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16.660 / 16.853 / ESD.62J Introduction to Lean Six Sigma Methods  
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# Variability Simulation

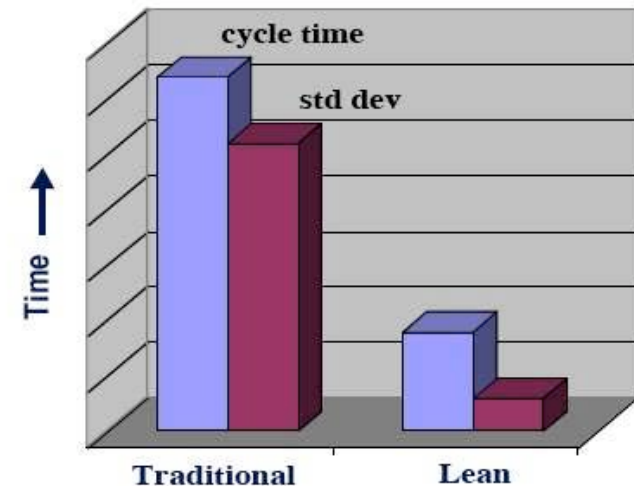
# Learning Objectives

**At the end of this module, you will be able to:**

- **Discuss the impact that variability has on process performance**

# The Curse of Variation

- **Variation impacts**
  - **Cycle time (previous module)**
  - **Design for Manufacturing (Quality Module)**
  - **Process capability (Quality Module)**
- **Reducing process variation is a key step in implementing lean practices**
- **Reducing variation is the heart of Six Sigma (Quality module)**



Pre and post lean engineering drawing release data for major aircraft program

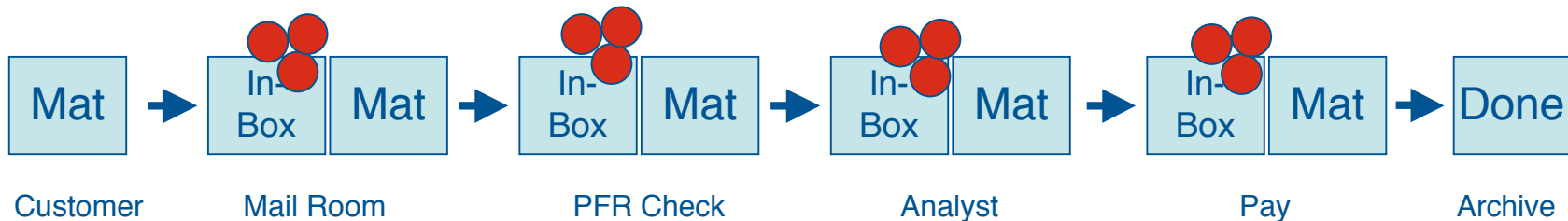
Courtesy of Lockheed Martin. Used with permission.  
 Source: "Lean PD Efforts for F-22", LAI Product Development Winter Workshop, January 27, 2000.

# Learning About Variation

- **In this module, we will gain understanding about impact of variation through two simulations**
  - **Dice game will give experiential encounter**
  - **Computer simulation will rapidly show impact of process changes**
- **We'll discover a useful relationship between WIP, cycle time and takt time**
- **The quality module will introduce tools for variation and its impact on process capability**

# Dice Game Setup

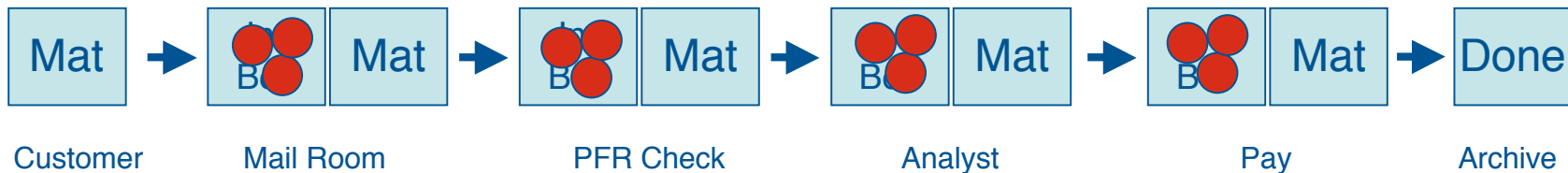
- 5-step system
- One die and record sheet (from packet) at each station
- 3 chips per in-box



