

JMP GRR Project: GRR study on process and metrology tools

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2024 JMP China DS-03 PSE GRR



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AMC PDC PSE

- Master Degree in Materials Science from Xi'an Jiaotong University.
- 5 years in packaging tool R&D, 2 years in CVD and 5 years in defect inspection and review experience.
- Focus on GRR Analysis using JMP platform



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AMC East FEP/EPI PSE

- Master's Degree in Materials Science and Engineering from Northwestern University
- Responsible for rapid thermal process and epitaxial Si process
- Enrolled AMAT BB Cert Program
- JMP Instructor and Mentor for 100+ JMP Practitioners
- Attended 2023 JMP China DS Conference
- Presenter GRR Project in 2024 JMP Europe DS Conference



Jiayi Yang (AMAT, Shanghai)
AMC East PSE

- Master Degree in Materials Science from Fudan University
- 2-year experience in Rapid Thermal Process, Epitaxial Silicon Deposition, and Ion Implantation Process
- Focus on GRR, SPC and PCA Analysis using JMP platform

AGENDA

1: GRR Study on OPWI Capture Rate Monitoring

2: GRR Study on Rs Measurement Tool

3: GRR Study on Meas. Q.Time on SiO₂ THK.

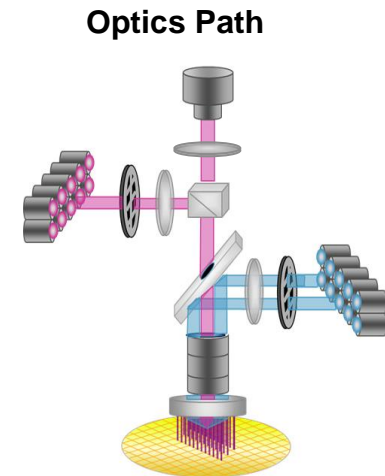
1. Optical Wafer Inspection: UVision8[®] Introduction

Innovation

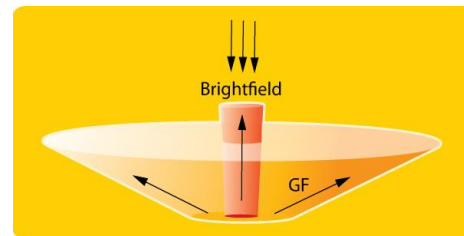


■ Detection

- ▶ Sensitivity thru high illumination **266nm DUV laser**
 - ▶ **Full polarization control** in illumination & collection
 - ▶ Simultaneous **Brightfield & Grayfield** detection
 - ▶ High sensitivity & high TPT mode
- ### ■ Filtering:
- ▶ Multi dimension attribute engine



Bright & Gray Filed



Value



■ BF & GF Inspection

- ▶ For full application space

■ Application In Fab

- ▶ R&D → Ramp → HVM

UV8[®] is an Optical Solution for Defect Inspection in R&D and HVM in ICAPS.

1: Proposals Introduction

■ Motivation:

- ▶ UV8[®] sensitivity and stability (Capture rate-CR) need to be monitoring during PM interval to guarantee tool performance.

■ Sampling plan

- ▶ **Parts:** 1 part with 3 dies, totally 9 parts ,sample in wafer center.
- ▶ **Repetition:** 10 repetition in each part.
- ▶ **Reproducibility:** Test time- 1d,3d, 7d, 15d and 30d.

■ Rules for Fast Repeat

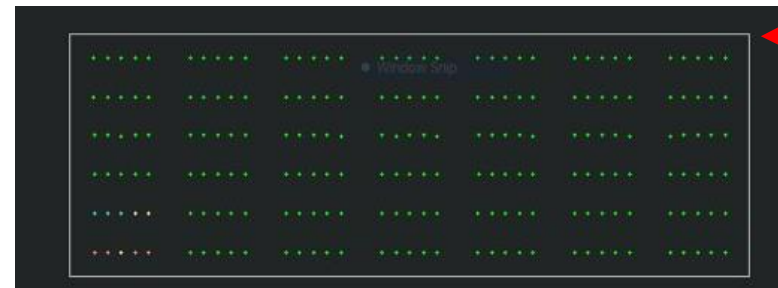
- ▶ Sequence follow queue time (1d,3d, 7d, 15d and 30d)
- ▶ 9 parts at the same queue time
- ▶ 10 repeats within the same Part

■ Criteria:

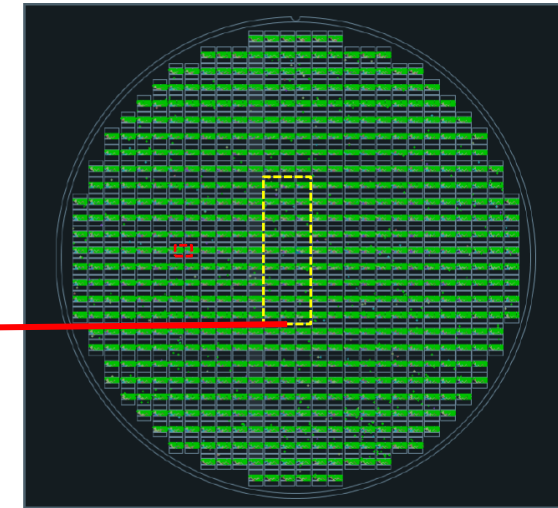
- ▶ P/T ratio: will be selected since Referred to spec (USL,LSL), lower request on parts selection.
- ▶ **Spec: 630 ± 30ea(±4.7%)**

Defect in each part

Objective & Optics		Sensitivity Specs + Results									
		Defect									
BF 100nm	sh_up	Result									
		Spec	NA	NA	NA	NA	NA	NA	NA	NA	
	sh_d	Result									
		Spec	NA	NA	NA	NA	NA	NA	NA	NA	
	op_up	Result	1								
		Spec	0.99	NA	NA	NA	NA	NA	NA	NA	
	op_d	Result	1								
		Spec	0.99	NA	NA	NA	NA	NA	NA	NA	
	Int	Result		1	1						
		Spec	NA	0.99	0.99	NA	NA	NA	NA	NA	
	Prot	Result		1	1						
		Spec	NA	0.99	0.99	NA	NA	NA	NA	NA	



Parts sample plan



1: GRR Analysis: Crossed

Crossed GRR (ANOVA with interaction)

Gauge R&R

Measurement Source	Variation (6*StdDev)	% of Tolerance		which is 6*sqrt of
Repeatability (EV)	10.072983	16.79	Equipment Variation	V(Within)
Reproducibility (AV)	1.645274	2.74	Appraiser Variation	V(Time) + V(Time*Part)
Time	0.795957	1.33		V(Time)
Time*Part	1.439923	2.40		V(Time*Part)
Gauge R&R (RR)	10.206464	17.01	Measurement Variation	V(Within) + V(Time) + V(Time*Part)
Part Variation (PV)	13.655811	22.76	Part Variation	V(Part)
Total Variation (TV)	17.048550	28.41	Total Variation	V(Within) + V(Time) + V(Time*Part) + V(Part)

