

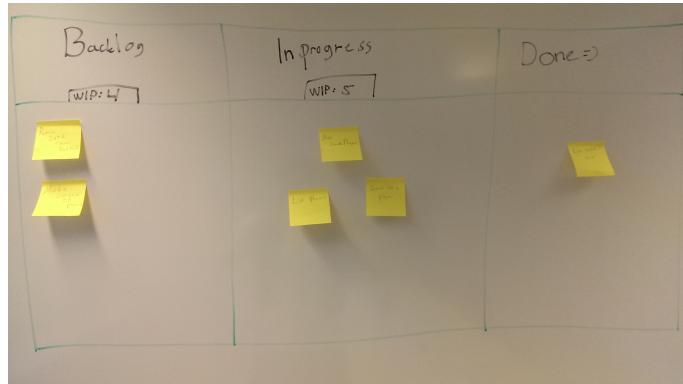


Figure 2.2: Example of a Kanban board

2.4.2 WIP limit

"WIP limits seem to be the worst understood part of the Kanban system. When used properly, it exposes bottlenecks and reduces lead time for individual work items. Used improperly, it can starve developers for work or result in too many people working on the same work items." (Shinkle, 2009)

WIP limit is one of the core principles in Kanban (Seikola, Loisa and Jagos, 2011). WIP limit helps to reduce overhead by limit task-switching for each developer, visualize bottlenecks and make constant flow of tasks throughout the development (D. Anderson et al., 2011). One way to explain WIP and the impact of WIP limit is to use cars and roads as analogy. All roads have it maximum capacity of cars. When this limit is reached, traffic jam occurs and the throughput of cars decreases and lead time increases. The same can be said about software development teams. A software team has a maximum number of tasks they can perform, if the team is pushed over the maximum limit, the throughput of tasks decreases and lead time increases.

When first implementing Kanban, Shinkle explains that the users don't care about WIP or setting a WIP limit, but rather the visibility of Kanban through the Kanban board. When user get more experience with Kanban, they start to attempt the principles of WIP limit (Shinkle, 2009). Srinivasan, Ebbing and Swearing said that setting the WIP limit is not easy. They suggest that the WIP limit is set, and then observe throughput, and adjust after that (Srinivasan, Ebbing and Swearingen, 2003). The Kanban method

also says you should limit WIP, but what should the limit be? The Kanban method tells us to experiment (Kniberg, 2010). The article "Lean Software Management" (Kniberg, 2010) and the "Impact of Kanban on Software Project Work" (M. Ikonen et al., 2011) both suggest that WIP should be minimized as well. The conclusion of present study is to keep the WIP limit low and experiment by slowly increase the WIP limit until the throughput decreased and lead time increased, then you know that the previous WIP limit was the perfect one.

The importance of limit WIP has been stated by various researches. A summary of benefits with WIP limit is shown in section 2.4.4 . The articles by Giulio Concas, Hongyu Zhang (Concas et al., 2013) and David Anderson, Giulio Concas, Maria Ilaria Lunesu, and Michele Marchesi (D. Anderson et al., 2011) researched the difference between limit WIP and unlimited WIP. A summary of this two articles are shown in section 2.4.3

On how to determine WIP limit one research was found. If one implement Kanban with sprints or uses Scrum, Łukasz proposes to use the effectiveness metric to help determine the WIP limit. The effectiveness metric should be applied after end sprint according to Łukasz. After each sprint, one can apply the effectiveness metric and the result could be used as a guideline for WIP limit for the next sprint. The effectiveness metric takes the number of bugs found (ai) and the number of bugs found by external people (e.g. lawyers, accountants, coaches, consultants, translators, internal and external service providers etc.) (ei), and minus ai and ei , then divide the result by ai and multiply it by 100% as shown in 2.1 (Sienkiewicz, 2012)

$$Ei = \frac{(ai - ei)}{ai} * 100\% \quad (2.1)$$

2.4.3 Limit WIP vs. Unlimited WIP

In the article by Giulio Concas and Hongyu Zhang one of the result was showed that the average of closed tasks was 4145 when the WIP was limited and 3853 when the limit was not limited (about 7% less). The paper concludes their finds; developers are more focused on fixing few issues, because the number of issues they can work on is limited. The developers are more likely to continue on the issue from the day before, rather than starting on another issue, this reduces overhead. When developers start on a new issue, they need to use time to familiarize themselves with the code and the issue. That could create unnecessary overhead if some developer already has done it, but that developer is now working on another issue. The study also showed that limit WIP can improve throughput and work efficiency (Concas et al., 2013).

The case by David Anderson et al. (D. Anderson et al., 2011) did a simulation of the impact of WIP limit vs. no WIP limit on developers with skills in different activities. The four skill activities from the article were:

1. Design
2. Development
3. Testing
4. Deployment

The article did four different simulations.

1. A simulation with WIP limits and seven developers with skill in two of the four activities.
2. A simulation with no WIP limit and seven developers with skilled in two of the four activities.
3. A simulation with WIP limits and seven developers with skill in all of the activities.
4. A simulation with no WIP limits and seven developers with skill in two of the four activities.

The research paper concluded that the two latter is unlikely in the real world, since there is seldom a whole team with developers skilled in all activities.

When the developers had skill in two out of four activities the WIP limit simulation used 100 days, but the non WIP limit simulation used 120 days. The simulation with WIP limit shown an almost constant flow of features that where completed. While in the same simulation with no WIP limit, the flow of feature was much more irregular. (D. Anderson et al., 2011)

2.4.4 Benefits with setting WIP limit according to various articles

1. Lowering the WIP limit will help people avoid task switching. When one is task switching it's hard to be able to fully concentrate. (M. Ikonen et al., 2011).
2. There's stated when using short-cycle times and Kanban board to limit WIP, the software development team's learning is increased (Middleton and Joyce, 2012):

3. In the article "Lean Software Management: BBC Worldwide Case Study", the team started to determine WIP by their constraints and quickly find their bottlenecks; this gave the team more experience in dealing with WIP and increased productivity(Middleton and Joyce, 2012).
4. Limit WIP helps team to reduce overhead (Mark L. Spearman and J.Hopp, 1990).
5. Limit WIP decrease lead time (Mark L. Spearman and J.Hopp, 1990).
6. Limit WIP increase throughput (Mark L. Spearman and J.Hopp, 1990).
7. Limit WIP reduces flow times (Mark L. Spearman and J.Hopp, 1990).
8. Limit WIP reduces variation (Mark L. Spearman and J.Hopp, 1990).
9. Limit WIP improves quality (Mark L. Spearman and J.Hopp, 1990).

Both the studies on WIP limit vs. No limit and the articles and research shows the importance of WIP limit. If Łukasz's effectiveness metric is disregard, there is no clear rule on how to determine WIP limit even though WIP is a crucial principle in order to take full advantages of Kanban.

2.5 Lead time

"Lead time is the total elapsed time from when a customer requests software to when the finished software is released to the customer" (Middleton and Joyce, 2012).

Lead time is an essential ingredient when you look for the optimal WIP. Often in project, lead time is split into pieces, so every task has its own lead time. This gives the development teams the advantages to experiment with different WIPs in order to see the different lead times and then measure which WIP that suits this project the best.

The citation by Middleton and Joyce above is close to definition of what lead time is. This definition could be useful for consultancy companies, but for in-house development company with few releases each year this definition is unsuitable. The article "Quantifying the effect of Using Kanban versus Scrum" (Sjøberg, Johnsen and Solberg, 2012) stated some reasons why this is unsuitable for in house development companies:

"First, the amount of time a work item remains in the backlog queue before it's put on the board is a function of priority, not whether the company uses Scrum, Kanban, or other development methods. Furthermore, companies that develop and sell products to

many customers might propose new features themselves and put them on the backlog before any customers request them. Second, given a policy of two or three releases a year, the result of a work item isn't delivered to the customer immediately after it's finished" (Sjøberg, Johnsen and Solberg, 2012).

2.6 Just-In-Time

"Just-In-Time is based on delivering only the necessary products, to the necessary time and the necessary quantity." (Lai, Lee and Ip, 2003).

Just-In-Time (JIT) was introduced in the 1970s by Toyota in combination with Lean (Javadian Kootanaee, Babu and Talari, 2013). JIT has been developed to increase productivity through waste reduction and increasing the value added on the production processes. To explain, illustrate and visualize the JIT principle Mary and Tom Poppendieck uses the picture shown in figure 2.3 (Lai, Lee and Ip, 2003) (M. Poppendieck and T. Poppendieck, 2006).

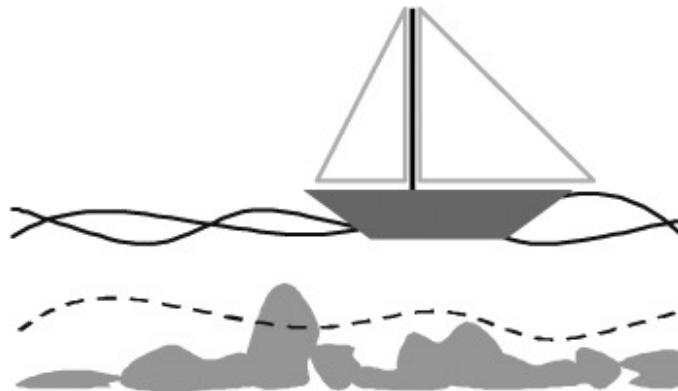


Figure 2.3: JIT example

In figure 2.3 the stream reflects the inventory. Under the stream, there are rocks located in different sizes. The rocks illustrates waste and problems that can occur. If the stream level is lowered, the rocks are more visualized. At this point you have to clear out rocks in order to make the boat continue it's journey, or it will crash into the rocks. After the rocks are cleaned out, one can lower the stream level again and continue until it's just pebbles left. Then the boat can float without problems.

If one lower the stream (inventory), problems and waste will become visible (visualized by rocks). Lean want to lower inventory in order to make problems and waste occur, because when problems and waste occurs, you are able to fix the problems and remove the waste. Fixing the problem and removing the waste has several benefits such as,

your process could be optimized and you are one step closer to have zero problems and zero waste. (Lai, Lee and Ip, 2003) (M. Poppdieck and T. Poppdieck, 2006).

In Software development the JIT principle means that one should not deliver anything before it's demand. For example if a development team adds two new features to a product without consulting the stakeholders and work a day on these features. When stakeholders review the product they may say that they don't want the two features that, and that's waste.

2.7 Throughput

"The output of a production process (machine, workstation, line plant) per unit time (e.g., parts per hour) is defined as the systems throughput or sometimes throughput rate" (Adams and Smoak, 1990)

The main concept of throughput is to measure how productive teams, people or companies are. Throughput is measured in number of finished delivered tasks or units per hour, day, week, month, quarter or year. This applies to both software development and manufacturing. The tasks in manufacturing are often different from the tasks in software development. In software development each task is more abstract than in manufacturing and in software development each task can have different solutions depending on how the team or developer approaches the task (Rouse, 2005).

A key factor in successfully measuring throughput in software development is to specify a standard size for each task. If the standard is not specified a developer x can have throughput of one task per week, another developer y could have throughput of three tasks per week and they still have done the same amount of work, since the task of developer x is the same work amount as the three to developer y combined. This will give wrong results if the throughput is measured (Rouse, 2005). An example of throughput is listed in subsection 2.7.1.

2.7.1 Example of throughput measurement

This is a simple example to illustrate throughput with different task sizes. Let's say Team x had a throughput of eighteen tasks after the first quarter, twenty after the second, fifteen after the third and twelve after the last quarter and they used Scrum the first two quarters and Kanban the last two as illustrated in table 2.1. It will look like team x benefits most from Scrum. But if the task during the Kanban time was twice the size of Scrum, Kanban would suite team x the best. In order to get valid result

from throughput measurements the size of tasks has to be agreed upon by the teams or company.

Quarter	Throughput	Method
1	18	Scrum
2	20	Scrum
3	15	Kanban
4	12	Kanban

Table 2.1: Throughput

2.8 Code churn

"Churn is defined as the sum of the number of lines added, deleted, and modified in the source code" (Sjøberg, Johnsen and Solberg, 2012).

Churn is a measure that's not so quite known as lead time, throughput or WIP. Churn is a term that's used as surrogates for effort in software engineering. Many studies in software engineering use code churn or revisions as surrogate measure of effort (Yamashita, Anda, Mockus et al., 2012). Emam stated that "analysts should be discouraged from using surrogate measures, such as code churn, unless there is evidence that they are indeed good surrogates (El-Emam, 2000)." The authors of "Quantifying the effect of code smells on maintenance effort" agree that one should cautious when using surrogates for effort.

2.9 Software Innovation

Software Innovation(SI) is a Scandinavian software company. SI develops and delivers market-leading Enterprise Content Management applications that helps organizations improve and increase efficiency in document management, case handling and technical document control. SI builds products around Microsoft Sharepoint platform and tightly integrated into the Microsoft Office environment (Sjøberg, Johnsen and Solberg, 2012). (*Software Innovation* 2013).

SI has approximately 300 employees in Oslo, Copenhagen and Stockholm and Bangalore (*Software Innovation* 2013). From 2001 to 2006, SI used Waterfall process. In

2007 SI changed to Scrum and in 2010 SI went from Scrum to Kanban (Sjøberg, Johnsen and Solberg, 2012).

2.9.1 Teams

This section states the team size of each team. The team size for each quarter will be used in the discussion chapter - chapter 6.

(a) Team One			(b) Team two			(c) Team three			(d) Team four		
Year	Quarter	Team Size	Year	Quarter	Team Size	Year	Quarter	Team Size	Year	Quarter	Team Size
2010	3	6	2010	3	10	2010	3	6	2010	3	3
2010	4	3	2010	4	15	2010	4	9	2010	4	8
2011	1	16	2011	1	13	2011	1	7	2011	1	4
2011	2	28	2011	2	12	2011	2	10	2011	2	4
2011	3	2	2011	3	15	2011	3	9	2011	3	4
2011	4	38	2011	4	14	2011	4	10	2011	4	4
2012	1	35	2012	1	15	2012	1	11	2012	1	4
2012	2	34	2012	2	7	2012	2	11	2012	2	2
2012	3	32	2012	3	8	2012	3	13	2012	3	3
2012	4	29	2012	4	9	2012	4	13	2012	4	5
2013	1	24	2013	1	10	2013	1	13	2013	1	7
2013	2	37	2013	2	7	2013	2	7	2013	2	5
2013	3	23	2013	3	7	2013	3	8	2013	3	5
2013	4	23	2013	4	8	2013	4	8	2013	4	5

Table 2.2: Caption of Team size for team one, two, three and four

(a) Team five			(b) Team six			(c) Team Seven			(d) Team eighth		
Year	Quarter	Team Size	Year	Quarter	Team Size	Year	Quarter	Team Size	Year	Quarter	Team Size
2010	3	5	2010	3	5	2010	3	10	2010	4	2
2010	4	13	2010	4	6	2010	4	8	2011	1	8
2011	1	14	2011	1	6	2011	1	8	2011	2	8
2011	2	25	2011	2	6	2011	2	6	2011	3	13
2011	3	21	2011	3	5	2011	3	8	2011	4	9
2011	4	23	2011	4	5	2011	4	9	2012	1	10
2012	1	25	2012	1	4	2012	1	10	2012	2	2
2012	2	19	2012	2	6	2012	2	5	2012	3	25
2012	3	24	2012	3	6	2012	3	9	2012	4	11
2012	4	18	2012	4	9	2012	4	3	2013	1	22
2013	1	31	2013	1	9	2013	2	9	2013	2	21
2013	2	29	2013	2	9	2013	3	9	2013	3	23
2013	3	27	2013	3	9	2013	4	14	2013	4	8
2013	4	11									

Table 2.3: Caption of Team size for team five, six, seven and eight

(a) Team nine

Year	Quarter	Team Size
2010	4	5
2011	1	8
2011	2	7
2011	3	7
2011	4	9
2012	1	10
2012	2	8
2012	3	10
2012	4	12
2013	1	8
2013	2	9
2013	3	8
2013	4	8

(b) Team ten

Year	Quarter	Team Size
2010	3	3
2010	4	11
2011	1	12
2011	2	9
2011	3	4
2011	4	17
2012	1	20
2012	2	17
2012	3	18
2012	4	13
2013	1	17
2013	2	9
2013	3	10
2013	4	10

Table 2.4: Caption of Team size for team nine and ten

Chapter 3

Research Methods

In this chapter the research methods will be introduced and the reason why the data from Software Innovation is used in this master thesis will be stated. The first section in this chapter, Section 3.1 will give a brief introduction to the research method "Case Study". Section 3.2 is about the choice of case and complementary information about SI.

3.1 Case study

To answer the research questions, a case study will be conducted. A case study is used to explore causation in order to find underlying principles of a study (Shepard and Greene, 2002)(Yin, 2008). But which methods one can use in a case study or how the case study is conducted is ambiguous. It might be that the case study is qualitative or quantitative. Or that it utilizes a particular type of evidence (for example ethnographic, participant observation or field research).

Jennifer Platt stated: "Much case study theorizing has been conceptually confused because too many different themes have been packed into the idea "case study" "(Gerring, 2006).

John Gerring stated: "A case study may be understood as the intensive study of a single case where the purpose of that study is - at least in part to shed light on a larger class of cases (Gerring, 2006).

As one can see there is no clear rule what exactly a case study is. In this thesis the case study is used to explore WIP limit's effect in software development. And the purpose

is to shed light on WIP limit in software development and if it matter. In order to do so, the data set from SI with quantitative data will be interpreted.

3.2 Choice of case

The case study in this thesis is based on data set from an in house software company named Software Innovation. The data set contains information about each task SI has worked on in the last five years (2008-2013). The data set is represented in a excel document, a excerpt of some of the columns in the document is shown in table 3.1. Skrive her at data fra 2010 og utover er tatt med, samme som i artikkelen til Dag, de har fjernet en del.

ID	Type	Created Date	From Day	Date To	Lead Time	Team
3027	Bug	2008-10-07	2008-10-09	2008-10-16	20	Team one
3028	Bug	2008-10-07	2008-10-07	2008-10-08	10	Team six
3029	Feature	2008-10-07	2008-12-30	2008-12-30	105	Team two
3030	Feature	2008-10-07	2008-10-07	2008-10-07	1	Team three
3035	Bug	2008-10-08	2008-11-20	2008-11-28	17	Team five
3037	Feature	2008-10-08	2008-10-19	2008-10-19	7	Team three
3040	Bug	2008-10-10	2008-11-19	2008-11-19	48	Team one

Table 3.1: Excerpt from the data set

In order to try answering the research questions stated in chapter 1.2, the data from SI will be interpreted. The data set contains thirty columns with different data for each task, mostly of this columns are irrelevant for this study but the important columns is stated in table 3.2.

The data from SI will be interpreted on team level. SI has about 25 teams. From the data set there are six teams who have worked on the most tasks. The data from these six teams will be used. The data from SI will be analyzed using the program, which will compute the variables shown in table 3.3 for each of the six team. This data will be further analyzed using SPSS. With SPSS the data produced by the program will be interpreted. The interpreted data will be presented in chapter 5.

The reason SI and the data set from SI is analyzed in this thesis is based on the article "Quantifying the Effect of Using Kanban versus Scrum" (Sjøberg, Johnsen and Solberg, 2012). In the article the three authors investigated Kanban vs. Scrum in SI's case. Since Dag is the supervisor of this thesis and he had access to the data set, to use the set from SI is a choice of convenience.

Columns from data set	Description
Created Date	When a task is put in backlog
Date From	When a given task is pulled out from the backlog
Date to	When a task is finished and ready for release.
Lead Time	The amount of days elapsed from the date the task was created until the tasks has finished
Type	The type column is labeled as either bug or feature depending on the type of the task
Lines added	Number of lines added to a feature or bug
Lines modified	Number of lines modified when working on a feature or bug
Lines deleted	Number of lines deleted from a bug or feature
Team	States the team who has been working on the task.

Table 3.2: Information about the columns from the SI dataset

Variable	Description	Columns from SI
WIP	The number of items in progress on the given day	Date From and Date To.
Throughput	Number of tasks finished on a given day	Date To
Churn	Lines added, lines modified and lines deleted added together	Lines Added, Lines Modified, Lines Deleted and Date To
Bugs	The number of tasks labeled as Bug and not feature	Type and Created Date
Lead time	The time used on a task, measured in days	Lead time and Date To

Table 3.3: Relationship between variable and columns from SI

3.2.1 Software Innovation's development process

From 2001 to 2006 SI used the Waterfall process with a life cycle of:

1. Design
2. Implementation
3. Testing
4. Deployment for each new release

(Sjøberg, Johnsen and Solberg, 2012).

In 2007 SI examined their development process, which resulted in decision to change to Scrum. Scrum was implemented with the standard elements of Scrum:

- Cross functional teams
- Sprint planning meetings
- Estimation of work items using planning poker
- Daily standup meetings
- Sprints

(Sjøberg, Johnsen and Solberg, 2012).

SI implemented three weeks sprint, after each sprint a fully tested shippable code was ready. In 2010, SI went from Scrum to Kanban. SI felt that Scrum was too rigid and didn't fit their purpose, they also feared that inaccurate estimation and time boxing gave them longer lead time. SI also saw Scrum planning meetings as waste which

reduced productivity and quality (Sjøberg, Johnsen and Solberg, 2012).

SI decided to implemented Kanban in the following manner. When a work item is pulled from the backlog, SI tries to make the item flow through all the stages until it's ready for release. This procedure happens as quick as possible. In order for an item to be ready for release it has to be at a satisfactory quality level, which is defined by SI. SI also implemented WIP limits. If the WIP limit is reached, no new tasks are started until another task is finished which is based on the principle of just-in-time. (Sjøberg, Johnsen and Solberg, 2012).

Chapter 4

Data collected and calculations

This chapter will introduce complementary information about the data set and the program. The first section, Section 4.1 will introduce the algorithm of how the program measure WIP for each day. The subsection 4.1.4 will provide a comprehensive example of how the program measure WIP per day. The consecutively sections reveals the algorithm of how the program measure bugs (Section 4.4) throughput (Section 4.2.1), churn (Section 4.2.2) and lead time (Section 4.2.3). In the last section the statistical analyze program SPSS is introduced (Section 4.5)

Keep in mind that each of these sections is not executed at the same time. Each of the sections represent one process in the program, and each of these processes have their own instance of the data set.

For this thesis a program was made in order to measure the variable shown in table 3.3. The explanation of how the program works will be split into sections so it will be easier to get a understanding of how the program operates. The explanation of how the program works will first contain a detailed description in words, then a description using Pseudocode (JD, 2013) will be provided. The Pseudocode for each section is simplified with only the key elements of the program code.

The table 4.1 shows how quarters, dates and days are represented in this thesis.

- The Date standard is specified as YYYY-MM-DD.
- All seven days in the week are taken into account when measuring included Saturdays and Sundays
- Quarter of a year is defined as:
 - January, February and March (Q1)
 - April, May and June (Q2)
 - July, August and September.(Q3)
 - October, November and December (Q4)

(Investopedia, 2013)

Table 4.1: The standard of the data set

4.1 WIP per day

4.1.1 Step 1: Gather all unique dates into a ArrayList

First step of WIP measurement is to create a WIP object with the attributes in table 4.2. The values that are assigned to the attributes are gathered from the data set file. The program creates a WIP object and assigned values to it as shown in listing 4.1 . After the values are assigned the program puts it into the right ArrayList¹ based on the team variable as shown in listing 4.2

Type	Variable name
Date	start
Date	end
String	team
String	processType
int	WIP

Table 4.2: Variables of the WIP objects

¹ArrayList is a resizable array implementation of a list. The ArrayList class provides function for manipulate the size of the array, check the size of the list and convert the list to an array (Oracle, 2013)

```

1 While inputFile != EOF // EOF = End Of file
2     WIP = New WIP()
3     WIP.start = inputFile.start
4     WIP.end = inputFile.end
5     WIP.team = inputFile.team
6     WIP.processType = inputFile.processType
7     WIP.WIP = 1
8     FindTeam(WIP)
9

```

Listing 4.1: Gather all unique dates into ArrayList

```

1 void FindTeam (WIP w)
2     if w.team EQUALS "TeamOne"
3         TeamOne.add(w)
4     if w.team EQUALS "TeamTwo"
5         TeamTwo.add(w)
6     if w.team EQUALS "TeamThree"
7         TeamThree.add(w)
8     if w.team EQUALS "TeamFour"
9         TeamFour.add(w)
10    if w.team EQUALS "TeamFive"
11        TeamFive.add(w)
12    if w.team EQUALS "TeamSix"
13        TeamSix.add(w)
14

```

Listing 4.2: Gather WIP object to the right data structure

4.1.2 Step 2: Gather the remaining dates

The data set from SI contains dates from 2008 to 2013, but there are some dates missing which table 3.1 shows. For example the date 2008-10-09 is missing. In order to generate WIP for each day the program has to create the dates that's not in the set.