- **System processes chips**  
(each time period, move a quantity of chips from one person to the next)
- **Roll of dice determines how many chips are moved**
- **CANT PASS MORE CHIPS THAN YOU HAVE IN YOUR “IN” BIN AT THE BEGINNING OF THE ROUND**
- **Let’s work through a couple cycles**

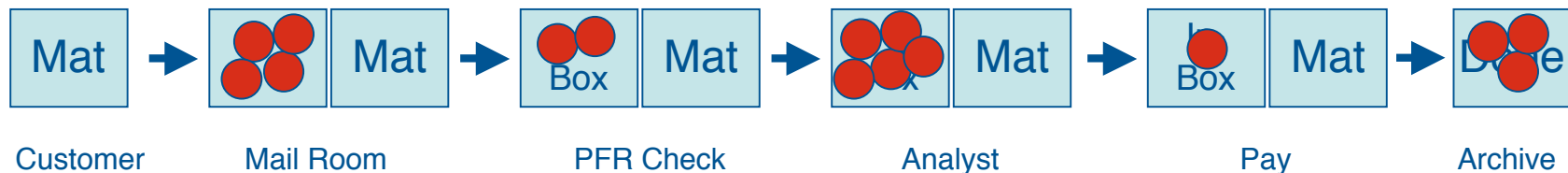
# Example - Day1

Start of Day



Customer rolls a '3', passes 3 chips to Mail Room  
 Mail Room rolls a '2', passes 2 chips to PFR Check  
 PFR Check rolls a '5', passes 3 chips to Analyst  
 Analyst rolls a '1', passes 1 chip to Pay  
 Pay rolls a '6', passes 3 chips to the Archive

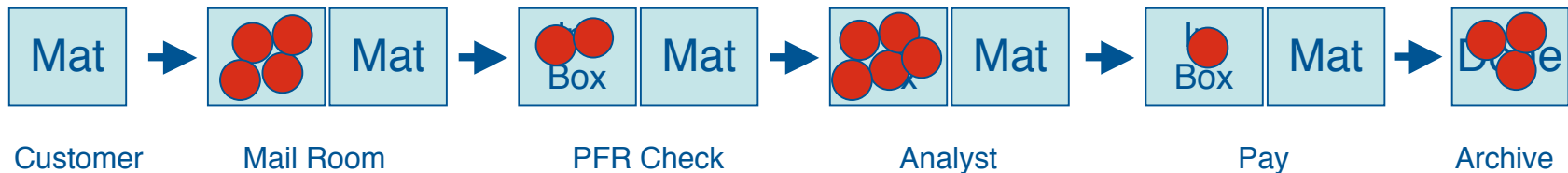
- **All these actions happen simultaneously**
- **Don't wait for other players to pass chips before you pick up yours**



End of Day

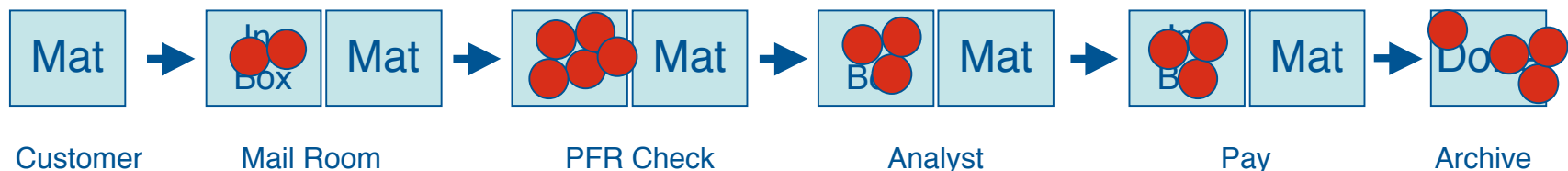
# Example - Day2

## Start of Day



Customer rolls a '2', passes 2 chips to Mail Room  
 Mail Room rolls a '5', passes 4 chips to PFR Check  
 PFR Check rolls a '1', passes 1 chips to Analyst  
 Analyst rolls a '3', passes 3 chip to Pay  
 Pay rolls a '4', passes 1 chips to the Archive

- **All these actions happen simultaneously**
- **Don't wait for other players to pass chips before you pick up yours**



## End of Day



- Each round, record jobs you did and Work In Progress (WIP) level on your sheet
- From our example, Analyst on Day 1 had 3 WIP, completed 1, and ended up with 5
- On Day 2, Analyst completed 3 and ended up with WIP of 3