Summary and Gauge R&R Statistics

6-sigma
 59.867 % Gauge R&R = $100 * (RR/TV)$
 0.74741 Precision to Part Variation = RR/PV
 1 Number of Distinct Categories = $\text{Floor}(\sqrt{2} * (PV/RR))$
 600 Lower Tolerance (LT)
 660 Upper Tolerance (UT)
 60 Tolerance = $UT-LT$
 0.17011 Precision/Tolerance Ratio = $RR/(UT-LT)$

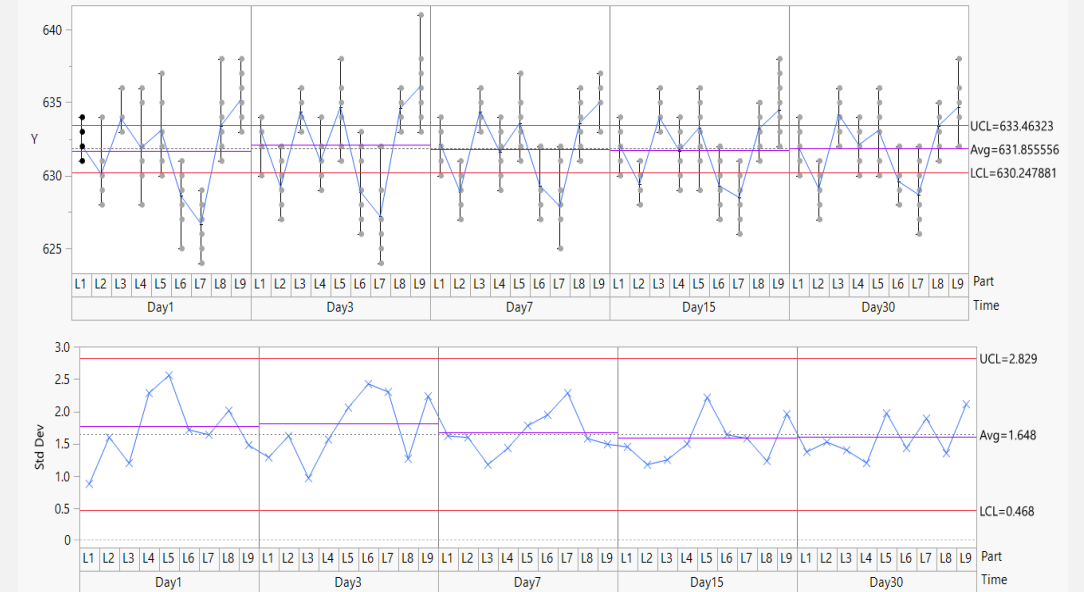
P/TV=59%
P/T=17%

Conclusion:

- ▶ PT ratio is preferred to evaluate GRR performance on spec.
 - PT ratio = **17% < 30%**, meaning acceptable measurement error, adequate GRR measurement capability.
- ▶ P/TV Ratio is much higher than P/T ratio, indicating the selected GRR samples selection is too tight.

Variability Chart

Variability Chart for Y



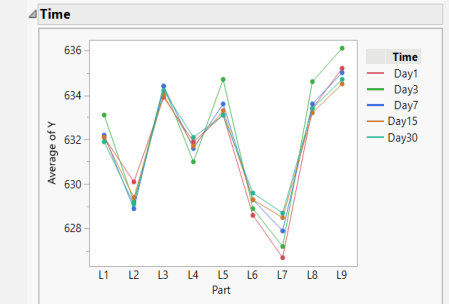
Repeatability

- » >55% points is out of Gauge variation range
- » No OOC in Std Dev chart, 6σ repeatability = $9.8 < 60$

Reproducibility

- » Five curves are parallel.
- » Smaller group mean difference ($0.46 < \text{spec } 60$)
- » Little interaction with parts*time

Parallelism Plots



1: GRR Analysis: Misclassification Rate

■ Misclassification Rate

Misclassification Probabilities

Lower Tolerance = 600, Upper Tolerance = 660, Grand Mean = 631.8556

Description	Probability
P(Good part is falsely rejected)	0.00000000
P(Bad part is falsely accepted)	.
P(Part is good and is rejected)	0.00000000
P(Part is bad and is accepted)	0.00000000
P(Part is good)	1.00000000

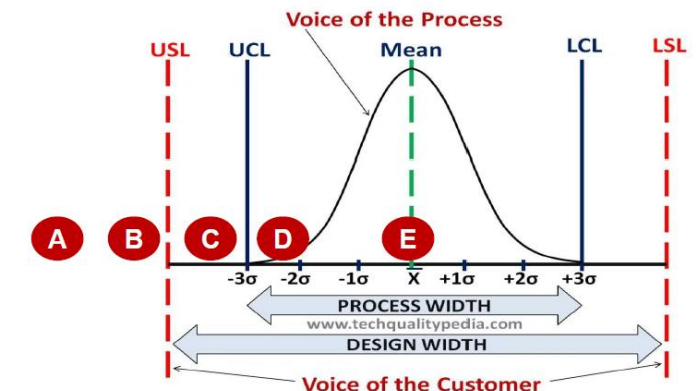
Alpha risk: Producer Risk
Beta risk: Customer Risk

Note: The probability that a part is outside of tolerance is zero.

■ Conclusion:

- » All measurement targets distribution is tight and measurement value is +/- 11 compared with spec +/- 30
- » Most measurements parts are in Type E area (target area), very tight measurement distribution causes zero Alpha and Beta risk.

Location	Spec Limit	Control Limit	Target	Alpha Risk	Beta Risk
A	Way bwyond Spec Range	Way bwyond Control Range	Far Away from the Target	Zero	Very Low
B	Slightly outside Spec Range	Way beyond Control Range	Far Away from the Target	Low	High
C	Inside the Spec Range	Slightly outside the Control Range	Still away from the Target	High	Low
D	Inside the Spec Range	Inside the Control Range	near the Target	Low	Very Low
E	Inside the Spec Range	Inside the Control Range	At the Target	Zero	Zero

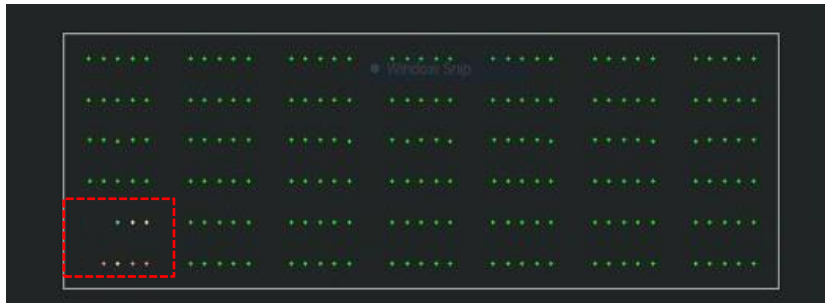


1: Missing Analysis

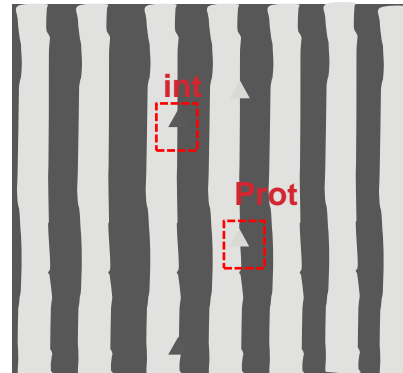
Missing analysis

- ▶ Missing defects are smaller size (100nm) intrusion and protrusion.
- ▶ Detection challenges are defects SNR is lower, which easily to mix with line roughness in the background.
- ▶ Such detection capability and stability is not enough to handle advanced tech nodes.
- ▶ Need to enhance missing defects detection SNR in new platform(Enlight[®]) by using new optical design and new algorithm.