In order to create the remaining dates, the program takes the first date and the last date from each of the teams's ArrayList created in previous section (4.1.1) as shown in listing 4.3 in line one and two. Then the program checks if all the dates between the first date and the last date are in the team's ArrayList. Each of the ArrayLists are sorted on date. If the dates are not in the ArrayList, the program will put the date into the ArrayList as show in method addToArraylist on line ten to thirteen. In order to keep the pseudocode simple, the generateWIP method stated in line twelve was omit. The generateWIP method creates a new WIP object and returns it.

```

1 WIP first = ArrayList.get(0) //points to the first WIP object in the ArrayList
2 WIP last = ArrayList.get(ArrayList.size() - 1) //points to the last WIP object
   in the ArrayList
3 Next_date //points to the next date
4 Next_date = first.getDate() // Next_date assigned before iteration
5 while Next_date NOT EQUALS last.getDate()
6   New_date = Next_date + 1 //Compute the next date
7   AddToArraylist(New_date, first.getTeam())
8   Next_date = New_date
9
10 void addToArraylist(Date d, String team)
11   if d NOT CONTAINS IN ArrayList
12     WIP = generateWIP(d, team)
13     ArrayList.add(WIP)
14

```

Listing 4.3: Gather the remaining dates.

4.1.3 Step 3 Measure WIP

The ArrayList from section 4.1.1 and 4.1.2 now contains a WIP object for each date from 2008 to 2013 for each team. In this step the program will loop through each of the ArrayLists. During the iteration each WIP object is extracted from the ArrayList and the WIP is measured. The two methods stated in line ten and eighteen respectively gather the current WIP (method in line ten) and finds out how many finished tasks (method in line eighteen) and returns the result. The result is used in line five to compute the current WIP.

```

1 lastWIP = 0
2 for WIP Object IN ArrayList
3   if(DateNotMeasured(WIP.getStartDate()) == true)
4     WIP_for_this_date = get_current_WIP(WIP.getStartDate())
5     WIP_measured = WIP_for_this_date - Nr_of_finishedDates(WIP.getStartDate)
6     + lastWIP
7     WIP.setWIP(WIP_measured)
8     lastWIP = WIP_measured
9
10 int get_current_WIP(Date date)
11   current_WIP = 0
12   for WIP in ArrayList
13     if date EQUALS WIP.getStartDate()
14       Nr_of_dates_to_decrement++
15   return current_WIP
16
17 int Nr_of_finished_dates(Date date)
18   Nr_of_dates_to_decrement = 0
19   for WIP in ArrayList
20     if date AFTER WIP.getEndDate() DO
21       if date not picked
22         Nr_of_dates_to_decrement++
23         dateIsPicked(WIP)
24   return Nr_of_dates_to_decrement

```

Listing 4.4: WIP measurement

4.1.4 Example

This section will provide a comprehensive example of how the WIP algorithm works. Figure 4.1 shows tasks id's in the y-axis and dates in the x-axis. The green line indicates the duration of the task. The figure helps visualizes how many WIPs there are for a given date. For example on the date 2008-10-12, tasks 3, 5 and 6 are in progress, which means the WIP is 3 for 2008-10-12.

In this example dates from table 4.3 will be used to illustrate how the algorithm measure WIP. The figure 4.1 visualize WIP for each date.

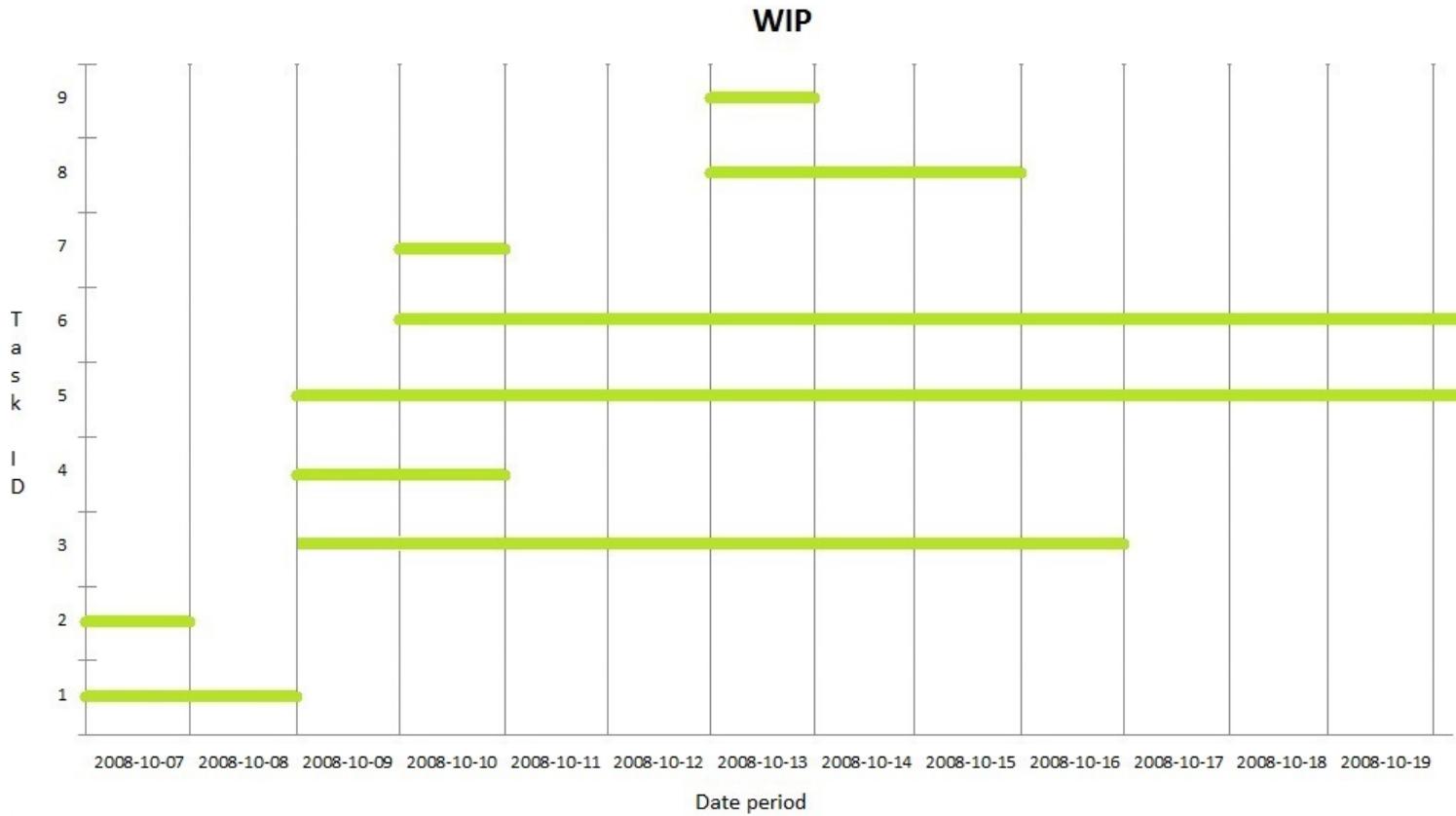


Figure 4.1: Illustrating the WIP timeline for example stated in section 4.1.4

Task ID	Date From	Date To	Team	Process Type
1	2008-10-07	2008-10-08	Team One	Waterfall
2	2008-10-07	2008-10-07	Team One	Waterfall
3	2008-10-09	2008-10-16	Team One	Waterfall
4	2008-10-09	2008-10-10	Team One	Waterfall
5	2008-10-09	2008-11-04	Team One	Waterfall
6	2008-10-10	2008-11-05	Team One	Waterfall
7	2008-10-10	2008-10-10	Team One	Waterfall
8	2008-10-13	2008-10-15	Team One	Waterfall
9	2008-10-13	2008-10-13	Team One	Waterfall

Table 4.3: Showing Task ID, Date From and Date to

4.1.4.1 Step 1

The program will first read in the first line of table 4.3. The first line is the one labeled with task id one. The program creates the WIP-object for line one and it will look like the listing 4.5. The program will follow the exact same procedure until all the dates are read in.

```
1 WIP = new WIP()
2 WIP.start = 2008-10-07
3 WIP.end = 2008-10-08
4 WIP.team = "Team One"
5 WIP.processType = "Waterfall"
6 WIP.WIP = 1
```

Listing 4.5: Creating WIP-object

4.1.4.2 Step 2

Now that the whole set has been read in and saved. The next thing to do is to create the remaining dates. The ArrayList contains all the dates from table 4.3. The program will now extract the first and the last date from the ArrayList. Before this step, the objects in the ArrayList are sorted by date. The first date is 2008-10-07 and the last date is 2008-10-13. The program will check if the date after 2008-10-07 contains in the set, which it don't. The program then generates a WIP object for the date 2008-10-08 and adds it to the ArrayList as shown in listing 4.6. After the date is created, the program will see if the date 2008-10-09 exists and will do so for all dates until the date 2008-10-13.

```
1 void createNewWIP(Date d, String team)
2     WIP.start = d
3     WIP.end = d
4     WIP.team = team
5     WIP.processType = "Unknown"
6     WIP.WIP = 0
```

Listing 4.6: Creating WIP-object

4.1.4.3 Step 3

The ArrayList now contains the dates from 2008-10-08 to 2008-10-13. The next and last step is to measure WIP for each date. The program will now loop through the ArrayLists. The first date is 2008-10-07. The get_current_wip method from line nine in

listing 4.4 will be called with the date 2008-10-07 as parameter. The method will return two, since both task one and two where started at 2008-10-07 as shown by figure 4.1. The next thing to do is to find out how many tasks to decrement the current WIP with. The method `Nr_of_fininshed_dates` in line seventeen is called with the date 2008-10-07. As shown by the table 4.3 and figure 4.1 there was no task finished at the date 2008-10-07, so the method returns 0. The program then updates the WIP objects' counter to two and saves the WIP in the `lastWIP` object. The next date is 2008-10-08, who the program made in subsection 4.1.4.2. There is no task started at 2008-10-08, but task one is finished at the date. So the `Nr_of_fininshed_dates` returns one and flag the current date at line twenty-three. The result of `WIP_measure` in line five is 1 ($0 - 1 + 2 = 1$). WIP at date 2008-10-08 is one, as shown by figure 4.1. The program will continue this procedure until all the dates are measured. The reason why the date is flagged is to be sure that each day only evaluates ones. The if statement listed in listing 4.4 at line twenty-one assurance that.

4.2 Rest of the variables

To compute churn, leadtime and throughput the algorithm is almost the same. First the program read in the data set from SI. For each of the lines in the data set, the program creates an object and saves the valuable information from the data set. Then each object is saved in a data structure based on team association as showed in 4.7. When all the lines has been read in, and all objects has been put in the right data structure the algorithm differs. In the following subsections the algorithm for each of the variables is presented.

```

1 void addBug(Bug b)
2     if b.team EQUALS "TeamOne"
3         if dateExists(b.date, TeamOne) EQUALS false
4             // if date don't exists, then add the bug
5             TeamOne.add(b)
6
7     if b.team EQUALS "TeamTwo"
8         if dateExists(b.date, TeamTwo) EQUALS false
9             // if date don't exists, then add the bug
10            TeamTwo.add(b)
11
12    if b.team EQUALS "TeamThree"
13        if dateExists(b.date, TeamThree) EQUALS false
14            // if date don't exists, then add the bug
15            TeamThree.add(b)
16
17    if b.team EQUALS "TeamFour"
18        if dateExists(b.date, TeamFour) EQUALS false
19            // if date don't exists, then add the bug
20            TeamFour.add(b)
21
22 void dateExists(Date d, ArrayList list)
23     for Bug b in list
24         if b.date EQUALS d
25             b.counter++
26             return true
27
28 return false
29

```

Listing 4.7: Pseudocode example of how throughput objects are added

4.2.1 Throughput

When the steps described in section 4.2 are finished, the program takes each of the data structures and compute throughput. To compute throughput a counter represent the throughput for a given day. The method dateExists does the actual computation. The method starts of with a test. If the date of the throughput object is in the data structure, the corresponding counter is incremented. If the date is not in the data structure, the new throughput object is added to the data structure. An excerpt of the code is listed in 4.8

```

1 void dateExists(Throughput tp d, ArrayList list)
2   for Throughput t in list
3     if t.date EQUALS tp.date
4       t.counter++
5       return
6
7 structure.add(tp);

```

Listing 4.8: Pseudocode example of how throughput is measured

4.2.2 Churn

As stated in section 2.8 in order to take churn into account one need to know it's good surrogates. SI has gathered churn with help of Microsoft's Team Foundation Server (TFS). The TFS system automatically records data such as churn and lead time. Based on TFS one can know that churn for SI is a good surrogate.

To measure churn the data set from SI contains three columns ("Lines added", "Lines modified" and "Lines deleted") shown in table 4.4. These three columns are automatically recorded by TFS. To complete the churn measurements the three columns are multiplied. For task id one, the churn is 2028 ($352 + 307 + 1369 = 2028$). Some tasks has zero churn, for example task with id six, these tasks don't need code in order to be finished such tasks needs technical support to be finished. The algorithm is shown in listing 4.9

```

1 void updateChurn(Churn c, ArrayList list)
2   for Churn ch in list
3     if ch.date EQUALS c.date
4       ch.churn += c.churn
5       return
6
7 structure.add(c);

```

Listing 4.9: Pseudocode example of how throughput is measured

4.2.3 Lead time

The program does not need to analyze the lead time for each task. The lead time for each task is recorded by TFS. The lead time is represented in the data set as shown in table 4.5. The program will gather all the tasks that are started on the same day and belongs to the same team and add up their lead time together as shown in code listing 4.10.

Task id	Lines added	Lines modified	Lines deleted
1	352	307	1369
2	314	31	15
3	314	31	15
4	62	327	153
5	21	3	0
6	0	0	0

Table 4.4: How churn is presented in the excel document

ID	Type	Leadtime
84096	Feature	1
84118	Bug	25
84096	Feature	7
84118	Bug	13

Table 4.5: How lead time is recorded in the excel document

```

1
2 addLeadTime(lead_time t, ArrayList list)
3   for lead_time in list
4     if lead_time.date EQUALS t.date
5       lead_time.leadtime+= t.leadtime
6     return
7
8 structure.add(t)

```

Listing 4.10: Pseudocode example of lead time is measured

4.3 Lead time and churn

As in the article "Quantifying the Effect of Using Kanban versus Scrum" (Sjøberg, Johnsen and Solberg, 2012) to prevent outliers from having a large effect on the results, the top and lowest ten percent of lead time and churn are removed from the data set.

Churn is removed because a module or a feature, which consists of hundred or thousand lines of code could be removed without much work and in this thesis churn is used as surrogate effort to know the complexity of the task. Lead time is removed because some tasks could be given low priority due to lack of manpower in a given period or tasks could be labeled as not critical and the lead time of these tasks will effect the result.

4.4 Bug and feature

Each task in the data set is label as either feature or bug as shown in figure 4.6.

Task ID	Type
57970	Bug
57971	Bug
57972	Bug
57973	Bug
57974	Feature
57975	Feature
57976	Feature
57977	Feature
57978	Feature

Table 4.6: Example of how tasks are labeled

In order to measure feature and bug the program and SPSS will be used. The program will generate throughput and churn as described in section 4.2.1 and 4.2.2. When the program has produced throughput and churn, SPSS will be used to produce throughput bug and feature as well as churn bug and churn feature. In order to do so a command called case summaries will be used. The case summaries groups variables. In table 4.7 a excerpt from the result data produced by the program. With the case summaries function the variable "Team name", "Quarter" and "Type" will be grouped over churn in order to find churn feature and churn bug per quarter.

Team name	Churn	Date	Quarter	Type
Team one	25	2011-12-20	2011-4	Feature
Team two	3	2012-04-19	2012-2	bug
Team one	7	2010-08-06	2010-3	Feature

Table 4.7: A excerpt from the result data produced by the program

4.5 SPSS

"IBM®SPSS®Statistics is a comprehensive system for analyzing data. SPSS Statistics can take data from almost any type of file and use them to generate tabulated reports, charts and plots of distributions and trends, descriptive statistics, and complex statistical analyses." (IBM, 2014)

After the program has finished the measurements of the data, SPSS will be used to analyze the derived data. SPSS will help to answer the research question stated in chapter 1.2 with help of two statistics method: Correlation and case summaries.

Chapter 5

Results

5.1 Introduction

In this chapter the results are presented. There are five correlation tables presenting the results. Vertically in the table, the variables are stated. Horizontally the corresponding teams are stated. In the table the team names are shortened, team one is shortened to T1, team two is shortened to T2 and so on.

The result will be presented in the following manner. The first, Section 5.2 shows the correlation table for WIP, Section 5.3 shows the correlation table for leadtime, Section 5.4 show the correlation table for bug, Section 5.5 show the correlation table for throughput and Section 5.6 show the correlation table for churn. Following the correlation tables, a section for each team's descriptive statistics is shown.

The relationship between two variables will occur twice, in both their correlation table, since the correlation tables are symmetric. When the relationship is stated in one of the sections, the relationship will not be stated in the following sections. Some of the ten variables shown vertically are shown in table 3.3 and are explained in chapter 4. "Throughput Feature" means tasks labeled with type "feature" are the only one who is counted. For "Throughput Bug", only the tasks labeled with type "bug" is counted as described in section . The same goes for "Churn Bug" and "Churn Feature".

The "Bugs finished in the same quarter" variable represents how many tasks labeled "Bug" that are finished within the same quarter as it was created in backlog. The "Average days for bugs in backlog" variable is used to see how long tasks with type "bug" are in the backlog, before pulled out. These two variables are used to see the prioritizing of bugs within a quarter as well as indicator of the workload for the quarter.

5.2 Correlation - WIP

Table 5.1 shows team one, three, four and six have significant positive relationship between WIP and throughput. Since throughput feature and throughput bug is subset of throughput, its natural that these variables also have a significant positive correlation to WIP. For team six that's not the case. Throughput bug have a positive correlation of 0.11, while throughput and throughput feature have respectively .594 and .609. The reason why throughput bug do not have a close relationship to throughput is because throughput feature consist of 661 tasks as shown in the total row in table 5.31(a), while Throughput bug consist of 223 finished tasks as shown in 5.31(b) . 223 are 1/3 of all throughputs feature and this results reflects that throughput has a strong relationship to throughput feature.

	T1	T2	T3	T4	T5	T6	T7	T8	T9	T10
Throughput	.747**	0.19	.717**	.815**	0.53	.594*	-0.28	0.22	0.36	0.26
Throughput Feature	.735**	-0.22	.806**	.811**	0.26	.609*	-0.07	-0.35	0.23	0.33
Throughput bug	.625*	0.25	.687**	.811**	.543*	0.11	-.857**	0.17	0.32	0.31
Bugs	.728**	0.17	0.53	.545*	0.51	0.43	0.21	0.20	.679**	-0.03
Bugs finished, quarter	0.35	0.27	-0.03	.581*	0.20	0.16	.698*	.750**	.789**	0.36
Avg days in backlog, bugs	-0.02	0.39	0.41	0.51	-0.18	0.05	-0.53	0.21	0.27	0.34
Leadtime	-0.23	0.04	-0.11	.694**	0.09	-0.09	0.34	0.32	-0.07	-0.31
Churn	-0.18	-0.30	-.569*	.c	-0.25	-0.03	-.713*	-0.01	0.03	0.42
Churn feature	0.38	-0.48	-0.44	.c	-0.02	0.01	-0.62	0.11	0.29	0.08
Churn bug	0.05	0.13	-.671**	.c	-0.24	.775**	-.659*	-0.04	0.12	0.36

Table 5.1: Correlation - WIP

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

c. Cannot be computed because at least one of the variables is constant.

For team one and four, bugs have significant positive relationship with WIP. This seems obvious since both of the teams' throughput bug have a significant positive correlation with WIP. For Team three, bugs do not have significant positive correlation with WIP, even though throughput bug have. This states that these two variables are independent. Since the variable "Bugs" is recorded when the bug is created hence the "Created date" column from the data set. The variable "Throughput bugs" is recorded from when the bug was finished, hence the "Date to" column. This shows that there is no direct connection between throughput bugs and bugs. Even though often the value in "Created date" column and the value in "Date to" column's date are close. Which is indicated by tables 5.9(b), 5.14(b) , 5.19(b), 5.24(b), 5.29(b) and 5.34(b). These tables indicate that mostly of each bug is fixed within the same quarter.

Team four's leadtime have a significant positive correlation with WIP. Team three's

churn and churn bug have a significant positive correlation with WIP as well. Initially team three's churn feature had a significant positive correlation with WIP since it's a subset of churn. But since feature counts for just 1/3 (317/1065) of tasks as shown in the total row in table 5.18(a) and table 5.17(b), the churn feature variable do not contribute to much to the churn variable as churn bug.

For team six, churn and churn feature do not have a significant positive correlation with WIP, but churn bug do. Churn bug consist of 17% (265/1533) of all churn for team six. This shows that churn bug have a small impact on the churn variable, and that's why churn bug have a significant positive correlation with WIP.

Team seven have a significant negative correlation between WIP and the pair churn and churn bug. The churn is collected from 625 tasks as shown in the total row in table 5.37(b). Out of 625, churn bug consist of 417 tasks, while churn feature consist of 235 tasks, as shown in table 5.38(a) and 5.38(b). This reflects the result in the correlation table 5.1 where churn have the result -.713, churn bug -.659 and churn feature -0.62. Team seven has a significant positive correlation between WIP and that bugs are finished within the same quarter there are started.

Team eight and nine have a significant positive correlation between WIP and that bugs are finished within in the same quarter as they are recorded. Team nine also has a significant positive correlation between WIP and bugs.

5.3 Correlation - Leadtime

In this section the table 5.2 shows the correlation between leadtime and the variable for the seven teams. Throughput has a significant positive correlation with leadtime for team six. For team two, bugs finished within the same quarter have a significant positive correlation with leadtime. Team two also has a significant positive correlation between leadtime and churn bug, but not with churn or churn feature. Churn bug have a correlation of -.725 and churn feature with 0.41. These two values are in the opposite ends of each other in the correlation table. The reason is, churn bug consist of 1197 tasks, churn feature consist of 375 tasks as shown in the total row in table 5.23(a) and 5.23(b). The churn variable in table 5.2 with value of -0.45 will benefit most from churn bugs, the value -0.35 reflects that.

Team six has a significant positive correlation with leadtime for the variable churn bug as well. The reason why churn or churn feature not have a significant positive correlation with leadtime was stated in section 5.2. Team ten has a significant negative correlation between WIP and both the variables churn and churn bug. Churn feature do not have a significant positive correlation with WIP. Churn feature consist of 92 tasks

	T1	T2	T3	T4	T5	T6	T7	T8	T9	T10
WIP	-0.23	0.04	-0.11	.694**	0.09	-0.09	0.34	0.32	-0.07	-0.31
Throughput	-0.44	-0.22	-0.39	0.49	-0.19	-.554*	-0.03	0.05	-0.29	-0.13
Throughput Feature	-0.35	0.22	-0.38	0.47	-0.22	-0.52	0.05	-0.18	-0.19	-0.29
Throughput bug	-0.27	-0.31	-0.33	0.47	-0.14	0.09	-0.58	-0.23	-0.37	-0.08
Bugs	-0.23	-0.23	-0.24	0.25	-0.25	-0.22	-0.01	-0.12	-0.06	-0.14
Bugs finished, quarter	0.38	-.550*	0.02	0.48	-0.47	-0.36	-0.49	0.28	-0.14	-0.36
Avg days in backlog, bugs	-0.27	0.44	-0.15	0.13	0.07	0.01	0.12	0.11	-0.02	-0.42
Churn	0.41	-0.45	-0.13	.c	0.24	-0.08	-0.07	-0.28	-0.32	-.681**
Churn feature	0.27	0.41	0.15	.c	-0.22	-0.20	0.04	-0.02	-0.32	0.31
Churn bug	0.28	-.725**	-0.12	.c	0.25	-.553*	-0.34	-0.00	-0.21	-.728**

Table 5.2: Correlation - Leadtime

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

c. Cannot be computed because at least one of the variables is constant.

while churn bug consist of 517 tasks as shown in table 5.53(a) and 5.53(b). Hence the close relationship between churn and churn bug.