DAY	Jobs Completed	WIP
		3
1	1	5
2	3	3
3		
4		
5		
6		
7		
8		
9		
10		
11		
12		
13		
14		
15		
16		
17		
18		
19		
20		
A Total Jobs Completed		
B Jobs per day = $A/20$		
C Utilization = $B/3.5$		
D Ending WIP		
E Estimate flow time = $D/B$		

# Customer Worksheet

- Customer records new jobs
- Get Jobs Completed from Archive-Done
- Record total WIP by adding up all WIP or using mathematical shortcut below

Shortcut

Total WIP (new) =  
 Total WIP (previous)  
 + New Jobs  
 - Jobs Complete

DAY	New Jobs Put Into the Process	Jobs Completed (by Pay)	Total WIP
			12
1	3	3	12
2	2	1	13
3			
4			
5			
6			
7			
8			
9			
10			
11			
12			
13			
14			
15			
16			
17			
18			
19			
20			

A Total s	A1	A2	A3
B Jobs per day =	=A2/20		
C Utilization =	=B/3.5		
D Average WIP=	=A3/20		
E Average flow time =	=D/B		

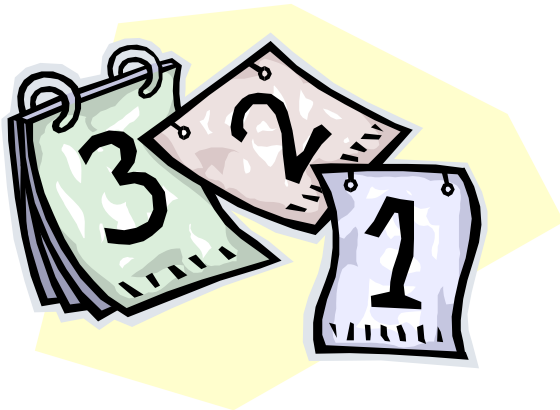
## What *Should* happen?

- Consider 20 time periods, or “days”
- Each day, 3.5 chips are processed on average (the average of 1, 2, 3, 4, 5, 6)
- Intuitively, what *should* be the average throughput? Over 10 days? Over 20?
- What is the ideal flow (elapsed) time?

**Let's find out what really happens...**

Ready, Set, Play!

# Day 20



# Accounting

- **After 20 days, each person should add the appropriate columns to carry out the calculations at the bottom of their tally sheet**
- **The customer does slightly more complex calculations (use calculator if needed)**