Missing defects map



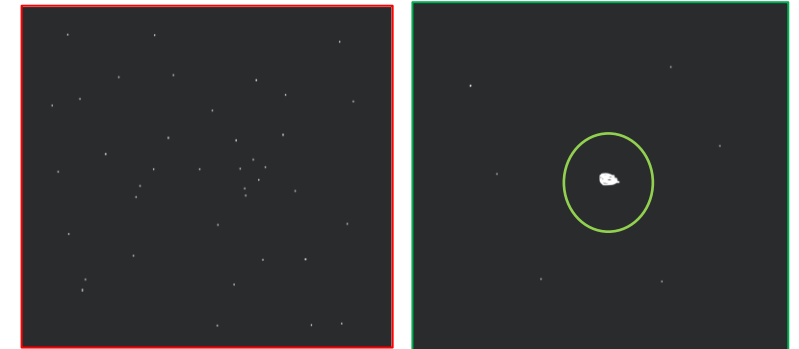
Missing defect types illustration
(Manual drawing)



Missing defect SNR Illustration
(Manual drawing)

Missing

Captured



1: New Platform: Enlight[®] Overview



High NA Optics

Highest available
OPWI NA



Light Budget

High Power Laser
Higher QE detectors
Enhanced Optical Path



Oblique illumination

-SideView™
module



Advanced imaging

Innovative advanced
computing architecture



Algo improvement

-Deep learning algo.

Applied Materials External

■ Continuous Improvement Plan

- ▶ For Enlight[®] with higher sensitivity in advanced tech-node:
 - Design new OTW wafer with smaller and challenging types defects for tool GRR performance monitoring .
 - Perform attribute GRR on defect dimension and type instead of only focusing on total defect counts to identify detection gap root cause, thus improve OPWI products performance and enhance OPWI marketing position.

2: Project Background & Problem Statement

▪ Problem statement

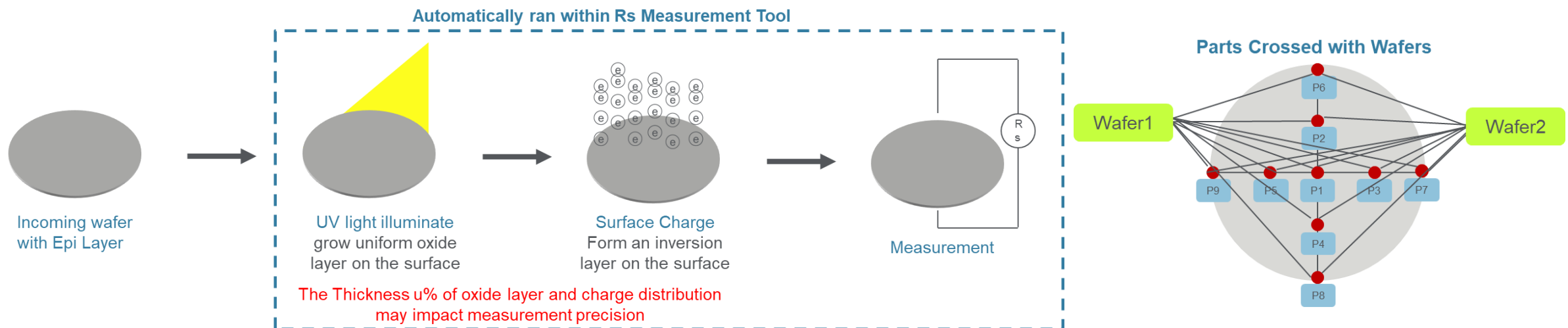
- ▶ Rs or Resistivity, measured by lab QCs tool, is a key parameter of Epi films
- ▶ The unstable measurement precision severely influences Epi process recipe tuning

▪ Objective

- ▶ Apply JMP GRR platforms to analyze the measurement GRR capability and stability of lab QCs tool
- ▶ Find out the most unstable measured points

▪ Sampling Plan

- ▶ Repeatability: 4 repeats per wafer
- ▶ Reproducibility: 2 wafers
- ▶ Tolerance Spec: 9.8~10.2



2: GRR Performance Analysis: Main effect vs. Crossed

Main Effect (ANOVA without interaction)

Measurement Source		Variation (6*StdDev)	% of Tolerance		which is 6*sqrt of
Repeatability (EV)		0.6686637	167.17	Equipment Variation	V(Within)
Reproducibility (AV)		0.0929991	23.25	Appraiser Variation	V(Wafer)
Wafer		0.0929991	23.25		V(Wafer)
Gauge R&R (RR)		0.6750999	168.77	Measurement Variation	V(Within) + V(Wafer)
Part Variation (PV)		0.7932474	198.31	Part Variation	V(Part)
Total Variation (TV)		1.0416340	260.41	Total Variation	V(Within) + V(Wafer) + V(Part)

Summary and Gauge R&R Statistics	
6 k	
64.8116 % Gauge R&R = 100*(RR/TV)	
0.85106 Precision to Part Variation = RR/PV	
1 Number of Distinct Categories = Floor(sqrt(2)*(PV/RR))	
9.8 Lower Tolerance (LT)	
10.2 Upper Tolerance (UT)	
0.4 Tolerance = UT-LT	
1.68775 Precision/Tolerance Ratio = RR/(UT-LT)	

P/TV = 66.8%

Tolerance = 0.4

P/T = 172%

Crossed (ANOVA with interaction)

Measurement Source		Variation (6*StdDev)	% of Tolerance		which is 6*sqrt of
Repeatability (EV)		0.6496890	162.42	Equipment Variation	V(Within)
Reproducibility (AV)		0.2274164	56.85	Appraiser Variation	V(Wafer) + V(Wafer*Part)
Wafer		0.1058743	26.47		V(Wafer)
Wafer*Part		0.2012680	50.32		V(Wafer*Part)
Gauge R&R (RR)		0.6883415	172.09	Measurement Variation	V(Within) + V(Wafer) + V(Wafer*Part)
Part Variation (PV)		0.7679325	191.98	Part Variation	V(Part)
Total Variation (TV)		1.0312780	257.82	Total Variation	V(Within) + V(Wafer) + V(Wafer*Part) + V(Part)

Summary and Gauge R&R Statistics	
6 k	
66.7465 % Gauge R&R = 100*(RR/TV)	
0.89636 Precision to Part Variation = RR/PV	
1 Number of Distinct Categories = Floor(sqrt(2)*(PV/RR))	
9.8 Lower Tolerance (LT)	
10.2 Upper Tolerance (UT)	
0.4 Tolerance = UT-LT	
1.72085 Precision/Tolerance Ratio = RR/(UT-LT)	

P/T = 172% > 30%: poor GRR measurement capability, need to investigate the RC.