5.4 Correlation - Bugs

This section contains information about the correlation for bugs. The result is listed in table 5.3. For team one, three and five, all three-throughput variables have a significant positive correlation with bug. Team one also has significant positive correlation between WIP and bug. For team two both throughput and throughput bug have a significant positive correlation. Why throughput feature differs from throughput and throughput bug is because throughput feature consist of 230 items and throughput bug consist of 460 which is shown by table 5.11(a) and 5.11(b). This shows that throughput bug contribute 1/3 more to the throughput variable than throughput feature and that's why throughput feature differs.

Team four has four variables with a significant positive correlation with bugs. These are WIP, throughput bug, bug finished within the same quarter and average days for bugs in backlog. Since throughput bug have a significant positive correlation, should also throughput and throughput feature have it. But, if one look at the correlation table, throughput has a correlation of .513, throughput feature has a correlation of .531 and throughput bug with .535, so there is not much difference between these variables.

Team six has a significant positive correlation between bugs and throughput bug. The

	T1	T2	T3	T4	T5	T6	T7	T8	T9	T10
WIP	.728**	0.17	0.53	.545*	0.51	0.43	0.21	0.20	.679**	-0.03
Throughput	.687**	.810**	.880**	.586*	.975**	0.27	0.07	0.41	.699**	.557*
Throughput Feature	.681**	0.01	.822**	.583*	.881**	0.25	0.10	0.12	.597*	-0.14
Throughput bug	.925**	.834**	.868**	.583*	.959**	.744**	-0.02	.915**	.653*	.589*
Bugs finished, quarter	0.50	-0.18	0.12	0.40	0.17	.762**	0.14	0.18	.701**	0.05
Avg days in backlog, bugs	0.52	0.38	0.43	0.30	0.18	0.24	-0.40	0.28	0.21	0.13
Leadtime	-0.23	-0.23	-0.24	0.25	-0.25	-0.22	-0.01	-0.12	-0.06	-0.14
Churn	0.23	-0.01	0.00	.c	-0.17	-0.10	-0.21	-0.08	-0.34	0.31
Churn feature	0.30	0.07	-0.03	.c	0.28	-0.04	-0.39	-0.15	-.618*	0.06
Churn bug	0.37	0.17	-0.08	.c	-0.19	0.43	0.22	0.04	0.10	0.28

Table 5.3: Correlation - Bugs

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

c. Cannot be computed because at least one of the variables is constant.

reason why throughput does not have a significant positive correlation as well is that throughput bug has little impact on the throughput variable. Since throughput bug have 223 items in total, shown in table 5.31(b). Throughput feature have 661 items in total shown in table 5.31(a). Which means that throughput feature has the most impact on the throughput variable.

Team nine has six variables with a significant positive correlation with bugs. These variables are WIP, throughput, throughput feature, throughput bug, bugs finished within same quarter and churn feature. Churn feature consist of approximately 1/3 of the total churn (295/923) shown in tables 5.48(a) and 5.47(b). Therefore churn bug contributes mostly to the churn variable and that's why churn do not have a significant positive correlation with bugs when churn feature have.

Team ten has two variables with a significant positive correlation with bugs. These two are Throughput and throughput bug. Throughput bug consist of almost 86% of all throughput as shown in tables 5.50(b) and 5.51(b), hence the relationship between throughput and throughput bug.

5.5 Correlation - Throughput

This section consist of the correlation table 5.4. Table 5.4 represents the correlation for throughput. The teams two and six do not have a significant correlation between throughput and throughput feature and throughput bug. Why throughput feature

and throughput bug differ in the case of team two is stated in section 5.4. Why throughput differ in in the case of team six is stated in section 5.2. Team six also has a significant correlation between throughput and leadtime. Both team seven and nine has

	T1	T2	T3	T4	T5	T6	T7	T8	T9	T10
WIP	.747**	0.19	.717**	.815**	0.53	.594*	-0.28	0.22	0.36	0.26
Throughput Feature	.971**	0.09	.933**	.997**	.854**	.991**	.912**	.930**	.882**	0.43
Throughput bug	.662**	.970**	.986**	.997**	.994**	-0.19	.850**	0.44	.960**	.980**
Bugs	.687**	.810**	.880**	.586*	.975**	0.27	0.07	0.41	.699**	.557*
Bugs finished, quarter	0.16	0.12	0.23	0.39	0.12	0.12	0.03	0.33	.696**	.589*
Avg days in backlog, bugs	0.16	0.12	0.45	0.37	0.14	-0.17	-0.17	-0.17	-0.41	-0.09
Leadtime	-0.44	-0.22	-0.39	0.49	-0.19	-.554*	-0.03	0.05	-0.29	-0.13
Churn	-0.27	-0.23	-0.26	.c	-0.20	-0.27	.758*	-.635*	-0.01	0.26
Churn feature	0.11	-0.18	-0.25	.c	0.22	-0.23	0.54	-0.45	-0.27	-0.25
Churn bug	-0.11	0.06	-0.32	.c	-0.21	.592*	.693*	-0.28	0.04	0.21

Table 5.4: Correlation - Throughput

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

c. Cannot be computed because at least one of the variables is constant.

a significant positive correlation between throughput and throughputs sub variables, throughput feature and throughput bug. For team eight and ten that's not the case. For team eighth snakker med dag om. For team ten, the relationship between the throughput variables where stated in section 5.4.

Team seven also has a significant positive correlation between churn and churn bug. Why churn feature have a close relationship to churn where stated in section 5.2. Both team nine and ten also have a significant positive correlation between throughput and the variable bugs and bugs finished within the same quarter.

5.6 Correlation - Churn

This section consist of the correlation table 5.6 Table 5.6 represents the correlation for churn. Both team one and team three have a positive significant correlation between churn and churn feature and churn bug. Which is normal. For team six, two and five this is not the case. Team six's churn bug has a positive correlation of 0.18. The reason churn bug differ from churn and churn feature is stated in section 5.2. For team two and five, churn feature differs from churn bug and churn. Why churn feature differs from churn bug and churn for team two's case is stated in section 5.3. In team five's case the churn feature has a total number of 182 tasks while churn bug has a total of

1719 tasks which are most of the contribution to the throughput variable. Team seven

	T1	T2	T3	T4	T5	T6	T7	T8	T9	T10
WIP	-0.18	-0.30	-.569*	.c	-0.25	-0.03	-.713*	-0.01	0.03	0.42
Throughput	-0.27	-0.23	-0.26	.c	-0.20	-0.27	.758*	-.635*	-0.01	0.26
Throughput Feature	-0.31	-0.09	-0.28	.c	-0.10	-0.22	.633*	-.678*	0.20	0.05
Throughput bug	0.26	-0.17	-0.28	.c	-0.21	0.12	.866**	-0.10	-0.09	0.27
Bugs	0.23	-0.01	0.00	.c	-0.17	-0.10	-0.21	-0.08	-0.34	0.31
Bugs finished, quarter	0.48	0.15	-0.14	.c	-0.50	0.04	-0.53	0.06	-0.01	0.43
Avg days in backlog, bugs	0.36	-0.19	-0.01	.c	0.39	0.53	0.52	0.26	-0.15	0.04
Leadtime	0.41	-0.45	-0.13	.c	0.24	-0.08	-0.07	-0.28	-0.32	-.681**
Churn feature	.570*	0.38	.790**	.c	0.27	.980**	.879**	0.55	.639*	-0.03
Churn bug	.828**	.728**	.955**	.c	.983**	0.18	.750*	.817**	.599*	.969**

Table 5.5: Correlation - Churn

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

c. Cannot be computed because at least one of the variables is constant.

has a significant positive correlation between churn and the variables WIP, throughput, throughput feature, throughput bug, churn feature and churn bug. Team nine has a significant positive correlation between churn and both churn feature and churn bug. Team ten also has a positive correlation between churn and churn bug. Churn bug consist of 517 tasks out of 609 churn tasks as stated in section 5.3, that's why churn feature do not have a close relationship with churn.

5.7 Team 1 - Descriptive Statistics

(a) Descriptive Statistic -WIP							(b) Descriptive Statistic -Throughput						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	117.0	0.8	0	1.5	5.0	0	2010-3	3.0	3.0	1.0	3.5	7.0	1.0
2010-4	184.0	0.3	0	0.6	3.0	0	2010-4	3.0	1.0	1.0	0	1.0	1.0
2011-1	180.0	1.7	0	5.1	30.0	0	2011-1	7.0	10.4	11.0	8.1	25.0	1.0
2011-2	182.0	6.6	1.0	12.2	51.0	0	2011-2	32.0	9.4	10.0	6.7	26.0	1.0
2011-3	184.0	0.9	0.5	1.0	3.0	0	2011-3	2.0	1.0	1.0	0	1.0	1.0
2011-4	184.0	7.1	0.5	17.5	97.0	0	2011-4	25.0	14.9	10.0	14.6	49.0	1.0
2012-1	182.0	11.1	2.0	15.1	67.0	0	2012-1	49.0	8.6	5.0	8.1	33.0	1.0
2012-2	182.0	15.2	4.5	25.5	107.0	0	2012-2	45.0	11.2	3.0	16.0	56.0	1.0
2012-3	184.0	18.0	9.0	20.4	65.0	0	2012-3	34.0	5.5	3.0	6.3	23.0	1.0
2012-4	184.0	17.3	12.5	21.1	99.0	0	2012-4	17.0	14.2	14.0	13.7	44.0	1.0
2013-1	180.0	16.4	12.5	19.1	85.0	0	2013-1	13.0	19.5	17.0	17.0	58.0	1.0
2013-2	182.0	33.5	1.5	45.9	178.0	0	2013-2	26.0	21.6	18.0	16.9	60.0	1.0
2013-3	184.0	3.7	0.5	7.2	31.0	0	2013-3	17.0	9.0	7.0	7.7	27.0	1.0
2013-4	166.0	2.3	0	6.0	35.0	0	2013-4	17.0	6.3	3.0	7.5	24.0	1.0
Total	3282	7.5	.00	18.6	178	0	Total	290	11.0	6.0	12.5	60	1

Table 5.6: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature							(b) Descriptive Statistic -Throughput bug						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	7.0	7.0	-	7.0	7.0	2010-3	2.0	1.0	1.0	0	1.0	1.0
2011-1	7.0	10.4	11.0	8.1	25.0	1.0	2010-4	3.0	1.0	1.0	0	1.0	1.0
2011-2	24.0	10.1	10.0	5.6	24.0	1.0	2011-2	8.0	7.5	2.0	9.3	26.0	1.0
2011-3	1.0	1.0	1.0	-	1.0	1.0	2011-3	1.0	1.0	1.0	-	1.0	1.0
2011-4	11.0	16.6	13.0	11.0	35.0	4.0	2011-4	14.0	13.6	5.0	17.3	49.0	1.0
2012-1	16.0	15.2	15.0	9.3	33.0	1.0	2012-1	33.0	5.3	5.0	5.0	21.0	1.0
2012-2	26.0	16.1	5.0	17.7	56.0	1.0	2012-2	19.0	4.5	1.0	10.5	47.0	1.0
2012-3	23.0	6.0	4.0	6.6	23.0	1.0	2012-3	11.0	4.4	3.0	5.8	21.0	1.0
2012-4	14.0	15.1	14.5	14.3	44.0	1.0	2012-4	3.0	10.0	3.0	12.1	24.0	3.0
2013-1	10.0	23.3	20.0	17.4	58.0	3.0	2013-1	3.0	7.0	3.0	8.7	17.0	1.0
2013-2	21.0	23.6	24.0	18.1	60.0	1.0	2013-2	5.0	13.4	13.0	7.1	21.0	3.0
2013-3	16.0	9.5	7.5	7.7	27.0	1.0	2013-3	1.0	1.0	1.0	-	1.0	1.0
2013-4	12.0	8.3	7.5	8.1	24.0	1.0	2013-4	5.0	1.4	1.0	0.9	3.0	1.0
Total	182.0	13.7	10.0	13.2	60.0	1.0	Total	108.0	6.4	3.0	9.6	49.0	1.0

Table 5.7: Caption of Descriptive Statistic for Throughput feature and Throughput bug (a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	13.0	13.0	.	13.0	13.0
2010-4	2.0	8.5	8.5	9.2	15.0	2.0
2011-2	94.0	3.9	3.0	3.2	14.0	1.0
2011-3	1.0	5.0	5.0	.	5.0	5.0
2011-4	161.0	2.7	2.0	2.7	15.0	1.0
2012-1	231.0	3.6	3.0	3.1	15.0	1.0
2012-2	283.0	3.1	3.0	2.2	13.0	1.0
2012-3	96.0	3.3	1.0	4.0	15.0	1.0
2012-4	136.0	3.5	2.0	2.7	13.0	1.0
2013-1	115.0	3.1	3.0	2.0	10.0	1.0
2013-2	253.0	5.3	4.0	4.4	15.0	1.0
2013-3	85.0	4.6	4.0	3.0	13.0	1.0
2013-4	63.0	3.7	3.0	2.6	10.0	1.0
Total	1521	3.7	3	3.3	15	1

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	13.0	13.0	.	13.0	13.0
2010-4	2.0	30.0	30.0	41.0	59.0	1.0
2011-2	94.0	21.5	10.0	22.9	83.0	1.0
2011-3	1.0	2.0	2.0	.	2.0	2.0
2011-4	161.0	17.5	8.0	23.1	94.0	0
2012-1	231.0	12.9	1.0	22.0	93.0	0
2012-2	283.0	12.9	1.0	22.2	92.0	0
2012-3	96.0	7.2	0	18.0	75.0	0
2012-4	136.0	4.1	0	12.2	67.0	0
2013-1	115.0	2.1	0	6.2	32.0	0
2013-2	253.0	7.6	0	15.7	92.0	0
2013-3	85.0	2.5	0	9.1	54.0	0
2013-4	63.0	4.3	0	16.2	90.0	0
Total	1521	10.2	.00	19.4	94	0

Table 5.8: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-2	8.0	23.2	22.0	21.2	49.0	1.0
2011-4	31.0	8.3	0	20.6	86.0	0
2012-1	106.0	4.2	0	11.8	49.0	0
2012-2	134.0	5.6	0	16.2	90.0	0
2012-3	65.0	3.1	0	12.8	75.0	0
2012-4	111.0	1.7	0	9.5	67.0	0
2013-1	89.0	0.0	0	0.1	1.0	0
2013-2	130.0	1.1	0	6.2	43.0	0
2013-3	75.0	1.0	0	6.5	54.0	0
2013-4	48.0	0	0	0	0	0
Total	797.0	2.8	0	11.3	90.0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	13.0	13.0	-	13.0	13.0
2010-4	2.0	30.0	30.0	41.0	59.0	1.0
2011-2	86.0	21.3	10.0	23.2	83.0	1.0
2011-3	1.0	2.0	2.0	-	2.0	2.0
2011-4	130.0	19.7	11.0	23.1	94.0	0
2012-1	125.0	20.3	8.0	25.7	93.0	0
2012-2	149.0	19.5	9.0	24.7	92.0	0
2012-3	31.0	15.8	4.0	23.7	69.0	0
2012-4	25.0	14.6	8.0	16.9	64.0	0
2013-1	26.0	9.1	6.0	10.3	32.0	0
2013-2	123.0	14.4	6.0	19.4	92.0	0
2013-3	10.0	14.0	8.0	16.0	45.0	0
2013-4	15.0	18.1	3.0	29.8	90.0	0
Total	724.0	18.2	8.0	23.0	94.0	0

Table 5.9: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs							(b) Descriptive Statistic - Bugs finished within quarter					
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	1.0	1.0	1.0	.	1.0	1.0	2010-3	1	0	1	100	0
2010-4	4.0	1.0	1.0	0	1.0	1.0	2010-4	4	0	4	100	0
2011-2	32.0	4.2	3.5	3.6	14.0	1.0	2011-2	130	3	133	97.7	2.3
2011-3	5.0	1.0	1.0	0	1.0	1.0	2011-3	1	4	5	20	80
2011-4	36.0	4.9	2.5	5.4	22.0	1.0	2011-4	156	22	178	87.6	12.3
2012-1	43.0	3.5	3.0	2.3	10.0	1.0	2012-1	146	4	150	97.3	2.7
2012-2	33.0	5.4	3.0	5.5	21.0	1.0	2012-2	176	3	179	98.3	1.7
2012-3	16.0	2.4	1.5	1.8	6.0	1.0	2012-3	37	2	39	94.9	5.1
2012-4	13.0	2.8	2.0	1.8	6.0	1.0	2012-4	33	3	36	91.7	8.3
2013-1	8.0	3.5	3.0	2.5	7.0	1.0	2013-1	24	4	28	85.7	14.3
2013-2	27.0	5.8	4.0	4.8	17.0	1.0	2013-2	157	0	157	100	0
2013-3	11.0	1.3	1.0	0.5	2.0	1.0	2013-3	13	1	14	92.9	7.1
2013-4	10.0	1.7	1.0	1.9	7.0	1.0	2013-4	17	0	17	100	0
Total	240	4.0	2.0	4.0	22	1	Mean	63.9	3.3	67.3	83.3	16.7

Table 5.10: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter
(a) (b)

5.8 Team 2 - Descriptive Statistics

(a) Descriptive Statistic -WIP							(b) Descriptive Statistic -Throughput						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	117.0	3.1	0	6.6	23.0	0	2010-3	16.0	4.2	3.0	4.0	16.0	1.0
2010-4	184.0	10.7	4.5	11.9	41.0	0	2010-4	54.0	4.1	3.0	3.9	21.0	1.0
2011-1	180.0	13.6	8.5	14.1	38.0	0	2011-1	57.0	4.6	4.0	3.6	17.0	1.0
2011-2	181.0	14.9	12.0	18.1	62.0	0	2011-2	41.0	6.9	5.0	5.7	25.0	1.0
2011-3	184.0	16.3	9.0	17.6	56.0	0	2011-3	52.0	3.8	2.0	3.6	15.0	1.0
2011-4	184.0	15.0	6.5	16.7	46.0	0	2011-4	52.0	3.7	3.0	2.7	11.0	1.0
2012-1	182.0	10.0	4.0	10.6	31.0	0	2012-1	55.0	4.3	3.0	3.4	12.0	1.0
2012-2	182.0	12.7	3.0	14.6	51.0	0	2012-2	51.0	4.1	3.0	3.5	21.0	1.0
2012-3	184.0	12.1	5.5	13.4	45.0	0	2012-3	57.0	5.8	5.0	4.3	18.0	1.0
2012-4	184.0	10.8	1.5	13.1	47.0	0	2012-4	52.0	5.2	4.5	3.7	15.0	1.0
2013-1	180.0	9.9	4.0	10.7	35.0	0	2013-1	51.0	4.6	3.0	3.6	16.0	1.0
2013-2	182.0	14.0	7.5	14.4	37.0	0	2013-2	50.0	3.3	3.0	2.4	9.0	1.0
2013-3	184.0	9.4	4.5	9.9	28.0	0	2013-3	55.0	3.9	4.0	2.9	16.0	1.0
2013-4	177.0	6.5	0	8.1	29.0	0	2013-4	47.0	3.2	3.0	2.7	13.0	1.0
Total	3292	8.8	.00	13	62	0	Total	690	4.39	3.00	3.7	25	1

Table 5.11: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	5.0	4.6	3.0	3.2	10.0	2.0
2010-4	22.0	3.1	2.5	2.8	11.0	1.0
2011-1	15.0	5.1	4.0	4.4	17.0	1.0
2011-2	4.0	2.8	2.5	1.0	4.0	2.0
2011-3	25.0	3.7	2.0	3.8	14.0	1.0
2011-4	10.0	3.4	3.0	2.9	11.0	1.0
2012-1	9.0	2.1	1.0	2.0	7.0	1.0
2012-2	16.0	3.5	3.5	2.3	8.0	1.0
2012-3	12.0	4.2	3.5	1.9	8.0	1.0
2012-4	25.0	4.6	3.0	3.9	13.0	1.0
2013-1	11.0	3.6	3.0	3.3	11.0	1.0
2013-2	27.0	2.7	2.0	2.0	9.0	1.0
2013-3	29.0	3.9	3.0	2.7	11.0	1.0
2013-4	19.0	3.4	2.0	3.0	10.0	1.0
Total	229.0	3.6	3.0	3.0	17.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	11.0	4.1	3.0	4.4	16.0	1.0
2010-4	32.0	4.8	4.0	4.4	21.0	1.0
2011-1	42.0	4.4	4.0	3.3	13.0	1.0
2011-2	36.0	7.4	5.5	5.9	25.0	1.0
2011-3	27.0	3.9	3.0	3.5	15.0	1.0
2011-4	42.0	3.7	3.0	2.7	11.0	1.0
2012-1	46.0	4.7	3.5	3.5	12.0	1.0
2012-2	35.0	4.3	3.0	4.0	21.0	1.0
2012-3	45.0	6.3	5.0	4.6	18.0	1.0
2012-4	27.0	5.8	5.0	3.3	15.0	1.0
2013-1	40.0	4.8	4.0	3.7	16.0	1.0
2013-2	23.0	3.9	3.0	2.8	9.0	1.0
2013-3	26.0	3.8	4.0	3.2	16.0	1.0
2013-4	28.0	3.1	3.0	2.5	13.0	1.0
Total	460.0	4.8	4.0	3.9	25.0	1.0

Table 5.12: Caption of Descriptive Statistic for Throughput feature and Throughput bug
(a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	33.0	8.6	5.0	8.1	24.0	1.0
2010-4	97.0	7.5	6.0	6.8	27.0	1.0
2011-1	133.0	7.2	7.0	5.3	27.0	1.0
2011-2	113.0	7.0	6.0	6.0	27.0	1.0
2011-3	98.0	8.8	6.0	6.8	27.0	1.0
2011-4	88.0	8.1	6.0	6.9	27.0	1.0
2012-1	128.0	5.6	4.0	5.0	27.0	1.0
2012-2	115.0	5.7	4.0	5.0	23.0	1.0
2012-3	212.0	6.0	5.0	4.7	22.0	1.0
2012-4	154.0	5.7	5.0	4.7	25.0	1.0
2013-1	136.0	6.5	5.0	5.5	24.0	1.0
2013-2	72.0	6.6	5.0	6.4	26.0	1.0
2013-3	100.0	6.7	5.0	6.0	27.0	1.0
2013-4	93.0	6.6	6.0	4.7	20.0	1.0
Total	1572	6.7	5	5.7	27	1

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	33.0	56.7	10.0	97.9	352.0	1.0
2010-4	97.0	63.6	25.0	99.7	493.0	1.0
2011-1	133.0	41.6	18.0	66.2	407.0	1.0
2011-2	113.0	54.2	16.0	89.0	509.0	1.0
2011-3	98.0	53.6	25.0	78.2	379.0	1.0
2011-4	88.0	68.9	29.5	92.3	446.0	1.0
2012-1	128.0	68.8	23.0	96.0	521.0	0
2012-2	115.0	69.0	24.0	107.2	475.0	0
2012-3	212.0	63.3	24.0	92.0	442.0	0
2012-4	154.0	89.4	28.5	119.0	513.0	0
2013-1	136.0	54.0	12.0	92.5	467.0	0
2013-2	72.0	62.8	19.5	98.1	419.0	0
2013-3	100.0	88.2	33.5	120.5	514.0	0
2013-4	93.0	81.0	24.0	125.1	474.0	0
Total	1572	65.7	21.	99.3	521	0

Table 5.13: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	7.0	167.6	144.0	154.4	352.0	1.0
2010-4	24.0	155.8	87.0	155.8	493.0	6.0
2011-1	26.0	72.2	47.0	87.0	312.0	1.0
2011-2	6.0	117.3	70.5	137.7	383.0	2.0
2011-3	22.0	126.7	103.5	113.5	379.0	1.0
2011-4	12.0	116.3	120.0	96.0	294.0	12.0
2012-1	18.0	108.9	54.5	119.6	377.0	0
2012-2	29.0	97.7	35.0	123.8	432.0	0
2012-3	56.0	86.0	44.5	99.1	321.0	0
2012-4	50.0	140.4	48.0	157.7	513.0	0
2013-1	38.0	71.6	1.5	137.3	467.0	0
2013-2	16.0	100.1	39.0	135.9	419.0	0
2013-3	42.0	120.8	40.5	153.1	514.0	0
2013-4	29.0	140.0	59.0	161.5	465.0	0
Total	375.0	111.4	48.0	134.3	514.0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	26.0	26.8	8.0	46.6	193.0	1.0
2010-4	73.0	33.3	18.0	41.6	191.0	1.0
2011-1	107.0	34.1	16.0	58.2	407.0	1.0
2011-2	107.0	50.7	14.0	85.1	509.0	1.0
2011-3	76.0	32.5	13.5	47.8	321.0	1.0
2011-4	76.0	61.5	25.5	90.1	446.0	1.0
2012-1	110.0	62.2	18.0	90.5	521.0	0
2012-2	86.0	59.3	21.0	99.9	475.0	0
2012-3	156.0	55.2	19.5	88.3	442.0	0
2012-4	104.0	64.8	19.0	85.6	328.0	0
2013-1	98.0	47.2	14.0	67.5	318.0	0
2013-2	56.0	52.1	14.5	82.9	376.0	0
2013-3	58.0	64.6	32.5	83.8	345.0	0
2013-4	64.0	54.2	19.5	94.5	474.0	1.0
Total	1197.0	51.3	17.0	80.4	521.0	0