**Let's tabulate some results**

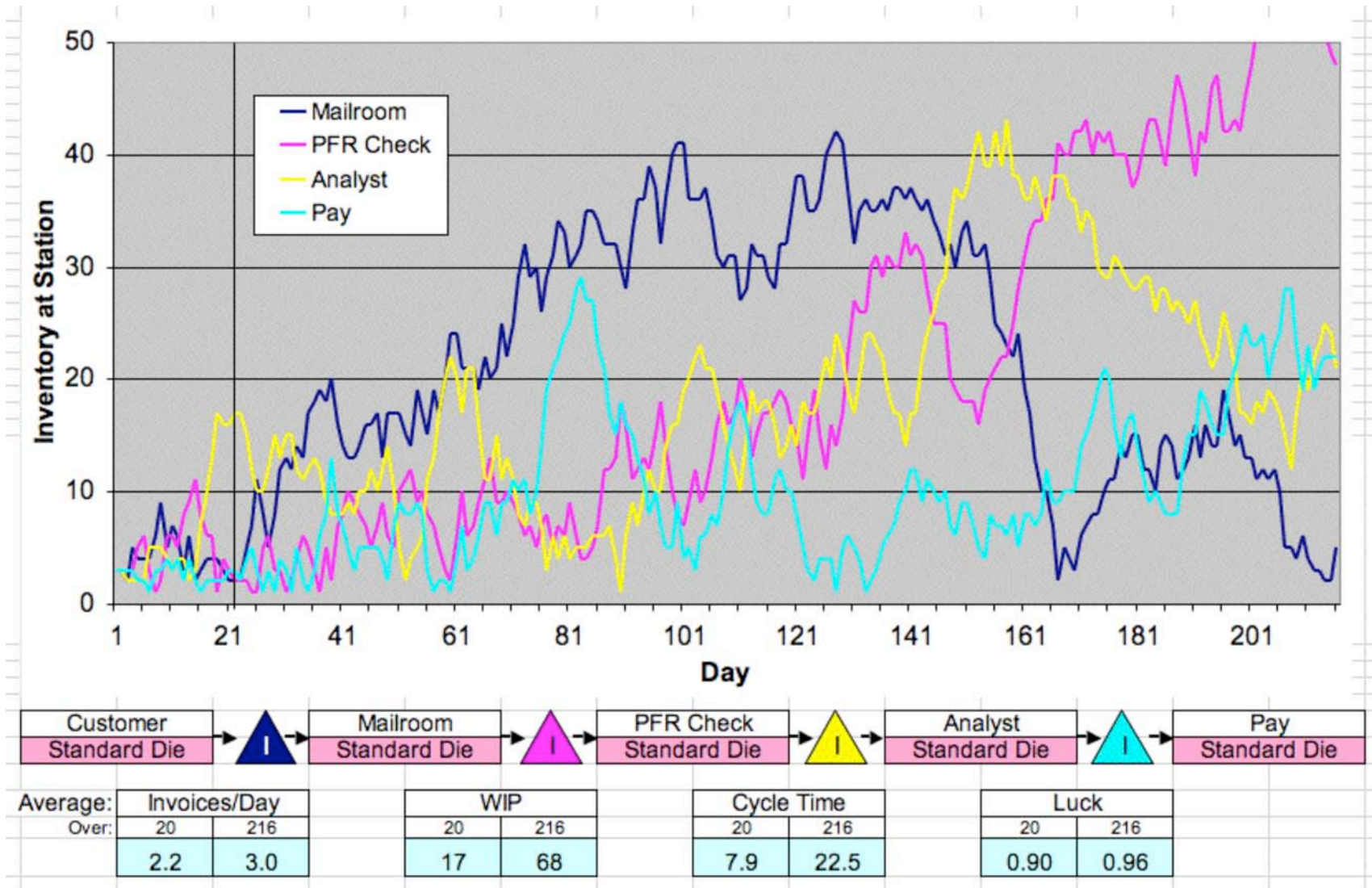
# Questions

- **Why are fewer jobs processed than expected? Why is flow time longer?**
  
  
  
  
  
  
  
  
  