2: GRR Root Cause Analysis

Objective

- To find out where we can improve the repeatability and reproducibility

Repeatability

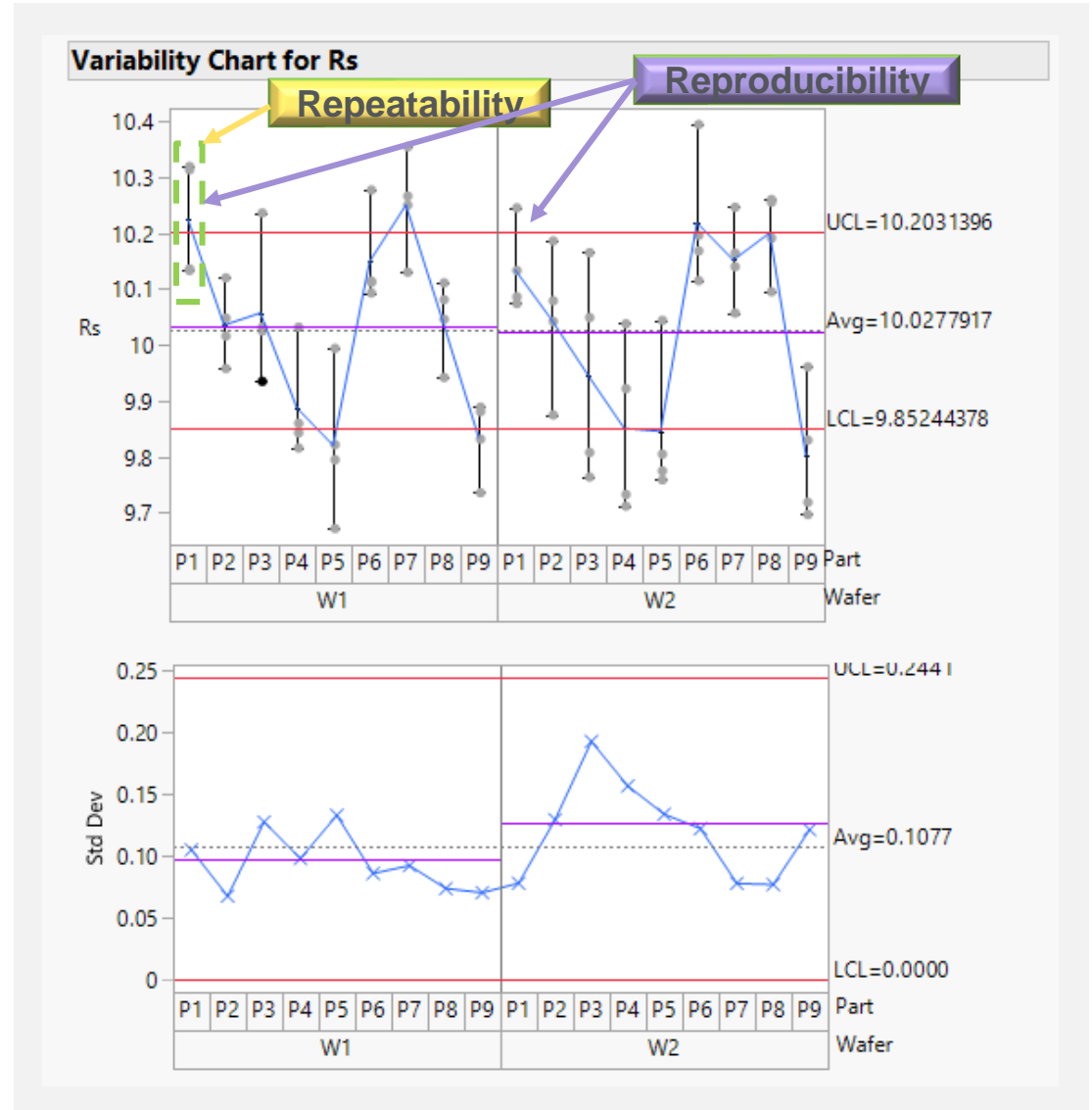
- No OOC in Std Dev chart, the repeatability is stable for each part
- But the repeatability is too bad, for $6\sigma=0.6$, greater than tolerance ($10.2-9.8=0.4$)

$$P/T = \frac{6 \sqrt{\sigma_{repeatability}^2 + \sigma_{reproducibility}^2}}{Tolerance}$$

- More than 50% of the points fall into the control limit in xBar Chart, indicating the control limit is too wide due to bad repeatability

Reproducibility

- Obvious reproducibility issue because the two Rs blue connecting lines of 2 wafers are not parallel with each other



2: Degradation Risk: Replication 1 vs. Replication 4

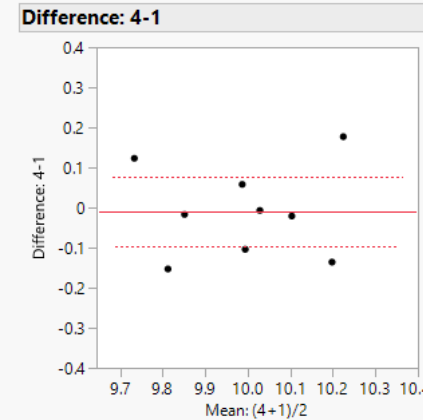
Objective

- Use Matched Pairs to conduct Paired-T test between Replication 1 and Replication 4 for Degradation Risk Evaluation

Results

- Wafer 1 has low Degradation Risk: $p > 0.05$
- Wafer 2 has significant Degradation risk due to paired mean = 0.21, 50% of spec range (9.8~10.2)

Wafer 1



4	9.98811	t-Ratio	-0.23546
1	9.997	DF	8
Mean Difference	-0.0089	Prob > t	0.8198
Std Error	0.03773	Prob > t	0.5901
Upper 95%	0.0781	Prob < t	0.4099
Lower 95%	-0.0959		
N	9		
Correlation	0.79899		

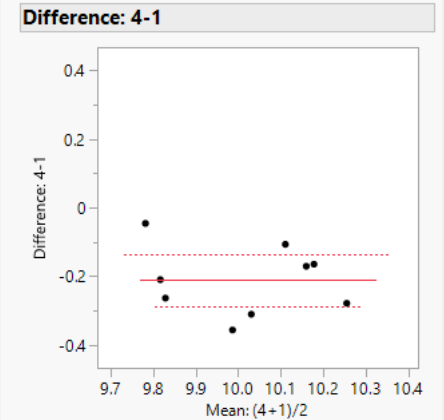
Goodness-of-Fit Test		
	W	Prob < W
Shapiro-Wilk	0.9467399	0.6543
	A ²	Simulated p-Value
Anderson-Darling	0.239154	0.7276

Note: Ho = The data is from the Normal distribution. Small p-values reject Ho.