Table 5.14: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	20.0	2.6	2.0	3.5	17.0	1.0
2010-4	40.0	2.5	2.0	1.7	9.0	1.0
2011-1	47.0	2.4	2.0	1.8	8.0	1.0
2011-2	40.0	3.8	3.0	2.5	13.0	1.0
2011-3	43.0	2.6	2.0	2.4	13.0	1.0
2011-4	47.0	2.5	2.0	1.6	8.0	1.0
2012-1	35.0	3.3	3.0	3.0	16.0	1.0
2012-2	34.0	2.3	2.0	1.5	7.0	1.0
2012-3	43.0	3.6	2.0	2.6	10.0	1.0
2012-4	33.0	3.9	3.0	3.1	14.0	1.0
2013-1	38.0	2.2	2.0	1.2	6.0	1.0
2013-2	32.0	1.9	1.5	1.2	5.0	1.0
2013-3	35.0	1.8	1.0	1.1	5.0	1.0
2013-4	37.0	1.9	1.0	1.3	7.0	1.0
Total	536	2.7	2.0	2.2	17	1

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	30	23	53	56.6	43.4
2010-4	65	34	99	65.7	34.3
2011-1	101	13	114	88.6	11.4
2011-2	142	8	150	94.7	5.3
2011-3	87	24	111	78.4	21.6
2011-4	90	29	119	75.6	24.4
2012-1	94	23	117	80.3	19.7
2012-2	70	9	79	88.6	11.4
2012-3	146	7	153	95.4	4.6
2012-4	101	27	128	78.9	21.1
2013-1	78	5	83	94.0	6.0
2013-2	58	3	61	95.1	4.9
2013-3	62	2	64	96.9	3.1
2013-4	69	0	69	100	0
Mean	66.4	12.3	78.8	74.4	25.6

Table 5.15: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter (a) (b)

5.9 Team 3 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	116.0	1.9	0	4.8	23.0	0
2010-4	184.0	7.0	2.5	7.5	25.0	0
2011-1	180.0	7.7	3.5	8.2	23.0	0
2011-2	182.0	11.8	6.5	12.2	37.0	0
2011-3	184.0	10.4	4.5	11.2	34.0	0
2011-4	184.0	11.7	4.5	12.7	36.0	0
2012-1	182.0	12.5	6.5	13.3	42.0	0
2012-2	182.0	12.0	9.5	12.2	34.0	0
2012-3	184.0	14.0	10.5	14.5	38.0	0
2012-4	184.0	14.8	11.0	15.3	44.0	0
2013-1	180.0	8.1	4.5	8.9	27.0	0
2013-2	182.0	3.5	1.0	4.1	13.0	0
2013-3	184.0	3.5	1.5	3.8	14.0	0
2013-4	157.0	2.4	0	3.2	13.0	0
Total	3272	6.7	.00	10.4	44	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	16.0	3.3	3.0	2.9	12.0	1.0
2010-4	54.0	3.5	3.0	3.0	15.0	1.0
2011-1	42.0	2.2	2.0	1.4	7.0	1.0
2011-2	45.0	4.3	3.0	3.8	20.0	1.0
2011-3	51.0	4.0	3.0	3.4	15.0	1.0
2011-4	50.0	4.7	3.0	5.2	27.0	1.0
2012-1	46.0	6.5	5.0	5.7	20.0	1.0
2012-2	40.0	2.9	2.0	3.2	15.0	1.0
2012-3	36.0	3.4	2.5	3.1	13.0	1.0
2012-4	51.0	5.0	4.0	4.4	22.0	1.0
2013-1	42.0	3.2	2.0	2.9	10.0	1.0
2013-2	22.0	1.6	1.0	1.0	5.0	1.0
2013-3	29.0	2.0	1.0	2.0	11.0	1.0
2013-4	18.0	1.6	1.0	1.1	5.0	1.0
Total	542	3.7	3.0	3.8	27	1

Table 5.16: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	3.0	2.3	3.0	1.2	3.0	1.0
2010-4	19.0	2.9	2.0	2.4	9.0	1.0
2011-1	29.0	2.3	2.0	1.5	7.0	1.0
2011-2	24.0	4.0	3.5	2.4	8.0	1.0
2011-3	23.0	4.3	3.0	3.5	13.0	1.0
2011-4	19.0	4.0	3.0	4.5	21.0	1.0
2012-1	10.0	5.4	2.0	5.6	16.0	1.0
2012-2	18.0	2.2	1.5	1.5	6.0	1.0
2012-3	12.0	3.9	1.5	4.3	13.0	1.0
2012-4	17.0	4.8	3.0	4.5	17.0	1.0
2013-1	8.0	2.1	1.5	1.7	6.0	1.0
2013-2	3.0	1.7	2.0	0.6	2.0	1.0
2013-3	8.0	1.8	1.5	0.9	3.0	1.0
2013-4	7.0	1.3	1.0	0.5	2.0	1.0
Total	200.0	3.3	2.0	3.2	21.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	13.0	3.5	3.0	3.2	12.0	1.0
2010-4	35.0	3.9	3.0	3.3	15.0	1.0
2011-1	13.0	2.1	2.0	1.0	3.0	1.0
2011-2	21.0	4.8	3.0	4.9	20.0	1.0
2011-3	28.0	3.8	3.0	3.5	15.0	1.0
2011-4	31.0	5.2	3.0	5.5	27.0	1.0
2012-1	36.0	6.8	5.0	5.8	20.0	1.0
2012-2	22.0	3.5	2.0	4.1	15.0	1.0
2012-3	24.0	3.2	3.0	2.4	9.0	1.0
2012-4	34.0	5.2	4.0	4.5	22.0	1.0
2013-1	34.0	3.4	2.0	3.0	10.0	1.0
2013-2	19.0	1.6	1.0	1.1	5.0	1.0
2013-3	21.0	2.1	1.0	2.2	11.0	1.0
2013-4	11.0	1.7	1.0	1.3	5.0	1.0
Total	342.0	4.0	3.0	4.1	27.0	1.0

Table 5.17: Caption of Descriptive Statistic for Throughput feature and Throughput bug
(a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	31.0	7.2	7.0	4.1	16.0	1.0
2010-4	79.0	8.7	6.0	7.6	30.0	1.0
2011-1	32.0	7.4	4.5	5.7	18.0	1.0
2011-2	95.0	7.0	5.0	6.9	29.0	1.0
2011-3	90.0	7.7	5.0	7.0	30.0	1.0
2011-4	141.0	7.8	6.0	7.0	25.0	1.0
2012-1	171.0	7.8	6.0	6.7	30.0	1.0
2012-2	64.0	11.9	11.0	8.8	30.0	1.0
2012-3	71.0	9.6	8.0	7.5	27.0	1.0
2012-4	139.0	5.9	5.0	5.6	29.0	1.0
2013-1	75.0	7.1	5.0	7.7	29.0	1.0
2013-2	27.0	8.2	7.0	6.7	27.0	1.0
2013-3	32.0	6.9	4.0	7.9	29.0	1.0
2013-4	18.0	12.0	12.5	4.5	21.0	1.0
Total	1065	7.9	6.0	7.0	30	1

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	31.0	145.0	118.0	143.8	383.0	1.0
2010-4	79.0	76.7	40.0	91.2	471.0	2.0
2011-1	32.0	81.6	62.0	74.0	320.0	2.0
2011-2	95.0	68.5	29.0	96.7	426.0	1.0
2011-3	90.0	72.7	22.5	102.5	476.0	0
2011-4	141.0	28.4	2.0	64.0	393.0	0
2012-1	171.0	44.5	2.0	82.7	475.0	0
2012-2	64.0	42.5	1.0	84.1	365.0	0
2012-3	71.0	53.9	13.0	85.3	406.0	0
2012-4	139.0	73.4	20.0	106.1	494.0	0
2013-1	75.0	45.4	10.0	68.8	291.0	0
2013-2	27.0	56.8	30.0	62.1	216.0	0
2013-3	32.0	66.1	34.5	87.2	403.0	0
2013-4	18.0	89.0	52.5	92.2	266.0	0
Total	1065	59.4	16.0	91.3	494	0

Table 5.18: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	7.0	197.4	141.0	136.1	383.0	16.0
2010-4	33.0	105.4	59.0	116.5	471.0	2.0
2011-1	19.0	104.0	76.0	84.4	320.0	14.0
2011-2	36.0	119.7	84.0	127.9	426.0	1.0
2011-3	40.0	89.9	48.5	106.8	407.0	0
2011-4	44.0	64.8	33.5	99.3	393.0	0
2012-1	41.0	93.3	59.0	113.1	421.0	0
2012-2	12.0	132.1	70.5	150.7	365.0	0
2012-3	17.0	101.9	66.0	121.4	406.0	0
2012-4	44.0	122.8	67.5	127.5	494.0	0
2013-1	13.0	68.8	64.0	64.9	193.0	0
2013-2	2.0	76.5	76.5	65.8	123.0	30.0
2013-3	5.0	146.6	120.0	149.0	403.0	24.0
2013-4	4.0	151.5	167.5	92.0	237.0	34.0
Total	317.0	102.6	61.0	115.2	494.0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	24.0	129.8	64.5	145.2	377.0	1.0
2010-4	46.0	56.1	26.0	61.1	210.0	2.0
2011-1	13.0	48.9	41.0	39.3	121.0	2.0
2011-2	59.0	37.3	21.0	51.6	279.0	1.0
2011-3	50.0	58.9	13.0	97.8	476.0	0
2011-4	97.0	11.9	0	25.9	128.0	0
2012-1	130.0	29.1	0	63.6	475.0	0
2012-2	52.0	21.9	0	38.8	169.0	0
2012-3	54.0	38.8	8.5	64.8	302.0	0
2012-4	95.0	50.5	8.0	86.2	402.0	0
2013-1	62.0	40.5	7.0	69.1	291.0	0
2013-2	25.0	55.2	29.0	63.0	216.0	0
2013-3	27.0	51.1	15.0	64.6	223.0	0
2013-4	14.0	71.1	35.5	87.3	266.0	0
Total	748.0	41.1	9.0	71.7	476.0	0

Table 5.19: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	14.0	2.8	2.0	2.9	12.0	1.0
2010-4	39.0	2.1	1.0	1.5	8.0	1.0
2011-1	22.0	1.8	1.0	1.3	5.0	1.0
2011-2	28.0	3.1	2.0	3.3	16.0	1.0
2011-3	38.0	2.4	2.0	1.9	10.0	1.0
2011-4	35.0	2.9	1.0	5.0	30.0	1.0
2012-1	39.0	3.7	2.0	4.0	23.0	1.0
2012-2	31.0	1.8	1.0	1.4	7.0	1.0
2012-3	28.0	2.5	2.0	1.8	8.0	1.0
2012-4	42.0	2.5	2.0	1.7	6.0	1.0
2013-1	30.0	1.8	1.5	1.0	4.0	1.0
2013-2	19.0	1.5	1.0	1.0	5.0	1.0
2013-3	26.0	1.3	1.0	0.5	2.0	1.0
2013-4	8.0	1.9	1.0	1.7	6.0	1.0
Total	399	2.7	1.0	2.6	30	1

(b) Descriptive Statistic - Finished bugs per quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	30	9	39	76.9	23.1
2010-4	75	6	81	92.6	7.4
2011-1	27	13	40	67.5	32.5
2011-2	79	7	86	91.9	8.1
2011-3	77	13	90	85.6	14.4
2011-4	88	13	101	87.1	12.9
2012-1	132	11	143	92.3	7.7
2012-2	44	12	56	78.6	21.4
2012-3	54	15	69	78.3	21.7
2012-4	97	10	107	90.7	9.3
2013-1	48	5	53	90.6	9.4
2013-2	21	7	28	75	25
2013-3	32	1	33	97	3
2013-4	15.0	.0	15.0	100.0	.0
Mean	58.5	8.7	67.2	86	14

Table 5.20: Caption of Descriptive Statistic for Bugs and Finished bugs per quarter (a)
(b)

5.10 Team 4 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	101.0	0.2	0	1.0	7.0	0
2010-4	184.0	2.2	0	3.1	14.0	0
2011-1	180.0	5.2	2.0	5.7	18.0	0
2011-2	182.0	6.9	2.5	7.6	31.0	0
2011-3	184.0	7.0	3.0	7.8	28.0	0
2011-4	184.0	8.2	3.0	8.9	30.0	0
2012-1	182.0	8.0	4.5	8.5	25.0	0
2012-2	182.0	5.8	2.5	6.4	20.0	0
2012-3	183.0	7.0	7.0	7.6	26.0	0
2012-4	184.0	10.3	5.0	11.0	33.0	0
2013-1	180.0	9.7	2.5	11.0	37.0	0
2013-2	182.0	8.0	3.0	8.7	29.0	0
2013-3	184.0	7.7	3.0	8.8	29.0	0
2013-4	181.0	5.3	1.0	6.0	19.0	0
Total	3280	5.1	.00	7.7	37	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	4.0	3.0	1.0	4.0	9.0	1.0
2010-4	39.0	2.9	1.0	2.5	11.0	1.0
2011-1	48.0	3.8	3.0	2.8	15.0	1.0
2011-2	48.0	6.3	5.0	5.6	31.0	1.0
2011-3	54.0	6.3	5.0	5.0	31.0	1.0
2011-4	52.0	7.5	5.0	5.9	23.0	1.0
2012-1	61.0	6.8	5.0	4.4	17.0	1.0
2012-2	57.0	3.9	3.0	2.8	15.0	1.0
2012-3	33.0	6.0	5.0	4.4	15.0	1.0
2012-4	52.0	5.8	5.0	4.7	21.0	1.0
2013-1	61.0	8.6	7.0	6.9	34.0	1.0
2013-2	59.0	8.3	7.0	4.7	19.0	1.0
2013-3	60.0	8.0	7.0	5.1	26.0	1.0
2013-4	46.0	5.0	4.0	3.8	15.0	1.0
Total	674	6.2	5.0	5.0	34	1

Table 5.21: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	4.0	3.0	1.0	4.0	9.0	1.0
2010-4	39.0	2.9	1.0	2.5	11.0	1.0
2011-1	48.0	3.8	3.0	2.8	15.0	1.0
2011-2	48.0	6.3	5.0	5.6	31.0	1.0
2011-3	54.0	6.3	5.0	5.0	31.0	1.0
2011-4	52.0	7.5	5.0	5.9	23.0	1.0
2012-1	60.0	6.7	5.0	4.4	17.0	1.0
2012-2	57.0	3.9	3.0	2.8	15.0	1.0
2012-3	31.0	6.2	5.0	4.4	15.0	1.0
2012-4	48.0	5.8	5.0	4.8	21.0	1.0
2013-1	51.0	9.2	8.0	7.3	34.0	1.0
2013-2	50.0	8.5	7.0	4.8	19.0	1.0
2013-3	58.0	8.1	7.5	5.1	26.0	1.0
2013-4	44.0	5.1	5.0	3.8	15.0	1.0
Total	644.0	6.2	5.0	5.1	34.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2012-1	1.0	11.0	11.0	-	11.0	11.0
2012-3	2.0	3.5	3.5	3.5	6.0	1.0
2012-4	4.0	4.8	5.0	3.0	8.0	1.0
2013-1	10.0	5.5	6.0	2.5	9.0	1.0
2013-2	9.0	7.2	7.0	4.7	15.0	2.0
2013-3	2.0	4.5	4.5	2.1	6.0	3.0
2013-4	2.0	1.0	1.0	0	1.0	1.0
Total	30.0	5.6	5.5	3.7	15.0	1.0

Table 5.22: Caption of Descriptive Statistic for Throughput feature and Throughput bug
(a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-2	117.0	3.9	3.0	2.7	12.0	1.0
2011-3	184.0	4.0	3.0	3.0	12.0	1.0
2011-4	204.0	4.3	4.0	2.9	12.0	1.0
2012-1	230.0	3.8	3.0	3.0	12.0	1.0
2012-2	117.0	4.5	3.0	3.2	12.0	1.0
2012-3	89.0	5.5	6.0	2.7	12.0	1.0
2012-4	134.0	4.8	5.0	3.2	12.0	1.0
2013-1	316.0	2.7	2.0	2.4	11.0	1.0
2013-2	281.0	2.7	1.0	2.5	12.0	1.0
2013-4	157.0	2.8	2.0	2.5	12.0	1.0
Total	1829	3.6	3.0	2.9	12	1

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-2	117.0	0	0	0	0	0
2011-3	184.0	0	0	0	0	0
2011-4	204.0	0	0	0	0	0
2012-1	230.0	0	0	0	0	0
2012-2	117.0	0	0	0	0	0
2012-3	89.0	0	0	0	0	0
2012-4	134.0	0	0	0	0	0
2013-1	316.0	0	0	0	0	0
2013-2	281.0	0	0	0	0	0
2013-3	157.0	0	0	0	0	0
Total	1829	.00	.00	.000	0	0

Table 5.23: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-2	116.0	0	0	0	0	0
2011-3	183.0	0	0	0	0	0
2011-4	204.0	0	0	0	0	0
2012-1	228.0	0	0	0	0	0
2012-2	116.0	0	0	0	0	0
2012-3	85.0	0	0	0	0	0
2012-4	114.0	0	0	0	0	0
2013-1	266.0	0	0	0	0	0
2013-2	254.0	0	0	0	0	0
2013-3	149.0	0	0	0	0	0
Total	1715.0	0	0	0	0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-2	1.0	0	0	-	0	0
2011-3	1.0	0	0	-	0	0
2012-1	2.0	0	0	0	0	0
2012-2	1.0	0	0	-	0	0
2012-3	4.0	0	0	0	0	0
2012-4	20.0	0	0	0	0	0
2013-1	50.0	0	0	0	0	0
2013-2	27.0	0	0	0	0	0
2013-3	8.0	0	0	0	0	0
Total	114.0	0	0	0	0	0

Table 5.24: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-1	1.0	1.0	1.0	.	1.0	1.0
2011-2	2.0	1.0	1.0	0	1.0	1.0
2011-3	1.0	1.0	1.0	.	1.0	1.0
2012-1	2.0	1.0	1.0	0	1.0	1.0
2012-2	1.0	1.0	1.0	.	1.0	1.0
2012-3	4.0	1.0	1.0	0	1.0	1.0
2012-4	12.0	1.8	1.5	0.9	3.0	1.0
2013-1	32.0	1.6	1.0	0.9	4.0	1.0
2013-2	19.0	1.5	1.0	0.6	3.0	1.0
2013-3	12.0	1.2	1.0	0.4	2.0	1.0
2013-4	2.0	1.0	1.0	0	1.0	1.0
Total	88	1.4	1	0.8	4	1

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2011-1	1	0	1	100	0
2011-2	2	0	2	100	0
2011-3	1	0	1	100	0
2012-1	2	0	2	100	0
2012-2	1	0	1	100	0
2012-3	4	0	4	100	0
2012-4	21	1	22	95.5	4.5
2013-1	49	2	51	96.1	3.9
2013-2	27	1	28	96.4	3.6
2013-3	14	0	14	100	0
2013-4	2	0	2	100	0
Mean	11.3	.4	11.6	98.9	1.1

Table 5.25: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter

(a) (b)

5.11 Team 5 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	116.0	1.7	0	3.7	15.0	0
2010-4	184.0	9.3	4.0	10.3	40.0	0
2011-1	180.0	3.9	0	5.9	20.0	0
2011-2	182.0	10.7	0	14.0	58.0	0
2011-3	184.0	13.4	4.0	14.9	45.0	0
2011-4	183.0	14.0	10.0	15.6	46.0	0
2012-1	182.0	22.2	12.0	23.3	65.0	0
2012-2	182.0	25.7	19.0	26.3	74.0	0
2012-3	184.0	9.8	2.0	12.6	50.0	0
2012-4	184.0	10.0	3.5	11.8	38.0	0
2013-1	180.0	62.4	4.5	91.5	270.0	0
2013-2	182.0	115.5	6.0	130.7	286.0	0
2013-3	184.0	10.6	5.5	11.8	43.0	0
2013-4	141.0	3.5	0	5.3	19.0	0
Total	3255	17.4	.00	48.2	286	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	12.0	3.6	3.0	2.2	7.0	1.0
2010-4	49.0	4.2	3.0	3.5	15.0	1.0
2011-1	34.0	3.6	3.0	2.7	12.0	1.0
2011-2	51.0	7.2	7.0	5.4	19.0	1.0
2011-3	63.0	5.6	4.0	5.0	24.0	1.0
2011-4	58.0	5.0	5.0	3.7	17.0	1.0
2012-1	59.0	6.2	5.0	4.5	17.0	1.0
2012-2	59.0	5.3	4.0	3.8	15.0	1.0
2012-3	49.0	6.4	5.0	5.0	27.0	1.0
2012-4	50.0	4.7	3.0	4.1	17.0	1.0
2013-1	60.0	15.8	9.5	15.1	59.0	1.0
2013-2	58.0	6.7	7.0	4.6	22.0	1.0
2013-3	53.0	4.6	3.0	4.3	17.0	1.0
2013-4	19.0	2.0	1.0	1.7	7.0	1.0
Total	674	6.3	5.0	6.9	59	1

Table 5.26: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	1.0	1.0	-	1.0	1.0
2010-4	8.0	2.9	1.0	3.2	10.0	1.0
2011-1	7.0	3.4	4.0	2.2	7.0	1.0
2011-2	19.0	9.1	7.0	5.1	17.0	1.0
2011-3	23.0	6.4	4.0	5.7	24.0	1.0
2011-4	11.0	3.7	3.0	2.7	8.0	1.0
2012-1	6.0	4.7	3.0	4.2	10.0	1.0
2012-2	8.0	4.4	3.0	4.6	15.0	1.0
2012-4	10.0	5.1	3.5	4.2	14.0	1.0
2013-1	4.0	16.8	16.5	11.9	30.0	4.0
2013-2	1.0	2.0	2.0	-	2.0	2.0
2013-3	4.0	2.2	2.0	1.3	4.0	1.0
2013-4	6.0	1.7	1.0	1.0	3.0	1.0
Total	108.0	5.7	4.0	5.5	30.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	11.0	3.8	3.0	2.1	7.0	1.0
2010-4	41.0	4.5	3.0	3.5	15.0	1.0
2011-1	27.0	3.6	3.0	2.8	12.0	1.0
2011-2	32.0	6.2	5.5	5.4	19.0	1.0
2011-3	40.0	5.2	4.5	4.6	22.0	1.0
2011-4	47.0	5.2	5.0	3.9	17.0	1.0
2012-1	53.0	6.4	6.0	4.6	17.0	1.0
2012-2	51.0	5.5	5.0	3.7	15.0	1.0
2012-3	49.0	6.4	5.0	5.0	27.0	1.0
2012-4	40.0	4.6	3.0	4.1	17.0	1.0
2013-1	56.0	15.7	9.0	15.4	59.0	1.0
2013-2	57.0	6.8	7.0	4.6	22.0	1.0
2013-3	49.0	4.8	3.0	4.5	17.0	1.0
2013-4	13.0	2.1	1.0	1.9	7.0	1.0
Total	566.0	6.4	5.0	7.0	59.0	1.0

Table 5.27: Caption of Descriptive Statistic for Throughput feature and Throughput bug (a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	16.0	15.1	9.0	16.8	58.0	1.0
2010-4	87.0	10.5	7.0	11.3	59.0	1.0
2011-1	33.0	6.5	5.0	4.3	17.0	1.0
2011-2	132.0	5.4	3.0	5.5	30.0	1.0
2011-3	169.0	8.0	4.0	9.5	56.0	1.0
2011-4	171.0	9.9	6.0	11.4	55.0	1.0
2012-1	181.0	11.6	6.0	13.6	66.0	1.0
2012-2	170.0	15.4	9.0	14.9	66.0	1.0
2012-3	167.0	5.9	5.0	5.5	37.0	1.0
2012-4	131.0	11.3	5.0	14.5	60.0	1.0
2013-1	292.0	7.6	4.0	9.8	65.0	1.0
2013-2	197.0	10.5	8.0	10.1	60.0	1.0
2013-3	139.0	8.7	5.0	10.5	59.0	1.0
2013-4	16.0	6.7	4.0	5.9	17.0	1.0
Total	1901	9.4	6.0	11.2	66	1