  
- **How might the performance of this system be improved?**

# Computer Simulation

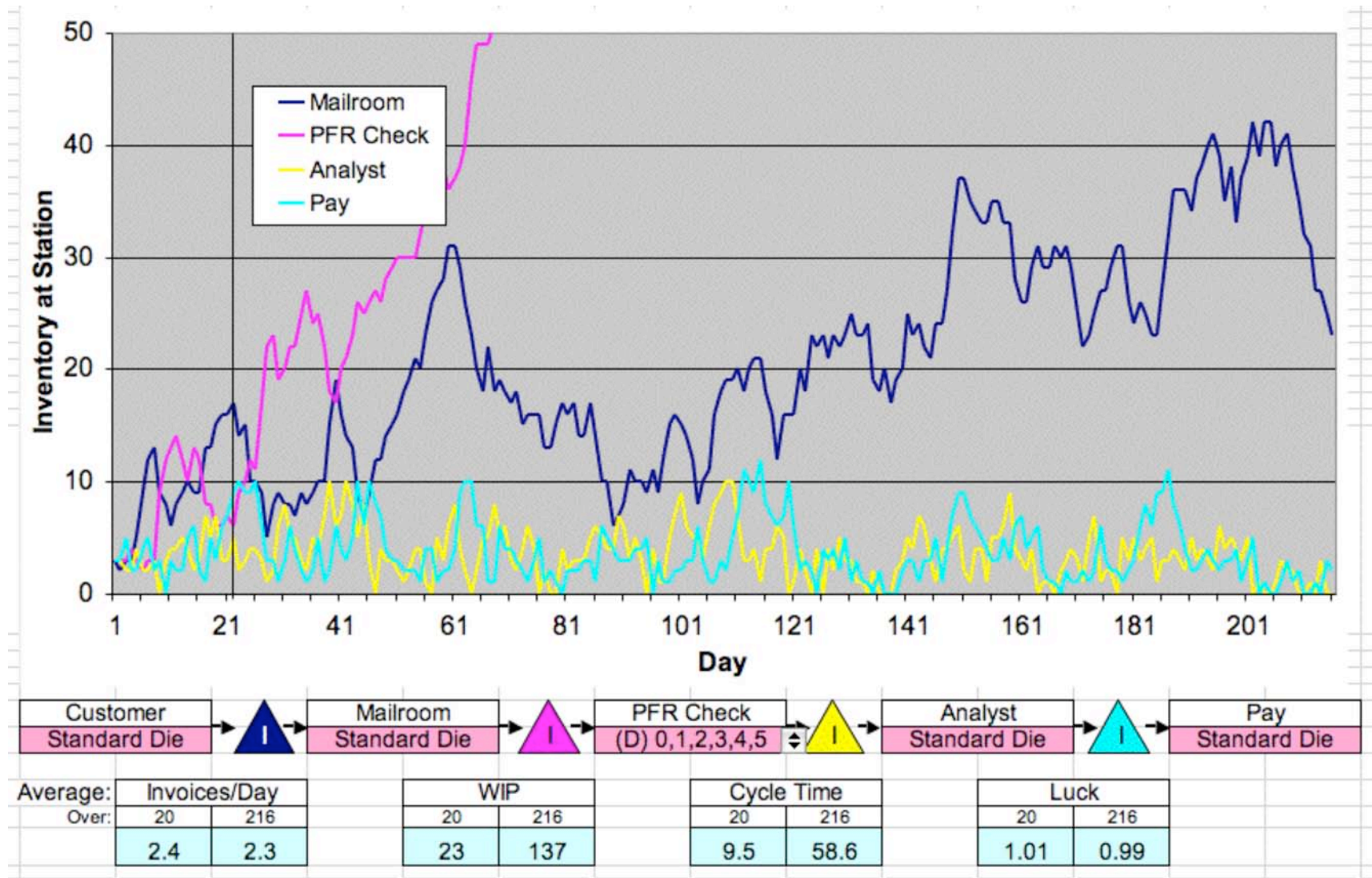
- We can more rapidly gather experimental data with a computer simulation of the dice game
- We can easily change customer input (invoice arrival) and process step variation to see the impact.
- Look at the impact of input and process variability on cycle time after 20 and 216 days
- For each simulation, write down the following data
  - Invoices/day, WIP, Cycle time
  - Then multiply (Invoices/day) x (Cycle time)