Autocorrelation 0.362666

Parameter Estimates				
Term	Estimate	Std Error	t Ratio	Prob > t
Intercept	-0.364088	2.524563	-0.14	0.8894
mean	0.0355463	0.252612	0.14	0.8921

Wafer 2



4	9.91022	t-Ratio	-6.34712
1	10.1224	DF	8
Mean Difference	-0.2122	Prob > t	0.0002
Std Error	0.03344	Prob > t	0.9999
Upper 95%	-0.1351	Prob < t	0.0001
Lower 95%	-0.2893		
N	9		
Correlation	0.84926		

Goodness-of-Fit Test		
	W	Prob < W
Shapiro-Wilk	0.9786198	0.9568
	A ²	Simulated p-Value
Anderson-Darling	0.1480395	0.9784

Note: Ho = The data is from the Normal distribution. Small p-values reject Ho.

Autocorrelation -0.06616

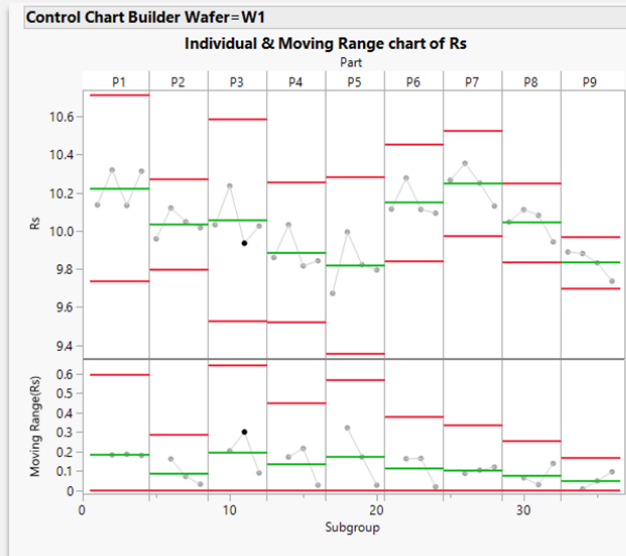
Parameter Estimates				
Term	Estimate	Std Error	t Ratio	Prob > t
Intercept	0.5819476	2.158902	0.27	0.7953
mean	-0.079287	0.215509	-0.37	0.7238

2: Repeatability Root Cause Analysis: IMR Control Chart by Phase

Objective

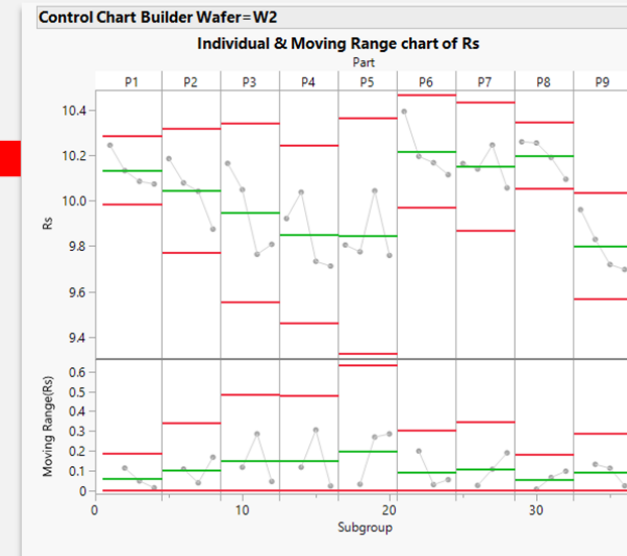
- Use IMR Control Chart by Phase to conduct repeatability test only among each part on each wafer; and to see the degradation pattern of Wafer 2 across all parts. Assign Part as Phase, By Wafer

Wafer 1

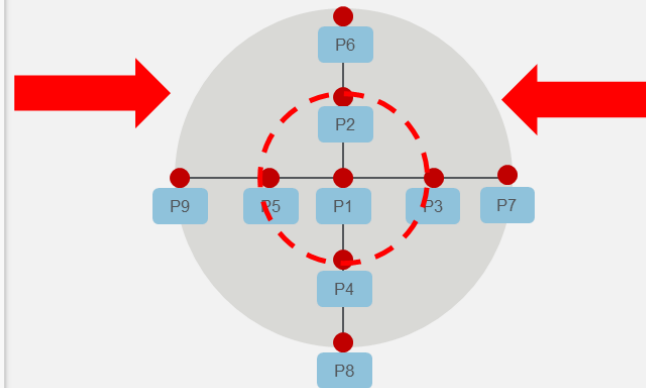


- » Worst Part: 1,3,4,5
- » Worst Repeat: 2

Wafer 2



- » Worst Part: 2,3,4,5
- » Worst Repeat: degrades over repeats



Rs Measurement Tool has worst repeatability at wafer center

Conclusions

- Current PT ratio 167% > 30%, Indicating metrology issue .
- Root cause : The pretreatment <Oxide layer thickness uniformity and charge distribution uniformity> may be the root cause

3: Project Background & Problem Statement

■ Problem Statement

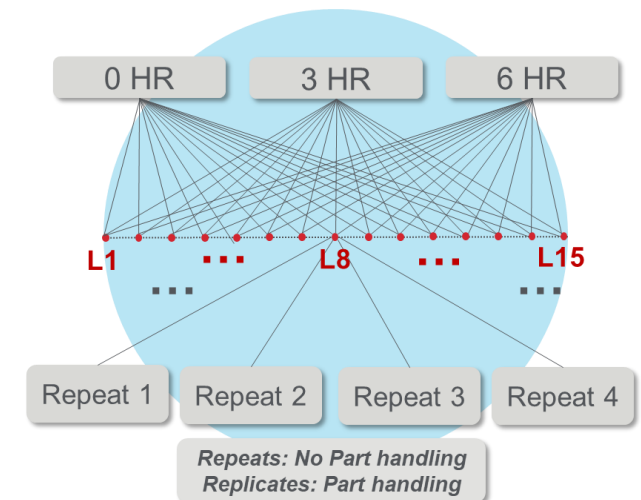
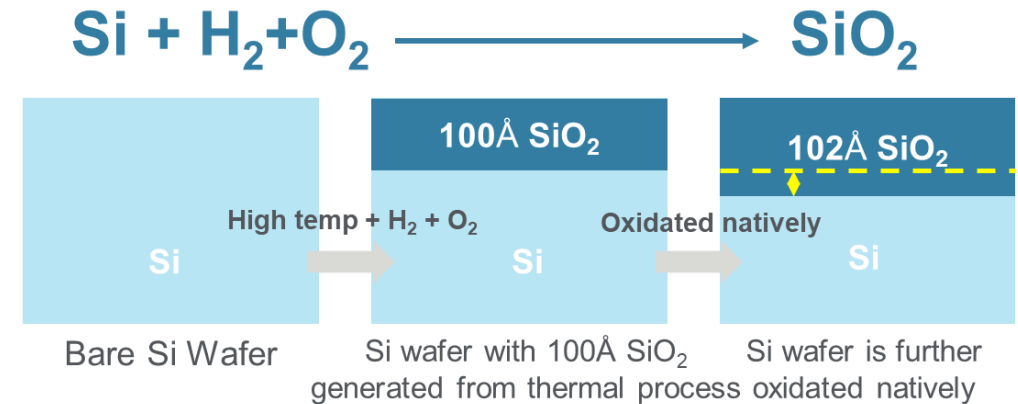
- ▶ Thickness of thermally generated SiO₂ would increase over time if not measured timely. It might distort the true thickness, affecting process qualification like uniformity tuning, chamber matching, etc. during Tier2 & Tier3