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	16.0	65.8	49.5	60.1	195.0	6.0
2010-4	87.0	51.6	31.0	54.8	205.0	1.0
2011-1	33.0	43.3	14.0	58.9	201.0	1.0
2011-2	132.0	41.9	18.0	52.9	207.0	1.0
2011-3	169.0	19.8	0	39.4	198.0	0
2011-4	171.0	19.8	0	40.6	207.0	0
2012-1	181.0	17.0	0	35.2	200.0	0
2012-2	170.0	24.7	2.0	44.1	211.0	0
2012-3	167.0	15.1	0	32.3	149.0	0
2012-4	131.0	13.3	0	28.2	167.0	0
2013-1	292.0	22.9	2.5	40.2	206.0	0
2013-2	197.0	21.6	1.0	40.8	209.0	0
2013-3	139.0	18.3	0	40.0	175.0	0
2013-4	16.0	19.4	2.0	31.9	115.0	0
Total	1901	23.5	2.0	42.3	211	0

Table 5.28: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	16.0	65.8	49.5	60.1	195.0	6.0
2010-4	76.0	44.8	25.0	47.2	176.0	1.0
2011-1	29.0	37.1	14.0	52.9	200.0	1.0
2011-2	121.0	37.1	16.0	48.0	207.0	1.0
2011-3	109.0	23.3	6.0	40.4	198.0	0
2011-4	146.0	14.9	0	34.5	207.0	0
2012-1	169.0	16.8	0	34.2	200.0	0
2012-2	152.0	19.4	1.0	37.5	211.0	0
2012-3	165.0	14.9	0	32.4	149.0	0
2012-4	119.0	12.2	0	26.9	167.0	0
2013-1	277.0	20.6	3.0	35.7	204.0	0
2013-2	189.0	21.1	0	40.8	209.0	0
2013-3	135.0	16.7	0	37.2	175.0	0
2013-4	16.0	19.4	2.0	31.9	115.0	0
Total	1719.0	21.4	2.0	38.9	211.0	0

Table 5.29: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs							(b) Descriptive Statistic - Bugs finished within quarter					
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	19.0	1.9	1.0	1.8	7.0	1.0	2010-3	24	13	37	64.9	35.1
2010-4	46.0	2.6	2.0	1.7	8.0	1.0	2010-4	108	13	121	89.3	10.7
2011-1	36.0	1.9	1.5	1.3	7.0	1.0	2011-1	57	12	69	82.6	17.4
2011-2	45.0	5.5	4.0	4.7	19.0	1.0	2011-2	202	47	249	81.1	18.9
2011-3	51.0	3.0	2.0	2.6	15.0	1.0	2011-3	119	33	152	78.3	21.7
2011-4	53.0	3.5	3.0	2.4	11.0	1.0	2011-4	147	37	184	79.9	20.1
2012-1	52.0	3.7	3.0	2.6	10.0	1.0	2012-1	149	45	194	76.8	23.2
2012-2	56.0	2.7	2.0	1.9	7.0	1.0	2012-2	116	35	151	76.8	23.2
2012-3	49.0	3.2	2.0	2.7	13.0	1.0	2012-3	133	25	158	84.2	15.8
2012-4	35.0	3.0	2.0	2.7	15.0	1.0	2012-4	99	5	104	95.2	4.8
2013-1	56.0	9.6	7.0	8.3	38.0	1.0	2013-1	502	37	539	93.1	6.9
2013-2	49.0	4.2	4.0	2.7	12.0	1.0	2013-2	183	21	204	89.7	10.3
2013-3	41.0	3.1	2.0	2.4	10.0	1.0	2013-3	123	5	128	96.1	3.9
2013-4	11.0	1.4	1.0	0.9	4.0	1.0	2013-4	15	0	15	100	0
Total	604	3.8	3.0	4.1	38	1	Mean	109.9	18.6	128.5	74.3	25.7

Table 5.30: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter
(a) (b)

5.12 Team 6 - Descriptive Statistics

(a) Descriptive Statistic -WIP							(b) Descriptive Statistic - Throughput						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	116.0	2.0	0	4.2	16.0	0	2010-3	17.0	4.5	3.0	3.1	10.0	1.0
2010-4	184.0	5.2	3.0	5.5	16.0	0	2010-4	51.0	3.3	3.0	2.6	10.0	1.0
2011-1	180.0	4.9	3.5	5.1	17.0	0	2011-1	45.0	2.3	1.0	1.9	8.0	1.0
2011-2	182.0	5.2	2.0	5.5	16.0	0	2011-2	37.0	2.8	3.0	1.9	8.0	1.0
2011-3	184.0	9.8	3.0	11.1	34.0	0	2011-3	49.0	2.7	1.0	2.1	7.0	1.0
2011-4	184.0	11.5	4.5	13.2	44.0	0	2011-4	40.0	3.2	3.0	2.3	9.0	1.0
2012-1	182.0	7.8	3.0	8.3	27.0	0	2012-1	54.0	3.3	3.0	2.4	9.0	1.0
2012-2	182.0	8.8	4.0	9.8	42.0	0	2012-2	51.0	5.2	3.0	5.8	37.0	1.0
2012-3	184.0	7.6	3.0	8.3	26.0	0	2012-3	45.0	4.0	3.0	3.6	21.0	1.0
2012-4	184.0	13.2	5.5	15.2	50.0	0	2012-4	63.0	6.0	5.0	4.5	23.0	1.0
2013-1	180.0	16.3	7.5	17.4	51.0	0	2013-1	59.0	6.3	5.0	4.2	16.0	1.0
2013-2	182.0	21.9	18.0	22.2	60.0	0	2013-2	61.0	4.4	3.0	3.7	15.0	1.0
2013-3	184.0	15.3	8.5	16.3	61.0	0	2013-3	61.0	4.7	4.0	3.6	15.0	1.0
2013-4	175.0	18.1	0	23.7	125.0	0	2013-4	58.0	9.1	5.0	23.8	181.0	1.0
Total	3290	8.1	.00	13.4	125	0	Total	691	4.58	3	181	1	7.8

Table 5.31: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	14.0	4.3	3.0	3.4	10.0	1.0
2010-4	47.0	3.5	3.0	2.7	10.0	1.0
2011-1	42.0	2.3	1.0	1.9	8.0	1.0
2011-2	33.0	2.7	3.0	1.9	8.0	1.0
2011-3	45.0	2.7	1.0	2.2	7.0	1.0
2011-4	38.0	3.2	3.0	2.4	9.0	1.0
2012-1	51.0	3.3	3.0	2.4	9.0	1.0
2012-2	51.0	5.2	3.0	5.8	37.0	1.0
2012-3	43.0	4.0	3.0	3.7	21.0	1.0
2012-4	55.0	6.4	5.0	4.5	23.0	1.0
2013-1	49.0	6.7	6.0	4.3	16.0	1.0
2013-2	47.0	5.0	3.0	3.8	15.0	1.0
2013-3	44.0	4.8	4.0	3.8	15.0	1.0
2013-4	50.0	10.1	5.0	25.5	181.0	1.0
Total	609.0	4.8	3.0	8.3	181.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	3.0	5.3	6.0	2.1	7.0	3.0
2010-4	4.0	1.0	1.0	0	1.0	1.0
2011-1	3.0	2.3	1.0	2.3	5.0	1.0
2011-3	4.0	3.5	3.0	2.5	7.0	1.0
2011-4	4.0	2.5	2.0	1.9	5.0	1.0
2012-1	2.0	3.5	3.5	0.7	4.0	3.0
2012-2	3.0	3.7	2.0	2.9	7.0	2.0
2012-3	2.0	3.0	3.0	1.4	4.0	2.0
2012-4	8.0	3.5	2.0	3.3	11.0	1.0
2013-1	10.0	4.4	4.5	2.7	9.0	1.0
2013-2	14.0	2.4	1.5	2.9	12.0	1.0
2013-3	17.0	4.2	4.0	3.2	13.0	1.0
2013-4	8.0	2.5	3.0	1.1	4.0	1.0
Total	82.0	3.3	2.5	2.6	13.0	1.0

Table 5.32: Caption of Descriptive Statistic for Throughput feature and Throughput bug
(a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	29.0	3.1	2.0	3.9	20.0	1.0
2010-4	46.0	5.7	3.0	6.9	28.0	1.0
2011-1	43.0	8.9	5.0	8.0	28.0	1.0
2011-2	26.0	8.0	6.0	7.4	28.0	1.0
2011-3	28.0	11.4	9.0	7.8	27.0	1.0
2011-4	63.0	9.1	8.0	6.9	25.0	1.0
2012-1	107.0	8.9	8.0	6.3	28.0	1.0
2012-2	145.0	8.2	7.0	5.7	26.0	1.0
2012-3	101.0	8.4	7.0	5.9	27.0	1.0
2012-4	211.0	7.2	6.0	6.1	28.0	1.0
2013-1	218.0	6.5	5.0	5.3	28.0	1.0
2013-2	128.0	6.3	6.0	4.8	24.0	1.0
2013-3	155.0	7.3	5.0	6.5	28.0	1.0
2013-4	233.0	4.7	2.0	5.5	25.0	1.0
Total	1533	7.0	6.0	6.2	28	1

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	29.0	154.2	30.0	273.2	1122.0	1.0
2010-4	46.0	240.6	92.0	315.2	1078.0	1.0
2011-1	43.0	134.9	31.0	252.2	1112.0	1.0
2011-2	26.0	263.1	191.0	293.3	1187.0	1.0
2011-3	28.0	226.2	154.5	231.2	952.0	4.0
2011-4	63.0	102.2	0	214.0	1002.0	0
2012-1	107.0	109.6	0	260.7	1234.0	0
2012-2	145.0	113.0	0	244.6	1197.0	0
2012-3	101.0	96.5	0	238.8	1225.0	0
2012-4	211.0	137.3	16.0	237.8	1144.0	0
2013-1	218.0	140.2	19.0	246.6	1210.0	0
2013-2	128.0	221.8	91.5	301.9	1174.0	0
2013-3	155.0	145.5	31.0	244.7	1164.0	0
2013-4	233.0	147.7	14.0	260.1	1199.0	0
Total	1533	146	17.0	257	1234	0

Table 5.33: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

2010-3	23.0	187.3	37.0	298.3	1122.0	1.0
2010-4	45.0	244.5	106.0	317.7	1078.0	1.0
2011-1	40.0	143.9	40.0	259.4	1112.0	1.0
2011-2	26.0	263.1	191.0	293.3	1187.0	1.0
2011-3	28.0	226.2	154.5	231.2	952.0	4.0
2011-4	61.0	105.6	0	216.7	1002.0	0
2012-1	99.0	118.1	0	269.4	1234.0	0
2012-2	145.0	113.0	0	244.6	1197.0	0
2012-3	89.0	107.0	0	252.4	1225.0	0
2012-4	171.0	157.8	25.0	253.0	1144.0	0
2013-1	148.0	144.6	19.5	239.6	1166.0	0
2013-2	94.0	247.4	99.0	324.2	1174.0	0
2013-3	109.0	172.9	50.0	272.3	1164.0	0
2013-4	190.0	156.3	16.0	269.2	1199.0	0
Total	1268.0	156.5	17.0	266.5	1234.0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	6.0	27.5	9.0	45.3	119.0	2.0
2010-4	1.0	68.0	68.0	.	68.0	68.0
2011-1	3.0	15.7	11.0	13.6	31.0	5.0
2011-2	2.0	0.5	0.5	0.7	1.0	0
2012-1	8.0	4.2	0	12.0	34.0	0
2012-3	12.0	18.8	0	39.5	114.0	0
2012-4	40.0	49.6	10.5	125.3	658.0	0
2013-1	70.0	130.8	18.5	262.3	1210.0	0
2013-2	34.0	151.0	65.0	218.2	947.0	0
2013-3	46.0	80.7	15.0	144.2	574.0	0
2013-4	43.0	109.6	8.0	214.4	1127.0	0
Total	265.0	95.2	12.0	197.8	1210.0	0

Table 5.34: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	10.0	1.5	1.5	0.5	2.0	1.0
2010-4	7.0	1.0	1.0	0	1.0	1.0
2011-1	5.0	1.4	1.0	0.9	3.0	1.0
2011-2	8.0	1.1	1.0	0.4	2.0	1.0
2011-3	4.0	1.2	1.0	0.5	2.0	1.0
2011-4	2.0	2.0	2.0	0	2.0	2.0
2012-1	7.0	1.1	1.0	0.4	2.0	1.0
2012-3	11.0	1.3	1.0	0.5	2.0	1.0
2012-4	24.0	1.8	1.5	1.0	4.0	1.0
2013-1	39.0	1.9	2.0	1.2	7.0	1.0
2013-2	33.0	1.5	1.0	0.7	3.0	1.0
2013-3	34.0	1.6	1.0	0.8	4.0	1.0
2013-4	27.0	1.8	2.0	0.9	4.0	1.0
Total	211	1.6	1.0	.868	7	1

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	14	1	15	93.3	6.7
2010-4	6	1	7	85.7	14.3
2011-1	6	1	7	85.7	14.3
2011-2	7	2	9	77.8	22.2
2011-3	3	2	5	60	40
2011-4	3	1	4	75	25
2012-1	8	0	8	100	0
2012-3	12	2	14	85.7	14.3
2012-4	41	2	43	95.3	4.7
2013-1	66	9	75	88	12
2013-2	43	7	50	86	14
2013-3	52	1	53	98.1	1.9
2013-4	49	0	49	100	0
Mean	23.9	2.2	26.1	87.0	13.0

Table 5.35: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter (a) (b)

5.13 Team 7 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	117.0	3.0	0	6.3	27.0	0
2010-4	184.0	11.5	6.0	12.8	48.0	0
2011-1	180.0	7.4	3.0	8.2	26.0	0
2011-2	182.0	6.4	1.5	7.2	22.0	0
2011-3	184.0	8.6	4.0	9.8	32.0	0
2011-4	184.0	8.7	2.0	9.8	30.0	0
2012-1	182.0	7.2	3.5	7.7	24.0	0
2012-2	181.0	8.3	10.0	9.3	34.0	0
2012-3	184.0	11.9	3.5	14.0	43.0	0
2012-4	159.0	0.7	0	2.1	11.0	0
2013-1	90.0	0	0	0	0	0
2013-2	91.0	0	0	0	0	0
2013-3	92.0	0	0	0	0	0
2013-4	90.0	0	0	0	0	0
Total	2907.0	4.6	0	8.5	48.0	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	11.0	3.9	2.0	4.0	14.0	1.0
2010-4	53.0	3.7	3.0	2.5	13.0	1.0
2011-1	54.0	3.2	3.0	2.3	13.0	1.0
2011-2	33.0	2.3	2.0	1.2	5.0	1.0
2011-3	36.0	2.0	2.0	1.1	4.0	1.0
2011-4	44.0	2.2	2.0	1.5	6.0	1.0
2012-1	37.0	2.0	1.0	1.5	7.0	1.0
2012-2	25.0	2.2	2.0	1.4	6.0	1.0
2012-3	32.0	3.4	3.0	2.5	13.0	1.0
2012-4	3.0	1.0	1.0	0	1.0	1.0
Total	328.0	2.7	2.0	2.1	14.0	1.0

Table 5.36: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	8.0	3.2	2.5	2.4	7.0	1.0
2010-4	37.0	4.0	3.0	2.7	13.0	1.0
2011-1	22.0	3.4	3.0	2.4	10.0	1.0
2011-2	10.0	2.7	2.5	1.7	5.0	1.0
2011-3	17.0	2.1	2.0	1.2	4.0	1.0
2011-4	26.0	2.0	1.5	1.3	5.0	1.0
2012-1	12.0	2.0	2.0	1.3	5.0	1.0
2012-2	9.0	2.2	2.0	0.8	3.0	1.0
2012-3	12.0	2.7	3.0	1.5	5.0	1.0
2012-4	3.0	1.0	1.0	0	1.0	1.0
Total	156.0	2.8	2.0	2.1	13.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	3.0	5.7	2.0	7.2	14.0	1.0
2010-4	16.0	2.9	2.5	2.0	9.0	1.0
2011-1	32.0	3.0	3.0	2.3	13.0	1.0
2011-2	23.0	2.1	2.0	0.9	4.0	1.0
2011-3	19.0	1.9	2.0	1.0	4.0	1.0
2011-4	18.0	2.4	2.0	1.7	6.0	1.0
2012-1	25.0	2.1	1.0	1.6	7.0	1.0
2012-2	16.0	2.2	2.0	1.6	6.0	1.0
2012-3	20.0	3.8	3.0	2.9	13.0	1.0
Total	172.0	2.6	2.0	2.1	14.0	1.0

Table 5.37: Caption of Descriptive Statistic for Throughput feature and Throughput bug

(a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	30.0	7.1	4.0	6.9	23.0	1.0
2010-4	126.0	6.6	3.0	7.9	35.0	1.0
2011-1	116.0	6.3	3.0	7.4	32.0	1.0
2011-2	51.0	10.4	8.0	8.7	34.0	1.0
2011-3	54.0	11.8	7.0	10.6	35.0	1.0
2011-4	85.0	9.0	6.0	8.8	35.0	1.0
2012-1	59.0	8.9	6.0	7.7	25.0	1.0
2012-2	30.0	14.4	8.0	13.1	34.0	1.0
2012-3	99.0	6.4	3.0	8.5	35.0	1.0
2012-4	2.0	1.5	1.5	0.7	2.0	1.0
Total	652.0	8.1	4.0	8.8	35.0	1.0

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	30.0	212.8	214.0	217.9	647.0	1.0
2010-4	126.0	118.1	47.5	152.7	700.0	1.0
2011-1	116.0	91.9	34.0	132.9	589.0	1.0
2011-2	51.0	99.3	21.0	171.1	726.0	0
2011-3	54.0	65.4	15.0	124.9	577.0	0
2011-4	85.0	105.2	20.0	168.1	675.0	0
2012-1	59.0	58.6	17.0	110.3	636.0	0
2012-2	30.0	64.0	33.5	91.6	379.0	0
2012-3	99.0	85.0	34.0	128.0	713.0	0
2012-4	2.0	44.0	44.0	1.4	45.0	43.0
Total	652.0	97.1	28.5	147.7	726.0	0

Table 5.38: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	13.0	335.7	258.0	215.1	647.0	5.0
2010-4	89.0	131.9	86.0	150.7	700.0	1.0
2011-1	24.0	148.2	87.5	160.2	523.0	3.0
2011-2	12.0	190.7	84.5	234.7	726.0	0
2011-3	15.0	165.1	115.0	195.4	577.0	0
2011-4	37.0	169.3	57.0	208.0	675.0	0
2012-1	15.0	121.5	45.0	177.7	636.0	0
2012-2	8.0	40.1	33.5	43.6	140.0	0
2012-3	20.0	94.0	56.0	110.7	344.0	0
2012-4	2.0	44.0	44.0	1.4	45.0	43.0
Total	235.0	148.1	78.0	175.9	726.0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	17.0	118.8	11.0	172.4	448.0	1.0
2010-4	37.0	84.9	17.0	154.4	662.0	1.0
2011-1	92.0	77.2	27.0	121.5	589.0	1.0
2011-2	39.0	71.2	18.0	138.3	719.0	0
2011-3	39.0	27.0	12.0	47.4	226.0	0
2011-4	48.0	55.7	12.0	107.9	480.0	0
2012-1	44.0	37.2	15.5	65.3	367.0	0
2012-2	22.0	72.6	30.5	103.3	379.0	0
2012-3	79.0	82.7	28.0	132.6	713.0	0
Total	417.0	68.4	18.0	120.2	719.0	0

Table 5.39: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	17.0	1.8	2.0	0.8	3.0	1.0
2010-4	28.0	1.7	1.5	0.9	4.0	1.0
2011-1	39.0	3.1	2.0	2.5	12.0	1.0
2011-2	26.0	2.0	2.0	1.3	5.0	1.0
2011-3	26.0	1.6	1.0	1.1	5.0	1.0
2011-4	24.0	2.2	2.0	1.5	7.0	1.0
2012-1	29.0	1.7	1.0	1.4	8.0	1.0
2012-2	18.0	2.7	2.0	2.6	11.0	1.0
2012-3	29.0	2.3	2.0	1.3	5.0	1.0
Total	240.0	2.1	2.0	1.7	12.0	1.0

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	20	10	30	66.7	33.3
2010-4	47	1	48	97.9	2.1
2011-1	119	2	121	98.3	1.7
2011-2	45	8	53	84.9	15.1
2011-3	35	6	41	85.4	14.6
2011-4	45	7	52	86.5	13.5
2012-1	46	2	48	95.8	4.2
2012-2	36	12	48	75	25
2012-3	67	0	67	100	0
Mean	38.3	4.3	42.7	65.9	34.1

Table 5.40: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter (a) (b)

5.14 Team 8 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	92.0	0	0	0	0	0
2010-4	111.0	0.1	0	0.2	1.0	0
2011-1	180.0	1.8	0	2.5	9.0	0
2011-2	182.0	2.9	0.5	3.2	11.0	0
2011-3	184.0	5.6	3.5	5.9	16.0	0
2011-4	184.0	3.9	1.5	4.6	14.0	0
2012-1	182.0	4.9	1.5	5.5	16.0	0
2012-2	182.0	2.1	0.5	3.9	12.0	0
2012-3	184.0	4.6	0.5	6.9	32.0	0
2012-4	184.0	2.8	0.5	4.3	18.0	0
2013-1	180.0	4.2	0.5	7.7	30.0	0
2013-2	182.0	9.8	1.0	12.6	55.0	0
2013-3	184.0	4.1	0	7.3	29.0	0
2013-4	167.0	1.9	0	2.8	11.0	0
Total	3185.0	2.8	0	5.7	55.0	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	2.0	1.0	1.0	0	1.0	1.0
2011-1	12.0	1.5	1.0	0.7	3.0	1.0
2011-2	21.0	1.2	1.0	0.5	3.0	1.0
2011-3	15.0	1.7	1.0	1.1	4.0	1.0
2011-4	19.0	1.3	1.0	0.6	3.0	1.0
2012-1	16.0	1.4	1.0	1.0	5.0	1.0
2012-2	3.0	1.0	1.0	0	1.0	1.0
2012-3	23.0	2.5	2.0	2.5	12.0	1.0
2012-4	10.0	1.7	2.0	0.7	3.0	1.0
2013-1	25.0	3.8	3.0	3.4	14.0	1.0
2013-2	20.0	3.5	2.5	2.9	9.0	1.0
2013-3	21.0	3.5	2.0	3.5	13.0	1.0
2013-4	4.0	3.5	3.0	2.6	7.0	1.0
Total	191.0	2.3	1.0	2.4	14.0	1.0

Table 5.41: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-1	2.0	1.0	1.0	0	1.0	1.0
2011-2	5.0	1.4	1.0	0.9	3.0	1.0
2011-3	1.0	1.0	1.0	-	1.0	1.0
2011-4	6.0	1.5	1.0	0.8	3.0	1.0
2012-1	6.0	1.8	1.0	1.6	5.0	1.0
2012-3	20.0	2.7	2.0	2.7	12.0	1.0
2012-4	6.0	1.8	2.0	0.8	3.0	1.0
2013-1	18.0	3.6	3.0	2.6	9.0	1.0
2013-2	12.0	5.0	5.0	2.8	9.0	1.0
2013-3	13.0	4.8	4.0	3.9	13.0	1.0
2013-4	3.0	4.3	4.0	2.5	7.0	2.0
Total	92.0	3.2	2.0	2.8	13.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	2.0	1.0	1.0	0	1.0	1.0
2011-1	10.0	1.6	1.5	0.7	3.0	1.0
2011-2	16.0	1.2	1.0	0.4	2.0	1.0
2011-3	14.0	1.8	1.0	1.1	4.0	1.0
2011-4	13.0	1.1	1.0	0.4	2.0	1.0
2012-1	10.0	1.1	1.0	0.3	2.0	1.0
2012-2	3.0	1.0	1.0	0	1.0	1.0
2012-3	3.0	1.0	1.0	0	1.0	1.0
2012-4	4.0	1.5	1.5	0.6	2.0	1.0
2013-1	7.0	4.1	1.0	5.0	14.0	1.0
2013-2	8.0	1.4	1.0	0.7	3.0	1.0
2013-3	8.0	1.2	1.0	0.5	2.0	1.0
2013-4	1.0	1.0	1.0	-	1.0	1.0
Total	99.0	1.5	1.0	1.6	14.0	1.0