# Spreadsheet Simulation

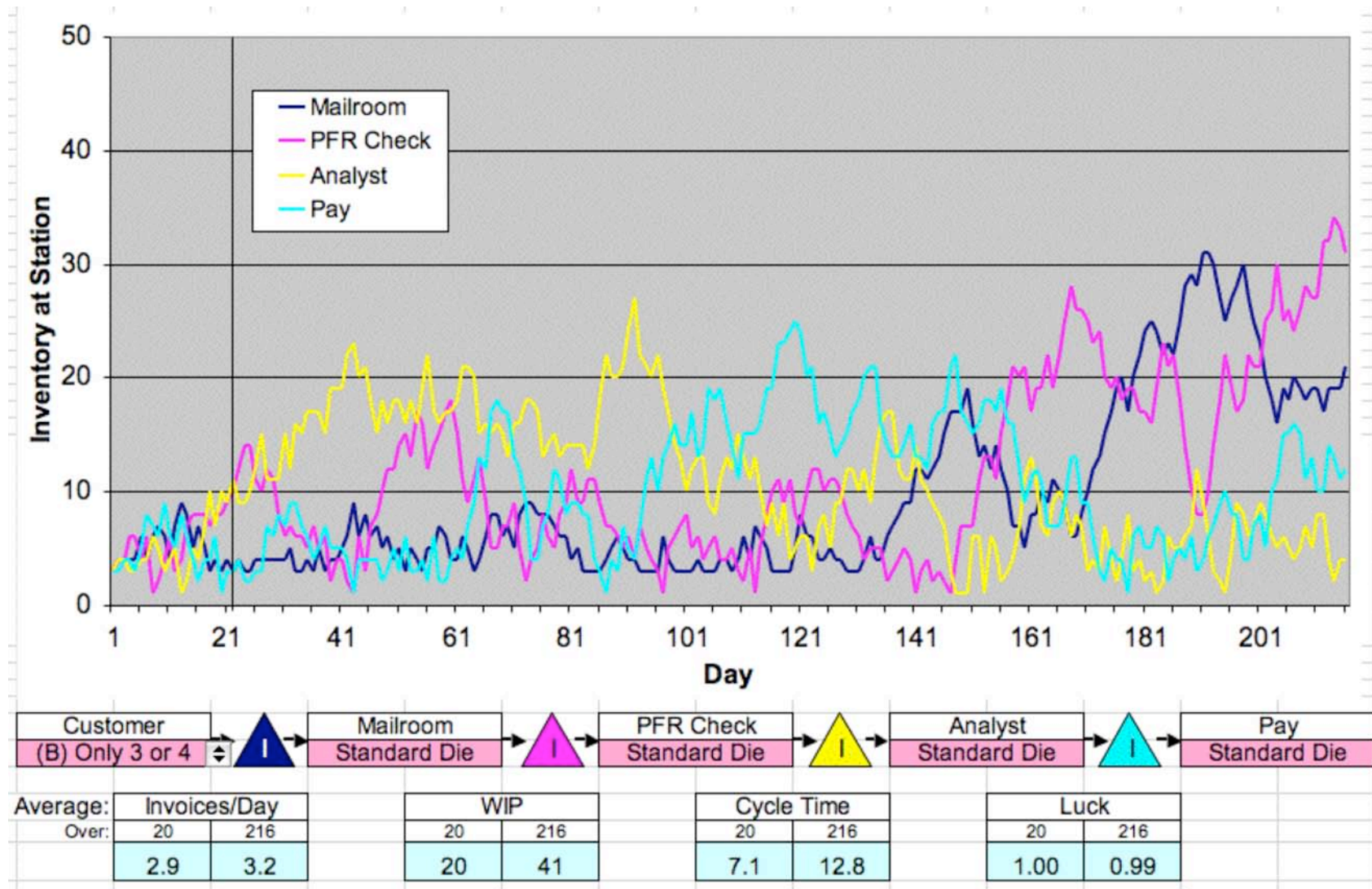




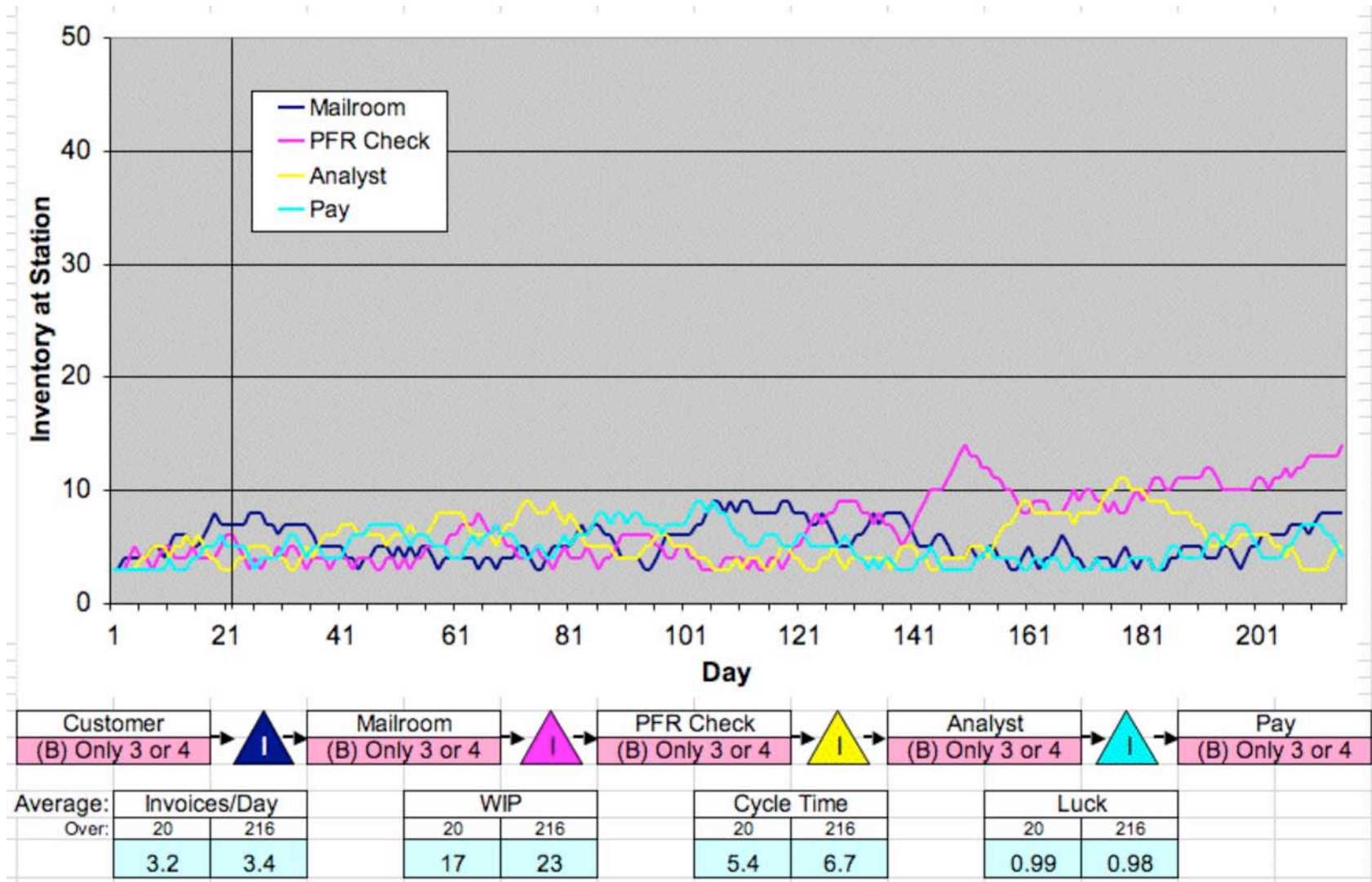