■ Objective

- ▶ Apply JMP GRR platforms to analyze the measurement GRR capability and stability, and part degradation risk due to Measurement Queue Time

■ Sampling Plan

- ▶ Part: 15 coupon * 1 wafer ~ 15 parts
- ▶ Repeatability: 4 repeats for one part one time
- ▶ Reproducibility: 0 & 3 & 6 hour
- ▶ Tolerance spec: **LSL-USL = 97-103A** for each part
- ▶ Fast Repeat



3: GRR Performance Analysis: Main effect vs. Crossed

- Main Effect GRR (ANOVA w/o interaction)

Gauge R&R

Measurement Source		Variation (6*StdDev)	% of Tolerance	
Repeatability	(EV)	0.1009628	1.68	Equipment Variation
Reproducibility	(AV)	0.5229593	8.72	Appraiser Variation
Q Time		0.5229593	8.72	
Gauge R&R	(RR)	0.5326161	8.88	Measurement Variation
Part Variation	(PV)	1.6004816	26.67	Part Variation
Total Variation	(TV)	1.6867784	28.11	Total Variation

Summary and Gauge R&R Statistics

6 k
31.5759 % Gauge R&R = 100*(RR/TV)
0.33278 Precision to Part Variation = RR/PV
4 Number of Distinct Categories = Floor(sqrt(2)*(PV/RR))
97 Lower Tolerance (LT)
103 Upper Tolerance (UT)
6 Tolerance = UT-LT
0.08877 Precision/Tolerance Ratio = RR/(UT-LT)

P/TV = 31.58%
Tolerance = 6
P/T = 8.88%

P/TV Ratio is much higher than P/T ratio which may indicate the selected GRR samples are too tight

- Crossed GRR (ANOVA with interaction)

Gauge R&R

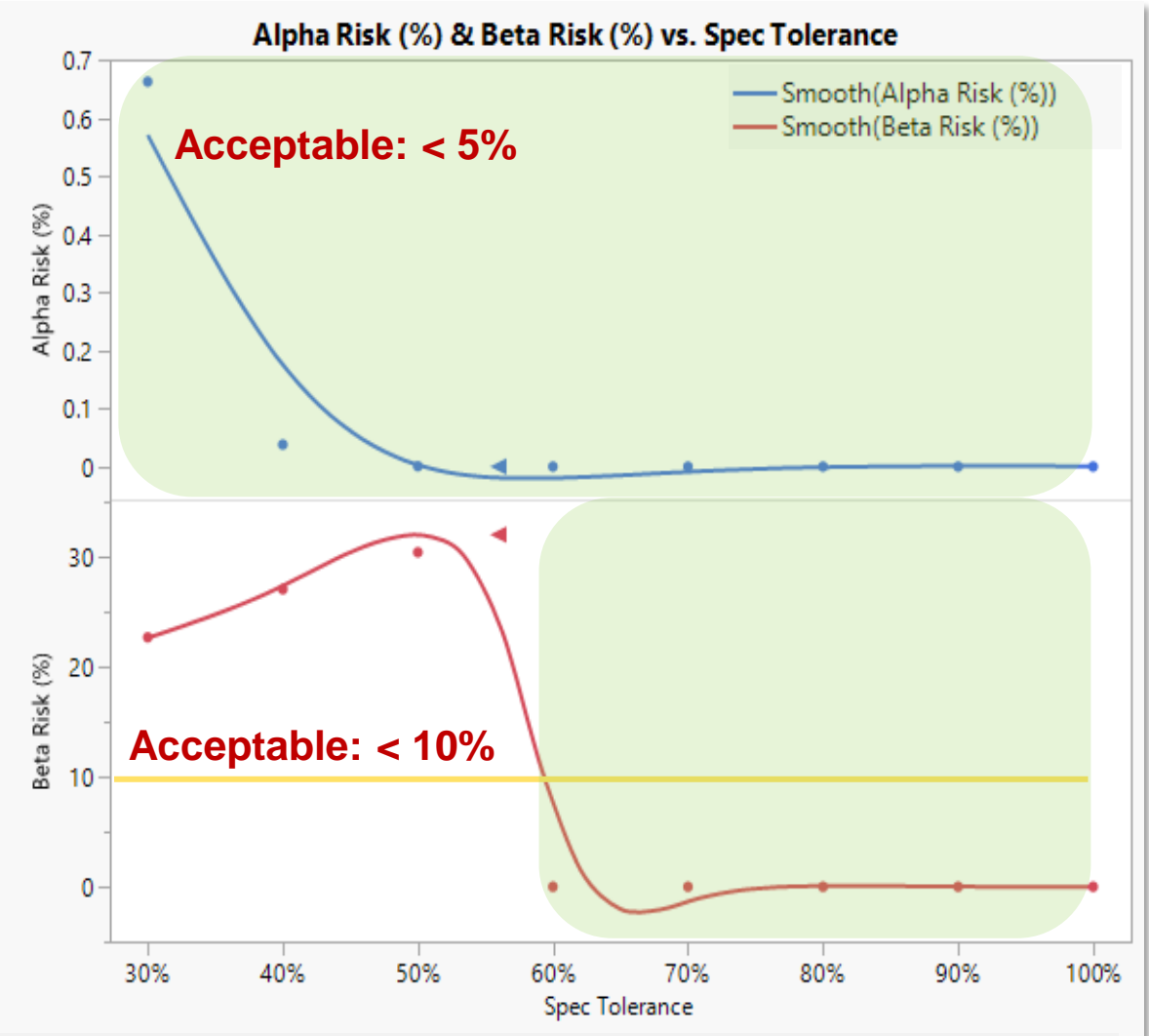
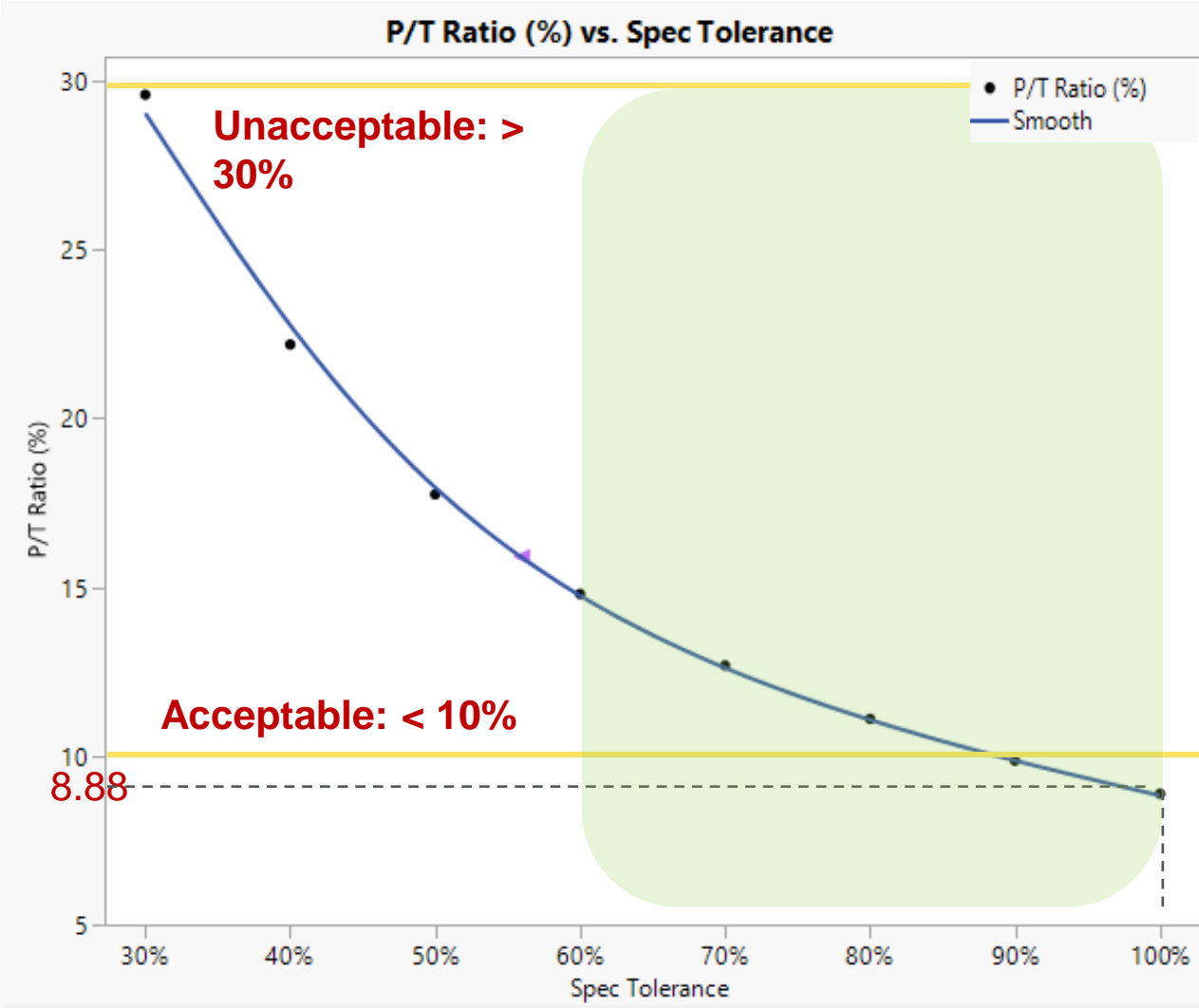
Measurement Source		Variation (6*StdDev)	% of Tolerance	
Repeatability	(EV)	0.1003660	1.67	Equipment Variation
Reproducibility	(AV)	0.5231173	8.72	Appraiser Variation
Q Time		0.5229501	8.72	
Q Time*Part		0.0132243	0.22	
Gauge R&R	(RR)	0.5326584	8.88	Measurement Variation
Part Variation	(PV)	1.6004666	26.67	Part Variation
Total Variation	(TV)	1.6867775	28.11	Total Variation