Table 5.42: Caption of Descriptive Statistic for Throughput feature and Throughput bug (a) (b)

(a) Descriptive Statistic - Leadtime							(b) Descriptive Statistic - Churn						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	1.0	1.0	1.0	-	1.0	1.0	2010-4	1.0	3.0	3.0	-1.0	3.0	3.0
2011-1	3.0	3.0	3.0	2.0	5.0	1.0	2011-1	3.0	7.7	3.0	9.0	18.0	2.0
2011-2	9.0	17.4	12.0	18.7	48.0	1.0	2011-2	9.0	6.3	1.0	10.7	26.0	0
2011-3	22.0	12.1	8.0	11.9	46.0	1.0	2011-3	22.0	4.0	0	9.0	26.0	0
2011-4	12.0	17.8	16.5	16.5	43.0	1.0	2011-4	12.0	3.6	2.0	4.6	14.0	0
2012-1	14.0	17.4	11.0	16.3	38.0	1.0	2012-1	14.0	0.4	0	1.3	5.0	0
2012-2	1.0	1.0	1.0	-	1.0	1.0	2012-2	1.0	8.0	8.0	-1.0	8.0	8.0
2012-3	51.0	11.2	5.0	13.2	54.0	1.0	2012-3	51.0	0	0	0	0	0
2012-4	16.0	10.6	6.0	11.3	45.0	1.0	2012-4	16.0	0	0	0	0	0
2013-1	58.0	5.5	3.0	6.9	47.0	1.0	2013-1	58.0	1.2	0	4.4	22.0	0
2013-2	60.0	6.2	7.0	3.6	15.0	1.0	2013-2	60.0	0.0	0	0.1	1.0	0
2013-3	69.0	7.2	3.0	7.7	33.0	1.0	2013-3	69.0	0	0	0	0	0
2013-4	13.0	21.6	4.0	24.5	53.0	1.0	2013-4	13.0	0.6	0	2.2	8.0	0
Total	329.0	9.4	5.0	11.6	54.0	1.0	Total	329.0	0.9	0	4.0	26.0	0

Table 5.43: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature							(b) Descriptive Statistic - Churn bug						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2011-1	1.0	2.0	2.0	-	2.0	2.0	2010-4	1.0	3.0	3.0	-	3.0	3.0
2011-2	2.0	0	0	0	0	0	2011-1	2.0	10.5	10.5	10.6	18.0	3.0
2011-3	1.0	0	0	-	0	0	2011-2	7.0	8.1	2.0	11.6	26.0	0
2011-4	4.0	2.8	0.5	4.9	10.0	0	2011-3	21.0	4.2	0	9.2	26.0	0
2012-1	7.0	0	0	0	0	0	2011-4	8.0	4.0	3.0	4.8	14.0	0
2012-2	50.0	0	0	0	0	0	2012-1	7.0	0.9	0	1.9	5.0	0
2012-3	12.0	0	0	0	0	0	2012-2	1.0	8.0	8.0	-	8.0	8.0
2012-4	41.0	0	0	0	0	0	2012-3	1.0	0	0	-	0	0
2013-1	54.0	0	0	0	0	0	2012-4	4.0	0	0	0	0	0
2013-2	62.0	0	0	0	0	0	2013-1	17.0	4.2	0	7.4	22.0	0
2013-3	12.0	0	0	0	0	0	2013-2	6.0	0.2	0	0.4	1.0	0
Total	246.0	0.1	0	0.7	10.0	0	2013-3	7.0	0	0	0	0	0
							2013-4	1.0	8.0	8.0	-	8.0	8.0
							Total	83.0	3.6	0	7.2	26.0	0

Table 5.44: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	1.0	1.0	-1.0	1.0	1.0
2010-4	7.0	1.1	1.0	0.4	2.0	1.0
2011-1	9.0	1.2	1.0	0.4	2.0	1.0
2011-2	16.0	1.6	1.0	1.5	7.0	1.0
2011-3	15.0	1.3	1.0	0.6	3.0	1.0
2011-4	13.0	1.2	1.0	0.6	3.0	1.0
2012-1	9.0	1.2	1.0	0.4	2.0	1.0
2012-2	2.0	1.0	1.0	0	1.0	1.0
2012-3	4.0	1.2	1.0	0.5	2.0	1.0
2012-4	2.0	1.0	1.0	0	1.0	1.0
2013-1	10.0	3.3	2.5	2.8	10.0	1.0
2013-2	4.0	1.0	1.0	0	1.0	1.0
2013-3	4.0	1.5	1.5	0.6	2.0	1.0
2013-4	1.0	1.0	1.0	-1.0	1.0	1.0
Total	100.0	1.5	1.0	1.3	10.0	1.0

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	0	1	1	0	100
2010-4	2	6	8	25	75
2011-1	7	4	11	63.6	36.4
2011-2	16	10	26	61.5	38.5
2011-3	16	4	20	80	20
2011-4	15	1	16	93.8	6.3
2012-1	9	2	11	81.8	18.2
2012-2	2	0	2	100	0
2012-3	2	3	5	40	60
2012-4	1	1	2	50	50
2013-1	27	6	33	81.8	18.2
2013-2	3	1	4	75	25
2013-3	6	0	6	100	0
2013-4	1	0	1	100	0
Mean	6.7	2.6	9.3	59.5	40.5

Table 5.45: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter
(a) (b)

5.15 Team 9 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	92.0	0	0	0	0	0
2010-4	144.0	1.6	0	3.0	10.0	0
2011-1	180.0	5.9	2.5	6.5	19.0	0
2011-2	182.0	5.6	1.5	7.5	34.0	0
2011-3	184.0	6.4	3.0	7.0	24.0	0
2011-4	184.0	8.0	2.5	8.8	25.0	0
2012-1	182.0	8.1	4.0	8.8	30.0	0
2012-2	182.0	17.7	4.0	21.2	67.0	0
2012-3	184.0	16.3	7.5	17.3	51.0	0
2012-4	184.0	10.9	1.5	13.2	39.0	0
2013-1	180.0	10.7	3.5	12.1	38.0	0
2013-2	182.0	13.3	5.5	16.1	47.0	0
2013-3	184.0	8.0	3.0	9.1	35.0	0
2013-4	174.0	8.3	0	9.2	29.0	0
Total	3225.0	6.8	0	11.5	67.0	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	15.0	1.7	1.0	1.0	4.0	1.0
2011-1	30.0	1.8	1.0	1.0	4.0	1.0
2011-2	31.0	2.2	2.0	1.8	9.0	1.0
2011-3	27.0	1.6	1.0	0.9	5.0	1.0
2011-4	33.0	2.0	2.0	1.3	6.0	1.0
2012-1	41.0	2.4	2.0	1.4	5.0	1.0
2012-2	48.0	3.4	3.0	2.0	9.0	1.0
2012-3	53.0	3.3	3.0	2.2	9.0	1.0
2012-4	43.0	2.9	2.0	2.0	10.0	1.0
2013-1	51.0	2.9	2.0	1.8	9.0	1.0
2013-2	46.0	3.5	3.0	2.5	12.0	1.0
2013-3	50.0	2.6	2.0	1.8	9.0	1.0
2013-4	53.0	2.4	2.0	1.5	7.0	1.0
Total	521.0	2.6	2.0	1.9	12.0	1.0

Table 5.46: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	12.0	1.7	1.0	1.0	4.0	1.0
2011-1	13.0	1.6	1.0	0.8	3.0	1.0
2011-2	5.0	1.4	1.0	0.5	2.0	1.0
2011-3	9.0	1.2	1.0	0.4	2.0	1.0
2011-4	17.0	1.7	1.0	1.4	6.0	1.0
2012-1	11.0	1.6	1.0	0.8	3.0	1.0
2012-2	23.0	2.9	3.0	1.6	6.0	1.0
2012-3	12.0	3.8	3.5	2.8	9.0	1.0
2012-4	20.0	2.7	2.0	1.7	6.0	1.0
2013-1	15.0	2.1	2.0	1.0	4.0	1.0
2013-2	24.0	3.6	3.0	2.8	12.0	1.0
2013-3	22.0	2.5	2.0	1.7	7.0	1.0
2013-4	31.0	2.4	2.0	1.5	7.0	1.0
Total	214.0	2.4	2.0	1.8	12.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	3.0	2.0	2.0	1.0	3.0	1.0
2011-1	17.0	1.9	1.0	1.1	4.0	1.0
2011-2	26.0	2.4	2.0	1.9	9.0	1.0
2011-3	18.0	1.7	1.5	1.0	5.0	1.0
2011-4	16.0	2.3	2.0	1.1	5.0	1.0
2012-1	30.0	2.7	2.5	1.5	5.0	1.0
2012-2	25.0	3.8	3.0	2.3	9.0	1.0
2012-3	41.0	3.1	3.0	2.0	9.0	1.0
2012-4	23.0	3.0	3.0	2.3	10.0	1.0
2013-1	36.0	3.2	3.0	1.9	9.0	1.0
2013-2	22.0	3.4	3.0	2.2	8.0	1.0
2013-3	28.0	2.6	2.0	1.9	9.0	1.0
2013-4	22.0	2.5	2.0	1.6	7.0	1.0
Total	307.0	2.8	2.0	1.9	10.0	1.0

Table 5.47: Caption of Descriptive Statistic for Throughput feature and Throughput bug
(a) (b)

(a) Descriptive Statistic - Leadtime

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	16.0	9.9	8.0	9.2	31.0	2.0
2011-1	32.0	14.6	13.5	9.7	33.0	2.0
2011-2	41.0	11.5	10.0	6.2	29.0	2.0
2011-3	22.0	8.8	8.0	6.5	32.0	2.0
2011-4	34.0	8.3	5.5	7.1	30.0	2.0
2012-1	67.0	8.0	5.0	6.7	33.0	2.0
2012-2	99.0	7.5	6.0	7.0	32.0	2.0
2012-3	121.0	9.0	7.0	7.0	33.0	2.0
2012-4	65.0	11.7	9.0	8.7	28.0	2.0
2013-1	117.0	9.1	7.0	6.5	30.0	2.0
2013-2	117.0	9.9	8.0	6.7	28.0	2.0
2013-3	108.0	8.3	8.0	5.5	32.0	2.0
2013-4	84.0	8.9	7.0	6.3	29.0	2.0
Total	923.0	9.3	7.0	7.0	33.0	2.0

(b) Descriptive Statistic - Churn

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	16.0	77.9	54.5	102.2	396.0	4.0
2011-1	32.0	70.7	36.0	84.4	388.0	1.0
2011-2	41.0	53.9	21.0	82.4	460.0	1.0
2011-3	22.0	72.3	21.0	98.7	309.0	1.0
2011-4	34.0	129.8	71.0	135.7	450.0	2.0
2012-1	67.0	80.0	28.0	108.8	426.0	1.0
2012-2	99.0	60.9	25.0	87.5	465.0	1.0
2012-3	121.0	77.6	36.0	116.0	479.0	0
2012-4	65.0	55.7	26.0	79.7	367.0	0
2013-1	117.0	57.8	26.0	76.6	369.0	0
2013-2	117.0	117.2	60.0	134.2	454.0	0
2013-3	108.0	98.2	38.5	120.9	438.0	0
2013-4	84.0	99.6	43.5	126.5	460.0	0
Total	923.0	81.9	34.0	110.0	479.0	0

Table 5.48: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	11.0	88.5	50.0	120.5	396.0	5.0
2011-1	10.0	109.6	73.5	109.8	388.0	19.0
2011-2	3.0	127.7	162.0	67.4	171.0	50.0
2011-3	2.0	204.5	204.5	130.8	297.0	112.0
2011-4	14.0	229.9	232.5	135.6	450.0	61.0
2012-1	15.0	130.1	72.0	129.8	426.0	12.0
2012-2	29.0	119.5	74.0	126.0	465.0	9.0
2012-3	29.0	112.7	34.0	150.6	464.0	1.0
2012-4	24.0	100.3	45.5	110.4	367.0	0
2013-1	36.0	100.9	75.0	99.2	369.0	0
2013-2	51.0	160.6	108.0	155.0	454.0	0
2013-3	38.0	109.4	45.0	131.6	438.0	0
2013-4	33.0	192.0	186.0	142.3	460.0	0
Total	295.0	133.9	81.0	135.2	465.0	0

(b) Descriptive Statistic - Churn bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	5.0	54.6	59.0	43.5	120.0	4.0
2011-1	22.0	53.0	30.0	65.6	204.0	1.0
2011-2	38.0	48.1	18.0	81.3	460.0	1.0
2011-3	20.0	59.1	15.5	88.5	309.0	1.0
2011-4	20.0	59.7	35.5	82.8	299.0	2.0
2012-1	52.0	65.5	15.0	98.7	367.0	1.0
2012-2	70.0	36.7	17.0	49.0	256.0	1.0
2012-3	92.0	66.5	36.0	101.3	479.0	0
2012-4	41.0	29.5	8.0	35.6	110.0	0
2013-1	81.0	38.7	19.0	54.7	265.0	0
2013-2	66.0	83.7	36.0	105.2	353.0	0
2013-3	70.0	92.1	38.5	115.1	432.0	0
2013-4	51.0	39.8	19.0	65.7	428.0	0
Total	628.0	57.5	23.5	85.7	479.0	0

Table 5.49: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	2.0	1.0	1.0	0	1.0	1.0
2010-4	13.0	1.9	2.0	1.1	4.0	1.0
2011-1	18.0	1.8	1.0	0.9	3.0	1.0
2011-2	20.0	2.2	1.0	2.6	12.0	1.0
2011-3	14.0	1.6	1.5	0.6	3.0	1.0
2011-4	23.0	1.8	1.0	1.2	5.0	1.0
2012-1	33.0	2.1	2.0	1.5	7.0	1.0
2012-2	43.0	2.2	2.0	1.5	7.0	1.0
2012-3	40.0	2.7	2.0	1.9	9.0	1.0
2012-4	33.0	2.2	2.0	1.7	8.0	1.0
2013-1	34.0	2.2	1.0	1.7	8.0	1.0
2013-2	39.0	2.1	2.0	1.6	6.0	1.0
2013-3	38.0	2.1	1.5	1.5	7.0	1.0
2013-4	42.0	1.5	1.0	0.8	4.0	1.0
Total	403.0	2.1	1.0	1.5	12.0	1.0

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	0	2	2	0	100
2010-4	8	17	25	32	68
2011-1	19	13	32	59.4	40.6
2011-2	42	3	45	93.3	6.7
2011-3	11	11	22	50	50
2011-4	22	19	41	53.7	46.3
2012-1	52	18	70	74.3	25.7
2012-2	73	22	95	76.8	23.2
2012-3	100	7	107	93.5	6.5
2012-4	58	16	74	78.4	21.6
2013-1	73	3	76	96.1	3.9
2013-2	80	4	84	95.2	4.8
2013-3	79	1	80	98.8	1.3
2013-4	63	0	63	100	0
Mean	37.9	8.3	46.17	58.4	41.6

Table 5.50: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter (a) (b)

5.16 Team 10 - Descriptive Statistics

(a) Descriptive Statistic -WIP

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	116.0	0.6	0	1.2	5.0	0
2010-4	184.0	6.5	1.0	7.8	26.0	0
2011-1	179.0	4.1	0	6.0	22.0	0
2011-2	182.0	3.0	0	4.5	17.0	0
2011-3	184.0	0.4	0	0.7	3.0	0
2011-4	184.0	8.3	0.5	12.8	40.0	0
2012-1	182.0	12.3	8.5	12.6	36.0	0
2012-2	182.0	17.2	9.0	18.3	51.0	0
2012-3	184.0	6.3	2.0	8.8	44.0	0
2012-4	184.0	12.9	5.0	16.1	59.0	0
2013-1	180.0	8.2	2.5	13.1	49.0	0
2013-2	182.0	4.4	2.5	5.4	21.0	0
2013-3	184.0	6.2	1.5	7.5	29.0	0
2013-4	147.0	6.0	0	8.1	26.0	0
Total	3261.0	5.3	0	10.2	59.0	0

(b) Descriptive Statistic -Throughput

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	5.0	1.6	1.0	0.9	3.0	1.0
2010-4	44.0	2.2	2.0	1.6	7.0	1.0
2011-1	29.0	2.5	2.0	1.8	7.0	1.0
2011-2	21.0	1.9	1.0	1.4	6.0	1.0
2011-3	8.0	1.0	1.0	0	1.0	1.0
2011-4	34.0	2.6	2.0	1.7	7.0	1.0
2012-1	32.0	1.8	1.0	1.2	6.0	1.0
2012-2	52.0	2.7	2.0	1.6	7.0	1.0
2012-3	38.0	1.7	1.0	1.1	6.0	1.0
2012-4	47.0	2.7	2.0	3.0	16.0	1.0
2013-1	25.0	2.9	2.0	1.8	8.0	1.0
2013-2	10.0	1.9	1.5	1.1	4.0	1.0
2013-3	36.0	1.8	1.5	1.2	5.0	1.0
2013-4	23.0	1.8	1.0	1.2	5.0	1.0
Total	404.0	2.2	2.0	1.7	16.0	1.0

Table 5.51: Caption of Descriptive Statistic for WIP and Throughput (a) (b)

(a) Descriptive Statistic -Throughput feature

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	5.0	2.0	1.0	2.2	6.0	1.0
2011-1	2.0	2.0	2.0	0	2.0	2.0
2011-2	1.0	6.0	6.0	-	6.0	6.0
2011-3	3.0	1.0	1.0	0	1.0	1.0
2011-4	7.0	3.0	2.0	2.2	7.0	1.0
2012-1	7.0	1.1	1.0	0.4	2.0	1.0
2012-2	15.0	2.8	2.0	1.8	7.0	1.0
2012-3	6.0	1.0	1.0	0	1.0	1.0
2012-4	11.0	3.0	1.0	4.4	16.0	1.0
2013-1	2.0	2.5	2.5	0.7	3.0	2.0
2013-2	1.0	1.0	1.0	-	1.0	1.0
2013-3	4.0	1.2	1.0	0.5	2.0	1.0
2013-4	5.0	2.4	2.0	1.7	5.0	1.0
Total	69.0	2.3	1.0	2.3	16.0	1.0

(b) Descriptive Statistic -Throughput bug

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	5.0	1.6	1.0	0.9	3.0	1.0
2010-4	39.0	2.2	2.0	1.5	7.0	1.0
2011-1	27.0	2.6	2.0	1.9	7.0	1.0
2011-2	20.0	1.7	1.0	1.1	5.0	1.0
2011-3	5.0	1.0	1.0	0	1.0	1.0
2011-4	27.0	2.5	2.0	1.5	6.0	1.0
2012-1	25.0	1.9	1.0	1.3	6.0	1.0
2012-2	37.0	2.7	3.0	1.5	6.0	1.0
2012-3	32.0	1.8	1.0	1.2	6.0	1.0
2012-4	36.0	2.6	2.0	2.6	13.0	1.0
2013-1	23.0	2.9	2.0	1.9	8.0	1.0
2013-2	9.0	2.0	2.0	1.1	4.0	1.0
2013-3	32.0	1.9	2.0	1.2	5.0	1.0
2013-4	18.0	1.7	1.0	1.0	4.0	1.0
Total	335.0	2.2	2.0	1.6	13.0	1.0

Table 5.52: Caption of Descriptive Statistic for Throughput feature and Throughput bug
(a) (b)

(a) Descriptive Statistic - Leadtime							(b) Descriptive Statistic - Churn						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	1.0	18.0	18.0	-	18.0	18.0	2010-3	1.0	5.0	5.0	-	5.0	5.0
2010-4	50.0	10.8	7.5	9.7	42.0	2.0	2010-4	50.0	79.8	15.5	129.3	469.0	1.0
2011-1	39.0	7.7	6.0	6.0	28.0	2.0	2011-1	39.0	53.6	16.0	75.1	266.0	0
2011-2	24.0	12.1	7.0	12.7	44.0	2.0	2011-2	24.0	25.8	1.0	57.0	266.0	0
2011-3	7.0	9.0	6.0	7.2	21.0	3.0	2011-3	7.0	70.0	1.0	131.8	358.0	0
2011-4	62.0	12.6	11.0	9.8	43.0	2.0	2011-4	62.0	31.1	0	69.5	309.0	0
2012-1	32.0	17.4	15.5	11.1	42.0	2.0	2012-1	32.0	29.7	0	84.2	441.0	0
2012-2	111.0	16.8	15.0	10.8	42.0	2.0	2012-2	111.0	34.3	0	84.8	438.0	0
2012-3	43.0	14.2	7.0	12.0	44.0	2.0	2012-3	43.0	25.6	0	60.1	267.0	0
2012-4	97.0	14.1	12.0	10.9	42.0	2.0	2012-4	97.0	60.9	7.0	102.8	401.0	0
2013-1	52.0	9.8	8.0	8.1	37.0	2.0	2013-1	52.0	93.3	23.5	127.9	432.0	0
2013-2	20.0	18.2	15.5	11.8	44.0	2.0	2013-2	20.0	31.9	5.5	45.8	123.0	0
2013-3	44.0	13.3	10.0	11.9	44.0	2.0	2013-3	44.0	67.5	1.0	122.6	469.0	0
2013-4	27.0	12.4	10.0	8.9	33.0	2.0	2013-4	27.0	50.4	7.0	93.4	321.0	0
Total	609.0	13.4	10.0	10.6	44.0	2.0	Total	609.0	50.4	4.0	96.9	469.0	0

Table 5.53: Caption of Descriptive Statistic for Leadtime and Churn (a) (b)

(a) Descriptive Statistic - Churn feature							(b) Descriptive Statistic - Churn bug						
Quarter	N	Mean	Median	Std.Dev	Max	Min	Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-4	1.0	219.0	219.0	-	219.0	219.0	2010-3	1.0	5.0	5.0	-	5.0	5.0
2011-1	5.0	74.4	14.0	113.7	266.0	0	2010-4	49.0	76.9	15.0	129.0	469.0	1.0
2011-2	3.0	29.3	25.0	27.8	59.0	4.0	2011-1	34.0	50.6	17.0	69.7	241.0	0
2011-3	2.0	47.5	47.5	67.2	95.0	0	2011-2	21.0	25.2	1.0	60.5	266.0	0
2011-4	12.0	25.8	0	89.2	309.0	0	2011-3	5.0	79.0	1.0	156.7	358.0	0
2012-1	1.0	441.0	441.0	-	441.0	441.0	2011-4	50.0	32.4	1.0	64.9	263.0	0
2012-2	34.0	67.8	0	136.0	438.0	0	2012-1	31.0	16.4	0	38.8	195.0	0
2012-3	4.0	79.0	24.5	127.4	267.0	0	2012-2	77.0	19.5	0	40.6	189.0	0
2012-4	18.0	36.3	0	76.7	290.0	0	2012-3	39.0	20.1	0	48.8	253.0	0
2013-1	3.0	45.7	13.0	68.1	124.0	0	2012-4	79.0	66.5	8.0	107.5	401.0	0
2013-2	2.0	48.0	48.0	67.9	96.0	0	2013-1	49.0	96.3	27.0	130.5	432.0	0
2013-3	4.0	199.8	248.5	138.9	302.0	0	2013-2	18.0	30.1	5.5	45.1	123.0	0
2013-4	3.0	78.3	0	135.7	235.0	0	2013-3	40.0	54.3	0	114.5	469.0	0
Total	92.0	66.0	0	119.2	441.0	0	2013-4	24.0	46.9	7.5	90.2	321.0	0
							Total	517.0	47.7	5.0	92.3	469.0	0

Table 5.54: Caption of Descriptive Statistic for Churn feature and Churn bug (a) (b)

(a) Descriptive Statistic - Bugs

Quarter	N	Mean	Median	Std.Dev	Max	Min
2010-3	11.0	2.3	1.0	3.0	11.0	1.0
2010-4	32.0	2.6	2.0	1.7	8.0	1.0
2011-1	29.0	2.1	2.0	1.3	6.0	1.0
2011-2	24.0	1.3	1.0	0.7	4.0	1.0
2011-3	15.0	1.5	1.0	0.6	3.0	1.0
2011-4	37.0	2.5	2.0	2.1	9.0	1.0
2012-1	26.0	1.6	1.0	0.9	4.0	1.0
2012-2	34.0	2.0	2.0	1.5	8.0	1.0
2012-3	29.0	1.6	1.0	0.9	4.0	1.0
2012-4	35.0	2.0	1.0	1.5	7.0	1.0
2013-1	29.0	2.3	1.0	2.7	13.0	1.0
2013-2	16.0	1.5	1.0	0.6	3.0	1.0
2013-3	22.0	2.3	2.0	1.8	7.0	1.0
2013-4	19.0	1.4	1.0	0.6	3.0	1.0
Total	370.0	1.9	1.0	1.6	13.0	1.0

(b) Descriptive Statistic - Bugs finished within quarter

Quarter	Finished	Not finished	Total	Finished	Not finished
2010-3	8	17	25	32	68
2010-4	65	17	82	79.3	20.7
2011-1	49	11	60	81.7	18.3
2011-2	29	2	31	93.5	6.5
2011-3	9	13	22	40.9	59.1
2011-4	72	22	94	76.6	23.4
2012-1	23	19	42	54.8	45.2
2012-2	53	16	69	76.8	23.2
2012-3	30	15	45	66.7	33.3
2012-4	65	6	71	91.5	8.5
2013-1	62	6	68	91.2	8.8
2013-2	16	8	24	66.7	33.3
2013-3	45	5	50	90	10
2013-4	26	0	26	100	0
Mean	30.8	9.3	40.13	67.0	33.0

Table 5.55: Caption of Descriptive Statistic for Bugs and Bugs finished within quarter
(a) (b)

Chapter 6

Discussion

Part I

Notes

6.0.1 WIP correlation

As shown in table 6.1 bugs, throughput, churn, churn bugs and throughput bugs have a significant correlation with WIP. In table 6.2 is descriptive statistic for WIP shown. As shown by the N column all quarters besides 2010-3 give reasonable data since in each quarter has 90 days give or take.