# Bottleneck



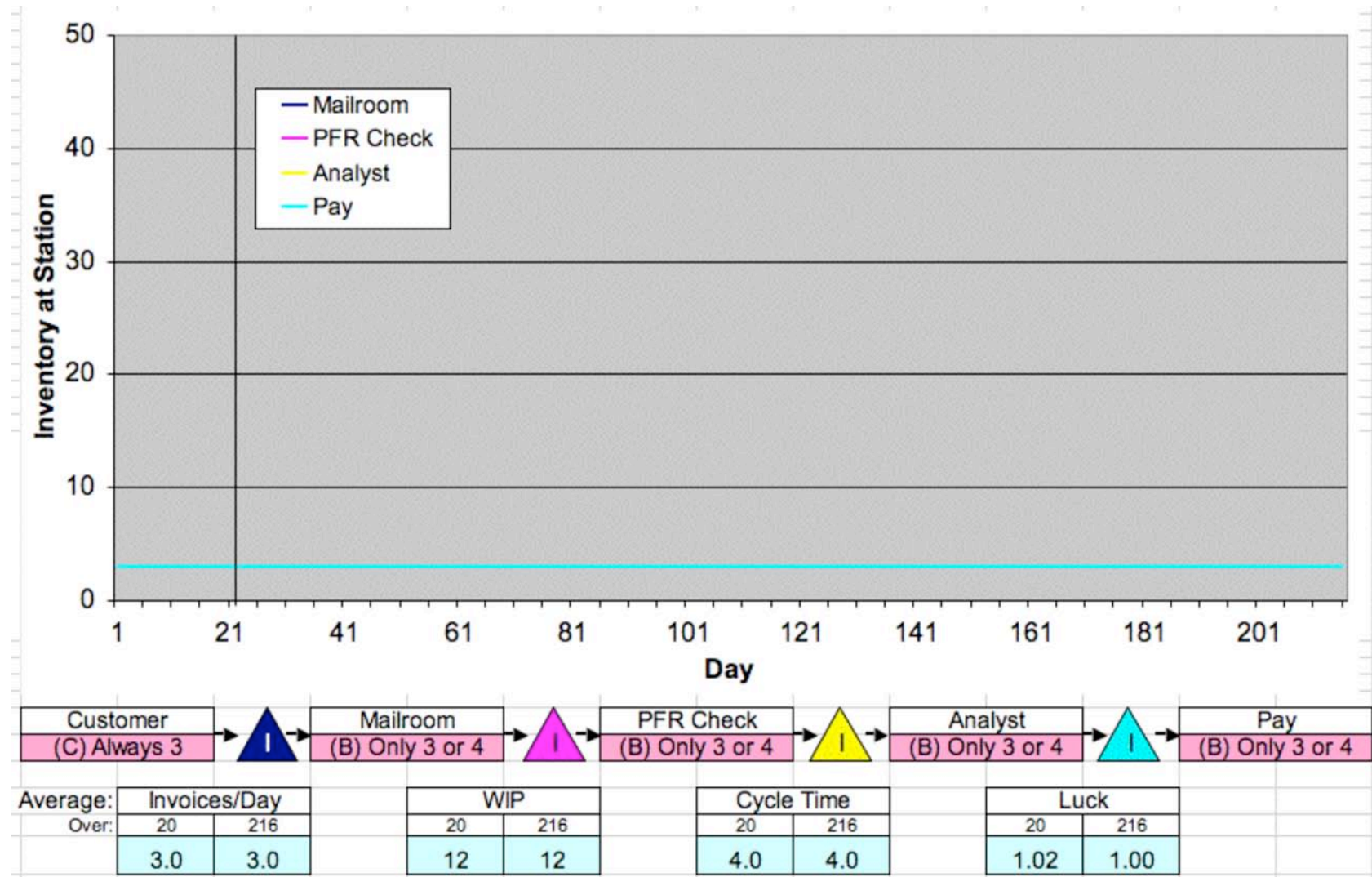
# Reduced Input Variation (3 or 4)