Summary and Gauge R&R Statistics

6 k
31.5785 % Gauge R&R = 100*(RR/TV)
0.33281 Precision to Part Variation = RR/PV
4 Number of Distinct Categories = Floor(sqrt(2)*(PV/RR))
97 Lower Tolerance (LT)
103 Upper Tolerance (UT)
6 Tolerance = UT-LT
0.08878 Precision/Tolerance Ratio = RR/(UT-LT)

- » ANOVA GRR W/WO Interaction Models show similar results since < 1% Interaction variation
- » **P/T ratio is preferred** to evaluate the GRR performance on tolerance
 - **P/T ratio < 10%**: adequate GRR measurement capability

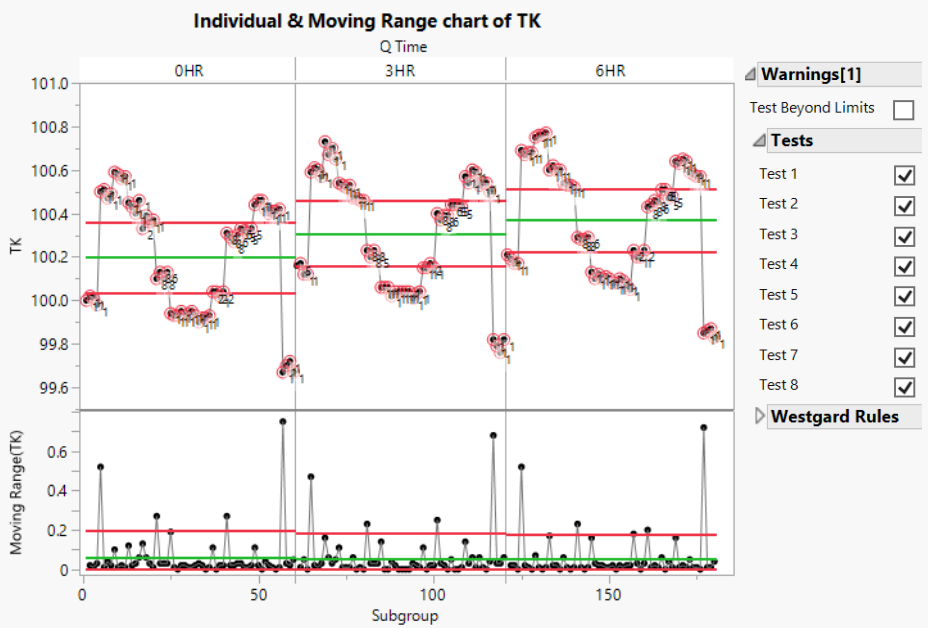
3: P/T ratios, Alpha/Beta Risks vs. Spec Tolerance



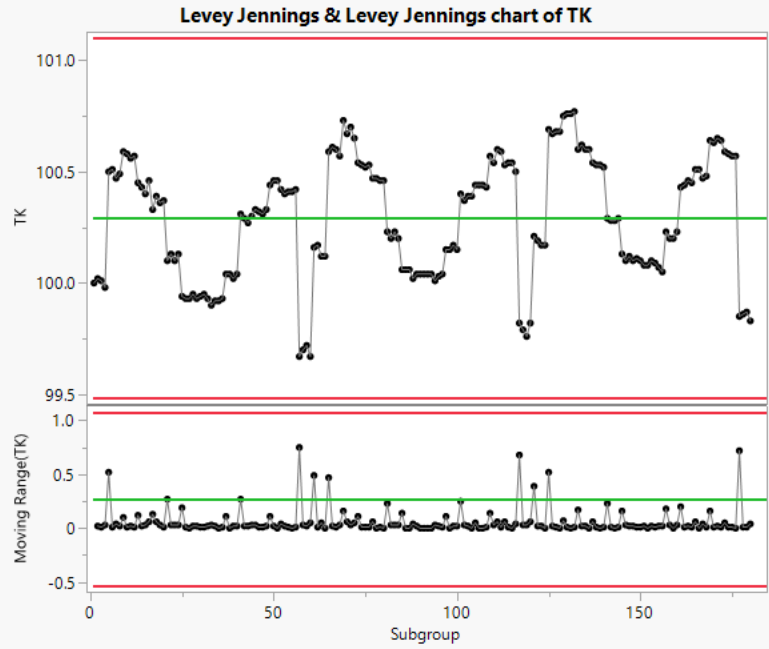
► With today's Measurement GRR Capability, we can tighten Tolerance Range by 40% from 6 to 3.6 while keeping P/T Ratio around 15% (competitive advantage)