Correlation	Bugs	Throughput	Churn	Churn Bugs	Throughput bugs
WIP	.753*	.637**	.738*	.708*	.800**

Table 6.1: Team one - Correlation - WIP

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
360	2010-3	39	5.82	5	2.55	15	1
	2010-4	92	1.7	2	0.70	4	1
	2011-1	90	4.37	2	6.87	31	1
	2011-2	91	14.25	5	14.497	52	3
	2011-3	92	2.4	3	0.97	4	1
	2011-4	92	14.26	4	22.718	97	1
	2012-1	91	13.35	5	16.62	67	4
	2012-2	91	15.35	3	27.145	94	2
	2012-3	92	16.97	13.5	8.719	52	5
	2012-4	90	9.07	2	17.073	74	1
Total		860	9.99	4	16.04	97	1

Table 6.2: Descriptive statistics for WIP - Team one

6.0.1.1 WIP and throughput correlation

Both throughput and throughput bugs have a significant correlation relationship with WIP. This is inconsistent with Kanban philosophy and what the research says about WIP limit. All the research and the principles of Kanban suggest lowering WIP in order to get high throughput. In team one's case the higher the WIP the higher the throughput.

In table 6.2 the mean column shows indication that team one could have experimented with WIP limit the first five quarters. But in the last quarter, the WIP limit decreased. In the mean column in table 6.3 if one take a look at the quarter 2012-4, the throughput are second highest, the same quarter as WIP decreased. This link could have several reasons. One could be that they experimented with WIP and found out after the quarter 2012-3 that they needed to lower the WIP in order to increase the throughput, which it did. Or maybe team one didn't care about setting a WIP limit as stated in section 2.4.2 by Shinkle.

The throughput bugs variable and throughput variable both have a significant correlation with WIP, which make sense since throughput bugs are a subset of throughput. But throughput feature on the other hand has a -0.441 correlation with WIP. As shown in table 6.6. The correlation number -0.441 is not a significant correlation, but it's on the opposite side level of throughput and throughput feature although it's also a subset of throughput. This also goes in the literatures favor, because when WIP is low, more throughput feature is produced. Maybe this could have something to do with the relationship bugs and feature? Features are often more challenging and more fun to work with than bugs. One could also argue that maybe it's was significant fewer tasks labeled as bug than feature or vice versa, but as shown in table 6.6 that's not the case.

Team	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
360	2010-3	5	2.6	2	1.34	4	1
	2011-1	7	5.71	6	4.03	13	1
	2011-2	26	3.38	3	1.96	8	1
	2011-3	1	1	1	.	1	1
	2011-4	15	6.13	4	4.984	18	2
	2012-1	16	6.56	6.5	3.59	14	1
	2012-2	13	10.15	10	5.742	23	1
	2012-3	22	3.41	2	3.33	12	1
	2012-4	14	8.14	7	6.5	21	1
	Total	119	5.55	4	4.694	23	1

Table 6.3: Descriptive statistic for throughput - team one

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	14.00	3.07	2.00	3.47	14.00	1.00
2010-4	71.00	2.73	2.00	2.05	11.00	1.00
2011-1	67.00	2.55	2.00	1.96	13.00	1.00
2011-2	38.00	1.97	2.00	1.03	4.00	1.00
2011-3	43.00	1.65	1.00	0.92	4.00	1.00
2011-4	53.00	1.83	1.00	1.31	6.00	1.00
2012-1	40.00	1.90	1.00	1.46	7.00	1.00
2012-2	27.00	2.07	2.00	1.36	6.00	1.00
2012-3	40.00	2.70	2.00	2.43	13.00	1.00
2012-4	3.00	1.00	1.00	0	1.00	1.00
Total	396.00	2.26	2.00	1.82	14.00	1.00

Table 6.4: Descriptive statistic for throughput feature - team one

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
360	2010-3	9	1.11	1	0.33	2	1
	2010-4	3	1	1	0	1	1
	2011-2	26	5	3	4.45	17	1
	2011-3	1	1	1	.	1	1
	2011-4	24	6.79	4	6.35	20	1
	2012-1	18	4.83	4	3.20	11	1
	2012-2	19	7.84	9	5.843	17	1
	2012-3	6	2.67	1.5	2.25	6	1
	2012-4	11	3.18	3	1.77	7	1
	Total	117	5.08	3	4.88	20	1

Table 6.5: Descriptive statistic for throughput bugs - team one

Number of features	Number of bugs
660	594

Table 6.6: Number of throughput divided into bugs and feature - Team one

6.0.1.2 WIP and bugs correlation

Only looking at WIP and throughput correlation without taking other factors into account may give bias.

Bugs and churn have also have a significant correlation with WIP. A positive bug correlation could help favor what said about WIP and throughput in literature. Since both WIP and throughput increases and decreases at the same time, the same goes for bug. This could mean that when WIP is high, and throughput is high team one also has a lot of bugs in their code. This means that they don't do their job well, and this could be because they have a lot of task switching due to high WIP limit. As stated in table 6.7 one can see that almost each bug that was reported was finished in the same quarter. The outlier could be the bugs reported just before the quarter end. Worth noticing in quarter 2011-1 there was no bugs recorded. This conclude the statement that the WIP limit is set too high. 0.467

Quarter	Percent of bugs finished in the same quarter as reported
2010-3	100%
2010-4	100%
2011-1	0%
2011-2	97.74%
2011-3	20%
2011-4	97.5%
2012-1	96.51%
2012-2	98.63%
2012-3	82.35%
2012-4	100%

Table 6.7: The percent number of bugs finished in the same quarter as reported - Team one

6.0.1.3 WIP and churn correlation

Churn and WIP have a positive correlation. This means that when team one has more tasks in progress the tasks requires more coding. This is odd and could be a coincidence. Churn and churn bugs have also here as with throughput a close correlation with WIP. But churn feature has a correlation of 0.467

As shown in table 6.8 and the column 'maximum' the biggest feature task requires almost 60 times more code editing than the biggest bug task as showed in table 6.9. In the same table the column std. deviation shows way more proliferation for churn feature. This indicates that the numbers in churn feature are way more spread, which again indicates that it's random of how big the tasks are. In the churn bugs the std. deviation is much lower than in the feature table. This could explain why churn feature not has a positive correlation as churn and churn bugs. Both median and mean favors that churn feature requires more work than churn bugs

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	5	434	106	808.67	1879	30
2011-1	7	0	0	0	0	0
2011-2	26	1199.54	139	4695.424	24139	0
2011-3	1	0	0	.	0	0
2011-4	15	516.4	148	1063.92	3946	0
2012-1	16	5775.25	410	20692.09	83317	0
2012-2	14	7569.14	522.5	24655.70	93108	0
2012-3	23	6.74	0	25.44	118	0
2012-4	16	408	47	1056.23	4275	0
Total	123	2001.29	65	11380.06	93108	0

Table 6.8: Descriptive Statistic for churn feature - Team one

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	7	57.14	22	73.91	193	4
2010-4	2	30	30	41.012	59	1
2011-2	21	386.33	177	431.94	1604	2
2011-3	1	2	2	.	2	2
2011-4	19	306.89	148	437.13	1557	12
2012-1	16	312.81	160	307.73	1035	4
2012-2	13	296.92	169	292.29	1019	18
2012-3	7	37.71	9	56.494	126	0
2012-4	8	118.75	84	103.09	292	3
Total	94	260.48	135	346.25	1604	0

Table 6.9: Descriptive Statistic for churn bugs - Team one

6.0.2 Throughput

In table 6.10 is correlation for throughput for team one stated. Throughput has a positive correlation to bugs, WIP, churn, churn bugs, churn feature, throughput bugs and churn average. In table 6.11 is descriptive statistic for throughput shown. The range from 2011-2 to 2012-4 is the most valuable quarters based on the number of tasks finished if one excludes the quarter 2011-3.

Correlation	Bugs	WIP	Churn	Churn Bugs	Churn feature	Throughput bugs	Churn Average
Throughput	.945**	.816**	.962**	.776**	.736*	.940**	.638*

Table 6.10: Team one - Correlation - Throughput

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	5	2.6	2	1.34	4	1
2011-1	7	5.71	6	4.03	13	1
2011-2	26	3.38	3	1.96	8	1
2011-3	1	1	1	.	1	1
2011-4	15	6.13	4	4.984	18	2
2012-1	16	6.56	6.5	3.59	14	1
2012-2	13	10.15	10	5.742	23	1
2012-3	22	3.41	2	3.33	12	1
2012-4	14	8.14	7	6.5	21	1
Total	119	5.55	4	4.694	23	1

Table 6.11: Descriptive statistic for throughput - team one

6.0.2.1 Throughput and bugs correlation

The correlation between throughput and bugs is 0.945, which is significantly high. The quarters from 2011-2 to 2012-4 minus 2011-3 is also the most valid in bugs. The correlation between bugs and throughput means that when team one has high throughput of tasks they also produce more bugs. This correlation can be used to favor the literature of WIP as stated in section 6.0.1. Since team one produces more bugs when they finished feature or bugs could be an indicator that they may have a too high WIP limit so they cannot focus enough on each task.

Throughput and bugs also have the same relationship as WIP and bugs, because throughput and throughput bugs has a significant correlation to both, but throughput

feature not. Throughput feature have correlation of -0.340 compared to -0.441 in WIP. What this means is that when team one has high throughput of tasks, they mostly produces tasks labeled as bug. This could be because the feature tasks are more comprehensive than the tasks labeled as bug so the lead time is longer for feature tasks than bug tasks. Or it could due the reason that when there is an upcoming release, all the bugs are pushed through the Kanban system.

In table 6.12 the hypotheses that feature tasks is more comprehensive is verified. Four out of the six valid quarters churn feature is significant higher. In table 6.13 one can see that throughput bug's lead time is higher than throughput feature in four out of six quarters. The lead time cannot be counted, since bugs usually have longer lead time than feature, because feature usually has higher priority than bugs.

Quarter	Churn feature	Churn bug
2010-3	0	29.3
2010-4	0	20
2011-1	0	0
2011-2	1199.54	59.14
2011-3	0	2
2011-4	516.4	76.66
2012-1	5775.25	1009.9
2012-2	7569.14	707.46
2012-3	6.74	15.68
2012-4	408	168.28

Table 6.12: team one - Average churn for feature and bugs - Bugs

Quarter	Throughput feature	Throughput bug
2010-3	23	51.33
2011-1	38.85	6
2011-2	19.73	25.46
2011-3	1	5
2011-4	30.6	36.38
2012-1	20.37	45.56
2012-2	35.30	55.89
2012-3	30.72	17.67
2012-4	30.57	8.82
Total	27.30	35.09

Table 6.13: Lead time for throughput feature and bugs per quarter

6.0.2.2 Throughput and churn correlation

Churn, churn bugs, churn feature and the average of churn all have a positive correlation with throughput which mean that when throughput is high, the tasks requires more coding. From table 6.14 in the number column one can see that in each quarter there is a lot of tasks. Although from the median column one can see that in 6 of the valid quarters, three of them have a median of 0, which gives and indicator that in these three quarter there is probably minority of tasks which has high churn. So the correlation between throughput and churn may not be valid.

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	11.00	17.00	11.00	18.94	60.00	0
2011-1	73.00	0	0	0	0	0
2011-2	136.00	14.40	3.00	21.51	83.00	0
2011-3	48.00	1.67	0	7.71	50.00	0
2011-4	156.00	14.81	6.50	19.91	86.00	0
2012-1	157.00	9.47	0	19.55	86.00	0
2012-2	238.00	10.11	0	18.50	83.00	0
2012-3	53.00	3.02	0	9.62	53.00	0
2012-4	26.00	21.42	14.50	20.55	67.00	1.00
Total	902.00	10.14	0	18.55	86.00	0

Table 6.14: Descriptive statistic for churn - team one

6.0.3 Bugs

Correlation	Throughput	WIP	Churn	Churn Bugs	Churn feature	TP bugs
Bugs	.945**	.753*	.992**	.813**	.730*	.984**

Table 6.15: Team two - Correlation - Throughput

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

It's hard to find any correlation between lead time, WIP and throughput. In quarter three in 2011, lead time, WIP and throughput dropped to their lowest point. This was due to the summer vacation. In quarter two of 2011 and two of 2012 bugs dropped but both Throughput and WIP increased.

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
360	2010-3	7	1.29	1	0.48	2	1
	2010-4	4	1	1	0	1	1
	2011-2	32	4.16	3.5	3.63	14	1
	2011-3	5	1	1	0	1	1
	2011-4	26	6.15	4	5.80	22	1
	2012-1	21	4.09	4	2.7	11	1
	2012-2	17	8.59	9	5.59	19	1
	2012-3	7	2.43	2	1.512	5	1
	2012-4	11	3	3	2	6	1
	Total	131	4.53	3	4.44 t	22	1

Table 6.16: 360 - Descriptive statistic - Bugs

6.1 Team 2

6.1.1 WIP

For team two there is no significant correlation between WIP or any of the variables that have been measured. In table 6.18 one can see that every quarter beside 2010 is a valid quarter based on the number of dates in quarter. An excerpt of the correlation data is shown in table 6.17. As in section 6.0.1 for team one, throughput is fairly high, not significant high as for team one, but fairly high. For team two the correlation between bugs and WIP is quite low, so the conclusion stated in section 6.0.1 may not suit team two.

In table 6.19 the correlation for throughput for team two is shown. Here one can see that throughput and bugs have a significant correlation. That means when WIP increases, throughput increases and when throughput increases the number of bugs reported increases. Which could mean that the WIP limit is to high.

	Throughput	Bugs	Churn	Leadtime
WIP	0.341	0.278	-0.446	0.096

Table 6.17: Team two - Correlation - WIP

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Frontend	2010-3	24	9.28	10	6.43	23	1
	2010-4	92	13.92	13	3.931	25	5
	2011-1	90	15.3	15.5	3.94	23	7
	2011-2	91	23.51	24	4.19	37	13
	2011-3	92	20.13	20	5.43	32	9
	2011-4	92	21.33	21	6.92	34	7
	2012-1	91	22.91	22	6.63	40	11
	2012-2	91	21.93	21	3.36	32	17
	2012-3	92	25.93	27	4.92	36	19
	2012-4	67	19.18	15	9.66	41	9
Total		822	20.18	20	6.93	41	1

Table 6.18: Descriptive statistic - WIP - Team two

Correlation	Bugs	Throughput feature	Bugs finished in the same quarter
Throughput	.885**	.669*	.640*

Table 6.19: Team one - Correlation - Throughput

* Correlation is significant at the 0.05 level (2-tailed).

** Correlation is significant at the 0.01 level (2-tailed).

6.1.2 Lead time

Correlation	Churn Bugs	Churn union	Precent bugs fininshed	Churn Average
Leadtime	-.771**	.704*	-.697*	.766**

Table 6.20: Team one - Correlation - Leadtime_union

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	14.00	3.07	2.00	3.47	14.00	1.00
2010-4	71.00	2.73	2.00	2.05	11.00	1.00
2011-1	67.00	2.55	2.00	1.96	13.00	1.00
2011-2	38.00	1.97	2.00	1.03	4.00	1.00
2011-3	43.00	1.65	1.00	0.92	4.00	1.00
2011-4	53.00	1.83	1.00	1.31	6.00	1.00
2012-1	40.00	1.90	1.00	1.46	7.00	1.00
2012-2	27.00	2.07	2.00	1.36	6.00	1.00
2012-3	40.00	2.70	2.00	2.43	13.00	1.00
2012-4	3.00	1.00	1.00	0	1.00	1.00
Total	396.00	2.26	2.00	1.82	14.00	1.00

Table 6.21: Descriptive statistic - Throughput - Team two

6.1.3 Analyzed data per quarter

In figure 6.1 the average WIP, Throughput, Lead time and Bugs per quarter for team 360 are shown. As stated in section 2.4.2, to get best possible throughput the WIP limit should be low. According to the figure 6.1, when WIP is high, throughput is also high and when WIP is low, throughput also low. This team data is contrary to what is suggested from Kanban and research.

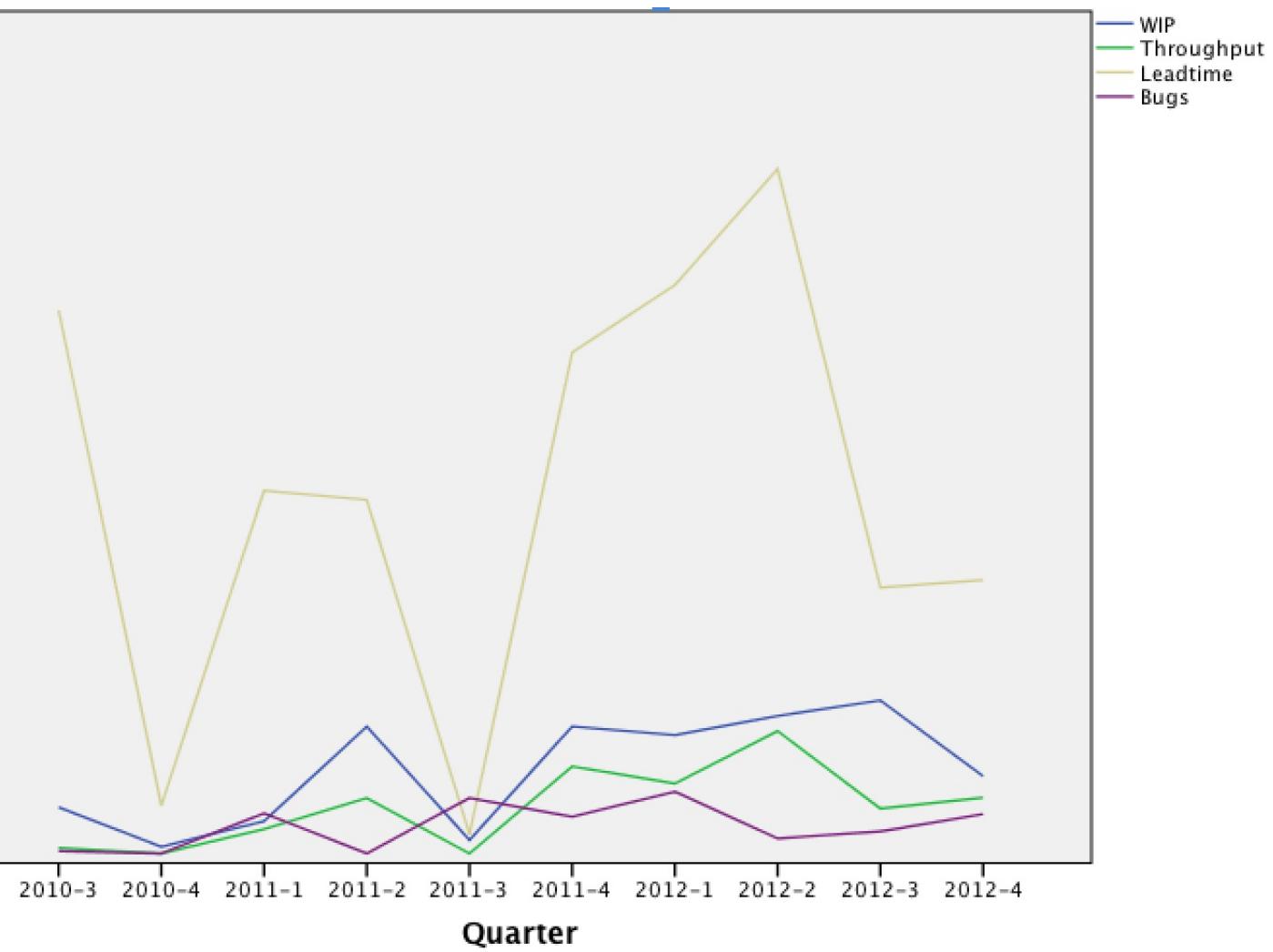


Figure 6.1: WIP, Throughput, Lead time and Bugs for 360 per quarter

In figure 6.2 the average WIP, Throughput, Lead time and Bugs per quarter for team Frontend are shown

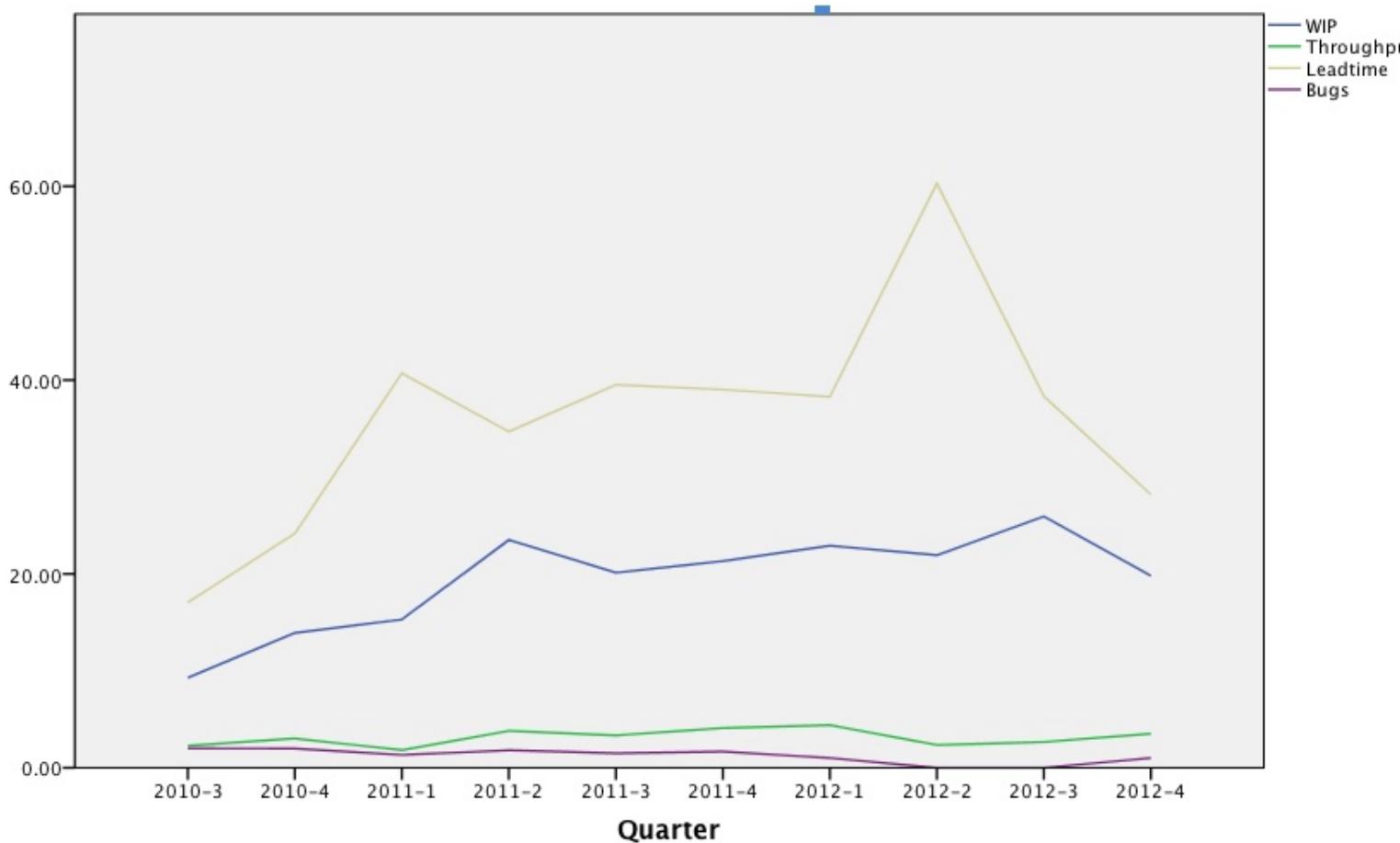


Figure 6.2: WIP, Throughput, Lead time and Bugs for Frontend per quarter

In figure 6.3 the average WIP, Throughput, Lead time and Bugs per quarter for team Krypton are shown