# Reduced Total Variation



# Constant Demand, Low Variation



# Little's Law

$$\text{WIP} = (\text{Throughput Rate}) \times (\text{Cycle Time})$$

Or

$$\text{WIP} = \frac{\text{Cycle Time}}{\text{Takt Time}}$$

Data from 5 computer simulations

1	2	3	
Invoices/ day	WIP	Cycle Time	1 x 3
3.2	48	15	48.0
2.5	99	38.9	97.3
3.2	49	15.5	49.6
3.4	24	6.9	23.5
3	12	4	12.0

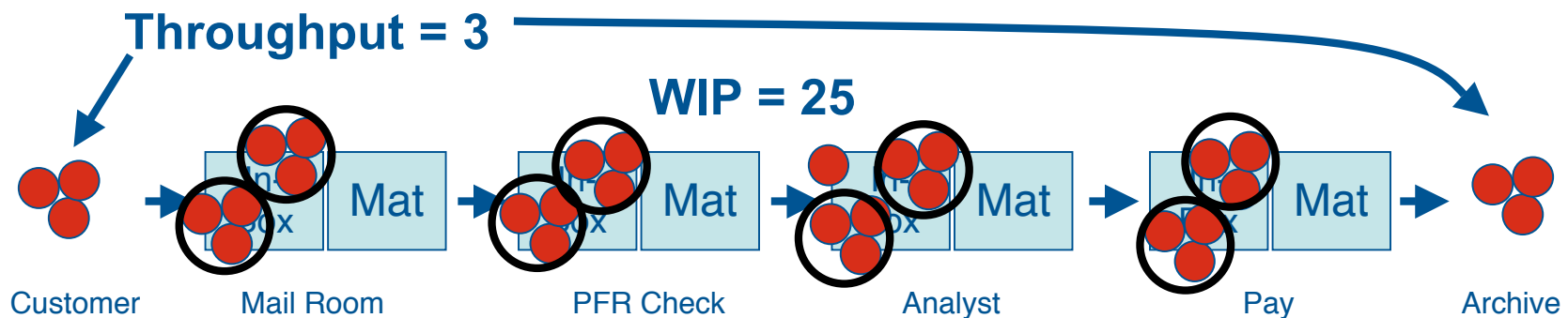
# Little's Law

$$WIP = (\text{Throughput Rate}) \times (\text{Cycle Time})$$

Or

$$WIP = \frac{\text{Cycle Time}}{\text{Takt Time}}$$

Example from Sim: Throughput = 3, WIP = 25



Takes about 8 cycles to work through the system

Using Little's Law:

$$\text{Cycle Time} = WIP / (\text{Throughput Rate}) = 8.3$$

# Simulation: Summary

- **Simulated the system to examine behavior over a longer time period, more replications**
- **We made several improvements that demonstrate the power of a lean philosophy:**
  - **Reduced INPUT variability**
  - **Reduced PROCESS variability**
  - **Less variability and some “excess” capacity allowed response to customer need - Pull**
  - **Eliminating variability allowed straight-through flow to customer demand - Perfection**

# Take Aways

- **Lean thinking and tools apply to office processes**
- **A structured process analysis can lead to identifying many opportunities for improvement**
- **Changing the theoretical process is not the only change required for successfully transforming an organization (management practices and structure determine behavior!)**
- **Variability reduces expected process performance**



# Acknowledgements

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