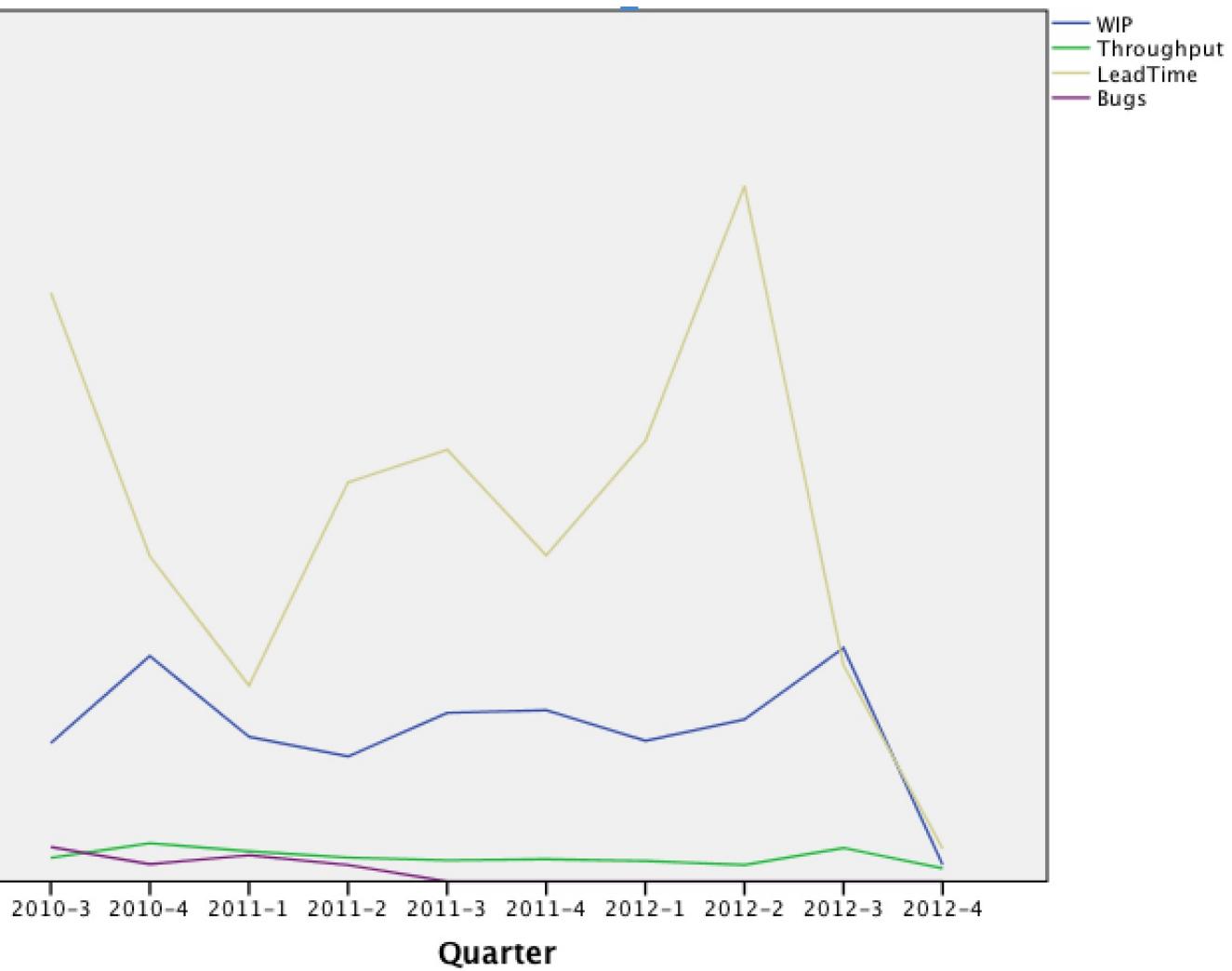
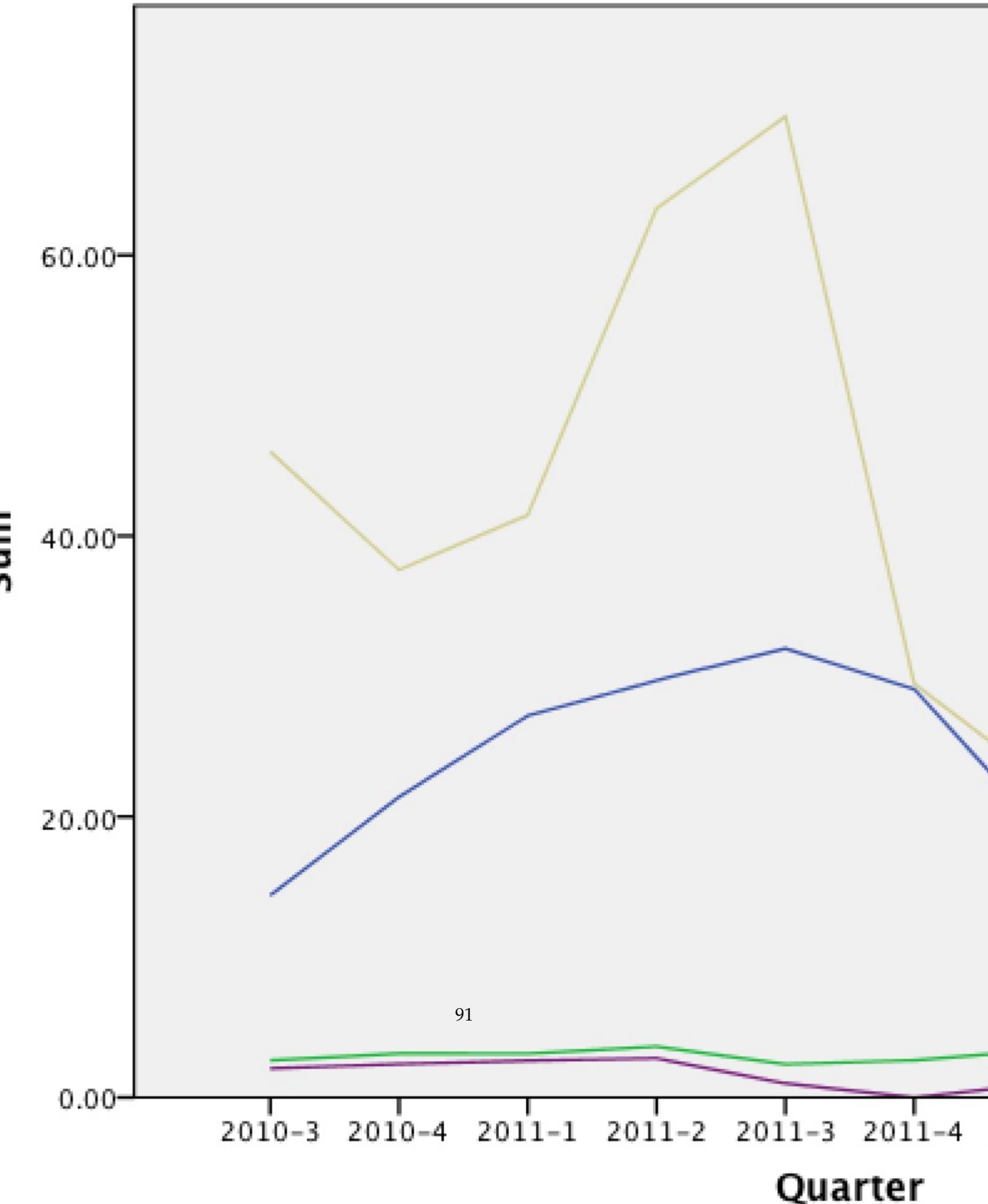


Figure 6.3: WIP, Throughput, Lead time and Bugs for Krypton per quarter

In figure 6.4 the average WIP, Throughput, Lead time and Bugs per quarter for team Neon are shown



Team	Quarter		Churn	Leadtime
360	2010-3	N	11	11
		Mean	17	3.55
		Median	11	3
		Std. Deviation	18.93	2.50
		Maximum	60	8
		Minimum	0	1
	2010-4	N	3	3
		Mean	0.67	1.67
		Median	1	2
		Std. Deviation	0.57	0.57
		Maximum	1	2
		Minimum	0	1
		N	136	136
	2011-2	Mean	14.4	2.7
		Median	3	2
		Std. Deviation	21.51	1.85
		Maximum	83	8
		Minimum	0	1
		N	48	48
	2011-3	Mean	1.67	3.06
		Median	0	2.5
		Std. Deviation	7.71	2.13
		Maximum	50	8
		Minimum	0	1
		N	156	156
	2011-4	Mean	14.81	2.25
		Median	6.5	2
		Std. Deviation	19.90	1.53
		Maximum	86	8
		Minimum	0	1
		N	157	157
	2012-1	Mean	9.47	2.68
		Median	0	2
		Std. Deviation	19.54	1.758
		Maximum	86	8
		Minimum	0	1
		N	238	238
	2012-2	Mean	10.11	2.78
		Median	0	2
		Std. Deviation	18.50	1.597
		Maximum	83	8
		Minimum	0	1
		N	53	53
	2012-3	Mean	3.02	1.68
		Median	0	1
		Std. Deviation	9.61	1.18
		Maximum	53	7
		Minimum	0	1
		N	26	26
	2012-4	Mean	21.42	2.08
		Median	14.5	2
		Std. Deviation	20.54	1.16
		Maximum	67	5
		Minimum	1	1
		N	902	902
	Total	Mean	10.14	2.7
		Median	0	2
		Std. Deviation	18.55	1.798
		Maximum	86	8
		Minimum	0	1

Table 6.23: Descriptive statistic - Lead-time and churn - 360

Team	Quarter		Leadtime	Churn
Frontend	2010-3	N	58	58
		Mean	7.43	127.93
		Median	6	53.5
		Std. Deviation	5.567	187.011
		Maximum	22	1072
		Minimum	1	0
	2010-4	N	130	130
		Mean	10.32	158.72
		Median	4	14
		Std. Deviation	15.30	444.805
		Maximum	78	4308
		Minimum	1	0
	2011-1	N	95	95
		Mean	28.01	566.73
		Median	11	47
		Std. Deviation	52.183	3696.125
		Maximum	434	35917
		Minimum	1	0
	2011-2	N	132	132
		Mean	12.17	496.8
		Median	5	19
		Std. Deviation	23.548	3240.172
		Maximum	184	35956
		Minimum	1	0
	2011-3	N	146	146
		Mean	10.66	174.07
		Median	6	14
		Std. Deviation	12.577	655.578
		Maximum	79	5650
		Minimum	1	0
	2011-4	N	167	167
		Mean	9.85	110.98
		Median	7	3
		Std. Deviation	10.9	480.32
		Maximum	62	5672
		Minimum	1	0
	2012-1	N	188	188
		Mean	13.9	118.64
		Median	8	5.5
		Std. Deviation	21.92	568.03
		Maximum	150	7565
		Minimum	1	0
	2012-2	N	77	77
		Mean	22.53	849.42
		Median	17	15
		Std. Deviation	25.52	3575.50
		Maximum	106	27170
		Minimum	1	0
	2012-3	N	93	93
		Mean	13.76	458.92
		Median	8	25
		Std. Deviation	18.023	1272.32
		Maximum	107	8600
		Minimum	1	0
	2012-4	N	82	82
		Mean	8.8007	428.67
		Median	4	54
		Std. Deviation	14.978	1178.471
		Maximum	83	9368
		Minimum	1	0
	Total	N	1168	1168
		Mean	13.35	305.62
		Median	7	15
		Std. Deviation	23.15	1883.16
		Maximum	434	35956
		Minimum	1	0

Table 6.25: Descriptive statistic - Lead-time and churn - Frontend

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Frontend	2010-3	14	2.79	2	2.91	12	1
	2010-4	39	2	1	1.53	8	1
	2011-1	20	1.85	1	1.226	5	1
	2011-2	29	2.86	2	3.21	16	1
	2011-3	37	2.41	2	1.93	10	1
	2011-4	35	2.89	1	5.02	30	1
	2012-1	39	3.56	2	3.90	23	1
	2012-2	31	1.81	1	1.4	7	1
	2012-3	24	2.54	2	1.79	7	1
	2012-4	14	2.86	2	1.79	7	1
Total		282	2.56	2	2.895	30	1

Table 6.26: Frontend - Descriptive statistic - Bugs

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Frontend	2010-3	8	1.25	1	0.46	2	1
	2010-4	35	1.63	1	0.877	4	1
	2011-1	32	1.53	1	0.67	3	1
	2011-2	31	1.74	2	0.89	4	1
	2011-3	31	1.97	2	1.25	6	1
	2011-4	28	1.93	1	1.94	11	1
	2012-1	22	2.18	1	2.01	7	1
	2012-2	23	1.48	1	1.123	6	1
	2012-3	21	1.48	1	0.873	4	1
	2012-4	19	2.47	2	1.679	8	1
Total		250	1.78	1	1.294	11	1

Table 6.27: Frontend - Descriptive statistic - TP feature

Team	Quarter		Leadtime	Churn
Krypton	2010-3	N	46	46
		Mean	7.89	159.38
		Median	3.5	26.5
		Std. Deviation	11.651	206.584
		Maximum	71	647
		Minimum	1	0
	2010-4	N	139	139
		Mean	7.38	97.7
		Median	3	28
		Std. Deviation	12.88	145.84
		Maximum	85	700
		Minimum	1	0
	2011-1	N	153	153
		Mean	5.83	71.38
		Median	2	17
		Std. Deviation	7.383	130.40
		Maximum	32	726
		Minimum	1	0
	2011-2	N	51	51
		Mean	14.37	110.45
		Median	9	31
		Std. Deviation	16.09	165.053
		Maximum	90	719
		Minimum	1	0
	2011-3	N	49	49
		Mean	13.71	119.43
		Median	8	27
		Std. Deviation	15.97	159.39
		Maximum	88	604
		Minimum	1	1
	2011-4	N	66	66
		Mean	10.5	112.36
		Median	6	36
		Std. Deviation	11.975	164.935
		Maximum	57	675
		Minimum	1	1
	2012-1	N	45	45
		Mean	23.73	99.09
		Median	8	23
		Std. Deviation	40.47	149.02
		Maximum	180	636
		Minimum	1	1
	2012-2	N	45	45
		Mean	23	109.07
		Median	7	47
		Std. Deviation	32.08	131.58
		Maximum	135	536
		Minimum	1	1
	2012-3	N	74	74
		Mean	6.92	82.39
		Median	3	37
		Std. Deviation	9.26	122.637
		Maximum	35	713
		Minimum	1	1
	2012-4	N	2	2
		Mean	1.5	44
		Median	1.5	44
		Std. Deviation	0.70	1.41
		Maximum	2	45
		Minimum	1	43
	Total	N	683	683
		Mean	10.55	98.6
		Median	4	29
		Std. Deviation	18.1	149.01
		Maximum	180	726
		Minimum	1	0

Table 6.30: Descriptive statistic - Lead-time and churn - Krypton

Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
2010-3	14.00	3.07	2.00	3.47	14.00	1.00
2010-4	71.00	2.73	2.00	2.05	11.00	1.00
2011-1	67.00	2.55	2.00	1.96	13.00	1.00
2011-2	38.00	1.97	2.00	1.03	4.00	1.00
2011-3	43.00	1.65	1.00	0.92	4.00	1.00
2011-4	53.00	1.83	1.00	1.31	6.00	1.00
2012-1	40.00	1.90	1.00	1.46	7.00	1.00
2012-2	27.00	2.07	2.00	1.36	6.00	1.00
2012-3	40.00	2.70	2.00	2.43	13.00	1.00
2012-4	3.00	1.00	1.00	0	1.00	1.00
Total	396.00	2.26	2.00	1.82	14.00	1.00

Table 6.31: Frontend - Descriptive statistic - Throughput

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Krypton	2010-3	25	14.12	14	5.093	27	9
	2010-4	92	23	23.5	7.819	48	12
	2011-1	90	14.76	13.5	5	26	6
	2011-2	91	12.75	12	4.64	22	3
	2011-3	92	17.2	16	6.476	32	8
	2011-4	92	17.47	17	6.32	30	4
	2012-1	91	14.35	15	3.911	24	7
	2012-2	91	16.53	14	6.03	34	10
	2012-3	92	23.83	20	10.387	43	7
	2012-4	67	1.69	0	3.016	11	0
Total		823	16.11	15	8.43	48	0

Table 6.32: Krypton - Descriptive statistic WIP

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Krypton	2010-3	17	1.76	2	0.83	3	1
	2010-4	28	1.71	1.5	0.85	4	1
	2011-1	39	3.1	2	2.51	12	1
	2011-2	26	2.04	2	1.28	5	1
	2011-3	25	1.64	1	1.14	5	1
	2011-4	26	2	2	1.35	7	1
	2012-1	26	1.85	1	1.617	9	1
	2012-2	19	2.52	2	2.48	11	1
	2012-3	31	2.16	2	1.44	6	1
	Total	241	2.12	2	1.69	12	1
	2010-3	20	2.65	2	3.54	17	1

Table 6.33: Krypton - Descriptive statistic - Bugs

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Krypton	2010-3	10	2.20	1.5	1.619	5	1
	2010-4	48	2.79	2	2.278	11	1
	2011-1	30	1.7	1	0.95	4	1
	2011-2	17	1.65	1	1.115	4	1
	2011-3	20	1.45	1	0.82	4	1
	2011-4	31	1.48	1	0.89	4	1
	2012-1	14	1.71	1	1.139	5	1
	2012-2	11	1.73	1	0.90	3	1
	2012-3	17	1.53	1	0.8	4	1
	2012-4	3	1	1	0	1	1
Total		201	1.9	1	1.48	11	1

Table 6.34: Krypton - Descriptive statistic - TP feature

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Krypton	2010-3	6	3.5	2.5	3.2090	9	1
	2010-4	34	1.76	2	0.89	4	1
	2011-1	45	2.67	2	2.20	13	1
	2011-2	28	1.68	2	0.77	4	1
	2011-3	26	1.62	1	0.752	3	1
	2011-4	27	1.89	1	1.45	6	1
	2012-1	28	1.86	1	1.407	7	1
	2012-2	18	2.06	2	1.552	6	1
	2012-3	28	2.93	3	2.19	9	1
	Total	240	2.13	2	1.66	13	1

Table 6.35: Krypton - Descriptive statistic - TP bugs

Team	Quarter		Churn	Leadtime
Neon	2010-3	N	62	62
		Mean	25.27	7.69
		Median	9	6
		Std. Deviation	39.448	6.88
		Maximum	193	24
		Minimum	0	1
	2010-4	N	125	125
		Mean	33.13	6.66
		Median	15	5
		Std. Deviation	47.46	6.01
		Maximum	214	27
		Minimum	0	1
	2011-1	N	132	132
		Mean	23.81	6.53
		Median	9	5.5
		Std. Deviation	41.22	5.43
		Maximum	301	27
		Minimum	0	1
	2011-2	N	134	134
		Mean	36.1	10.71
		Median	7	6
		Std. Deviation	59.067	35.19
		Maximum	271	408
		Minimum	0	1
	2011-3	N	99	99
		Mean	40.86	8.34
		Median	17	6
		Std. Deviation	50.60	6.61
		Maximum	239	27
		Minimum	1	1
	2011-4	N	98	98
		Mean	63.31	8.5
		Median	38	7
		Std. Deviation	74.35	6.84
		Maximum	294	27
		Minimum	1	1
	2012-1	N	110	110
		Mean	56.75	5.16
		Median	21	4
		Std. Deviation	72.52	4.46
		Maximum	296	22
		Minimum	1	1
	2012-2	N	81	81
		Mean	44.95	5.05
		Median	22	4
		Std. Deviation	54.23	4.43
		Maximum	300	23
		Minimum	1	1
	2012-3	N	174	174
		Mean	66.12	5.78
		Median	33.5	4
		Std. Deviation	81.02	4.35
		Maximum	299	21
		Minimum	1	1
	2012-4	N	120	120
		Mean	75.93000000000007	5.3
		Median	32	4.5
		Std. Deviation	86.49	4.
		Maximum	303	17
		Minimum	1	1
	Total	N	1155	1155
		Mean	47.76	7
		Median	18	5
		Std. Deviation	66.37	13.112
		Maximum	303	408
		Minimum	0	1

Table 6.37: Descriptive statistic - Lead-time and churn - Neon

Team	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Neon	2010-3	10	2	1.5	1.333	5	1
	2010-4	34	1.68	1	1.173	6	1
	2011-1	31	1.71	1	1.03	5	1
	2011-2	6	1.17	1	0.4	2	1
	2011-3	9	1	1	0	1	1
	2011-4	1	1	1	.	1	1
	Total	91	1.62	1	1.06	6	1

Table 6.38: Neon - Descriptive statistic - Throughput

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Neon	2010-3	25	14.4	15	6.19	23	6
	2010-4	92	21.41	20	7.17	41	9
	2011-1	90	27.2	27.5	4.90	38	17
	2011-2	91	29.71	27	14.42	62	12
	2011-3	92	31.98	30	8.90	55	18
	2011-4	92	29.09	29	10.09	45	12
	2012-1	91	19.03	18	4.63	30	7
	2012-2	91	24.34	25	10.282	50	5
	2012-3	92	23.24	21.5	7.89	44	10
	2012-4	92	19.48	22	10.99	45	1
	2013-1	11	2.18	2	0.60	3	1
	Total	859	24.45	24	10.54	62	1

Table 6.39: Neon - Descriptive statistic - WIP

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Neon	2010-4	40	2.45	2	1.694	9	1
	2011-1	47	2.43	2	1.80	8	1
	2011-2	42	3.57	3	2.52	13	1
	2011-3	45	2.47	2	2.33	13	1
	2011-4	48	2.48	2	1.59	7	1
	2012-1	36	3.25	3	3.03	16	1
	2012-2	36	2.19	2	1.48	8	1
	2012-3	44	3.43	2	2.55	10	1
	2012-4	33	3.12	2	2.63	10	1
	2013-1	1	1	1	.	1	1
	Total	404	2.75	2	2.306	17	1

Table 6.40: Neon - Descriptive statistic - Bugs

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Neon	2010-3	10	2	1.5	1.333	5	1
	2010-4	34	1.68	1	1.173	6	1
	2011-1	31	1.71	1	1.038	5	1
	2011-2	11	1.27	1	0.64	3	1
	2011-3	34	1.53	1	0.99	5	1
	2011-4	16	1.5	1	0.73	3	1
	2012-1	23	1.3	1	0.70	4	1
	2012-2	32	1.63	1	0.83	4	1
	2012-3	32	2.02	2	0.93	4	1
	2012-4	40	1.93	2	1.11	6	1
Total		263	1.69	1	0.997	6	1

Table 6.41: Neon - Descriptive statistic - TP feature

TeamName	Quarter	N	Mean	Median	Std. Deviation	Maximum	Minimum
Neon	2010-3	10	2	1.5	1.333	5	1
	2010-4	34	1.68	1	1.173	6	1
	2011-1	31	1.71	1	1.038	5	1
	2011-2	11	1.27	1	0.64	3	1
	2011-3	34	1.53	1	0.99	5	1
	2011-4	16	1.5	1	0.73	3	1
	2012-1	23	1.3	1	0.70	4	1
	2012-2	32	1.63	1	0.83	4	1
	2012-3	32	2.02	2	0.93	4	1
	2012-4	40	1.93	2	1.11	6	1
Total		263	1.69	1	0.997	6	1

Table 6.42: Neon - Descriptive statistic - TP bugs

Chapter 7

Discussion

Chapter 8

Conclusion

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