3: Use Control Limits to Conduct the Mis-Classification Risks

- Control Limits from **I-MR** chart (**by phase**)



- Control Limits from **Levey Jennings** Chart



TK Limit Summaries						
Points plotted	Q Time	LCL	Avg	UCL	Limits	Sigma
Individual	0HR	100.0371	100.198	100.3589	Moving Range	
Individual	3HR	100.1583	100.3088	100.4593	Moving Range	
Individual	6HR	100.2258	100.37	100.5142	Moving Range	
Moving Range	0HR	0	0.060508	0.197653	Moving Range	
Moving Range	3HR	0	0.05661	0.184919	Moving Range	
Moving Range	6HR	0	0.054237	0.177168	Moving Range	

Misclassification Probabilities	
Lower Tolerance = 100.0371, Upper Tolerance = 100.3589	
Description	Probability
P(Good part is falsely rejected)	0.03764534
P(Bad part is falsely accepted)	0.03004577

Lower Tolerance = 100.1583, Upper Tolerance = 100.4593	
Description	Probability
P(Good part is falsely rejected)	0.04607137
P(Bad part is falsely accepted)	0.03320448

Lower Tolerance = 100.2258, Upper Tolerance = 100.5142	
Description	Probability
P(Good part is falsely rejected)	0.03605981
P(Bad part is falsely accepted)	0.02376130

Alarm Report		
Position	Total Samples	Alarm Rate
1	179	0.994444
2	0	0

Position Warnings Tested

1 Test 1, Test 2, Test 3, Test 4, Test 5, Test 6, Test 7, Test 8

2

TK Limit Summaries					
Points plotted	LCL	Avg	UCL	Limits	Sigma
Individual	99.48641	100.2923	101.0981	Levey Jennings	
Moving Range	-0.53724	0.268621	1.074485	Levey Jennings	

Misclassification Probabilities	
Lower Tolerance = 99.48641, Upper Tolerance = 101.0981	
Description	Probability
P(Good part is falsely rejected)	0.00228467
P(Bad part is falsely accepted)	0.25691057
P(Part is good and is rejected)	0.00227891
P(Part is bad and is accepted)	0.00064724
P(Part is good)	0.99748066

- I-MR CL: Alpha/Beta risks: <5%
- Levey CL: Alpha/Beta risks: 0%/26%

3: Continuous Improvement (Competitive Advantage)

Continuously improve GRR and Ppk

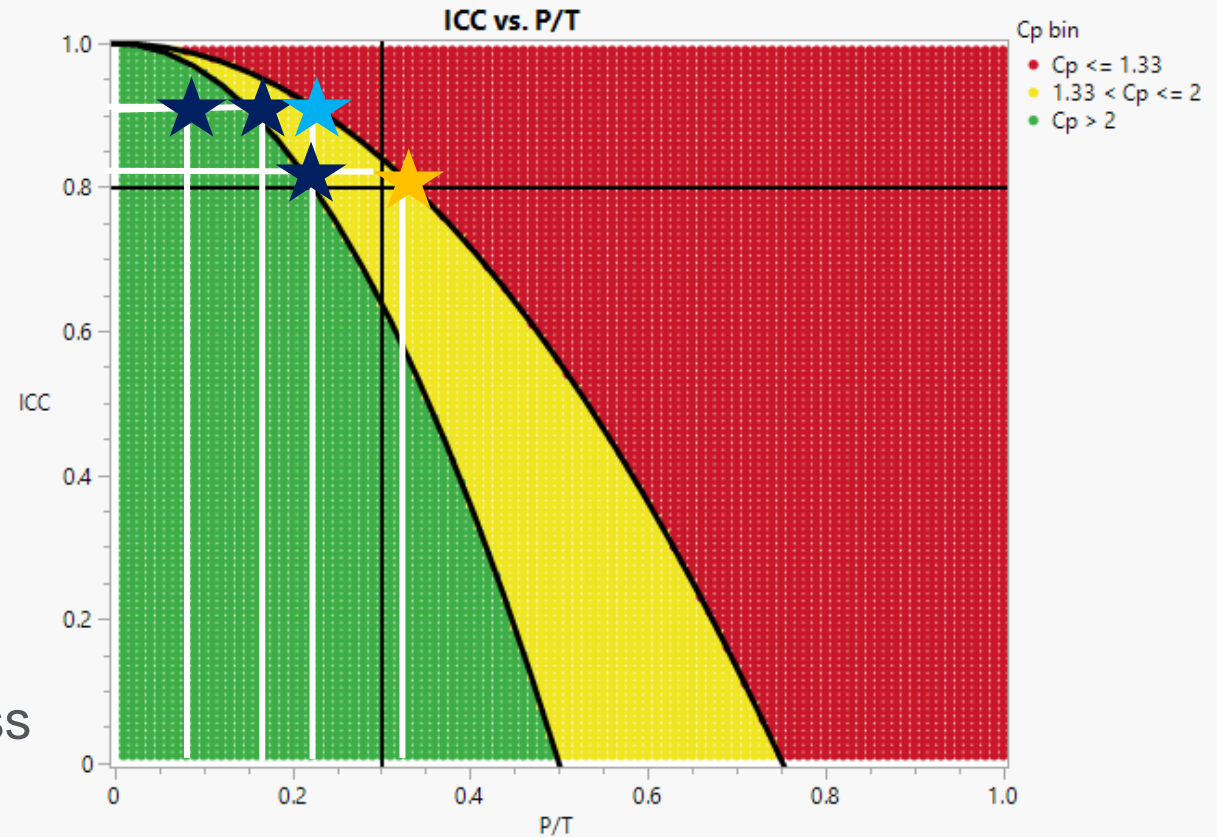
- ★ When $C_p \geq 2$, $P/T < 0.3$
=> Tighten Spec until $C_p=1.33$
- ★ When $C_p \leq 1.33$, $P/T < 0.3$
=> Improve Process Part-Part Capability (Reduce ICC) until $C_p = 2$
- ★ When $C_p \leq 1.33$, $P/T > 0.3$
=> Improve GRR < 0.3 (also improve C_p)

Iteratively and continuously improve the Process Capability and Measurement Capability

$$C_p = \frac{\sqrt{1 - ICC}}{P/T}$$

$$ICC = \frac{\sigma_{part}^2}{\sigma_{part}^2 + \sigma_{gauge}^2}$$

$$P/T = \frac{6\hat{\sigma}_{gauge}}{USL - LSL}$$



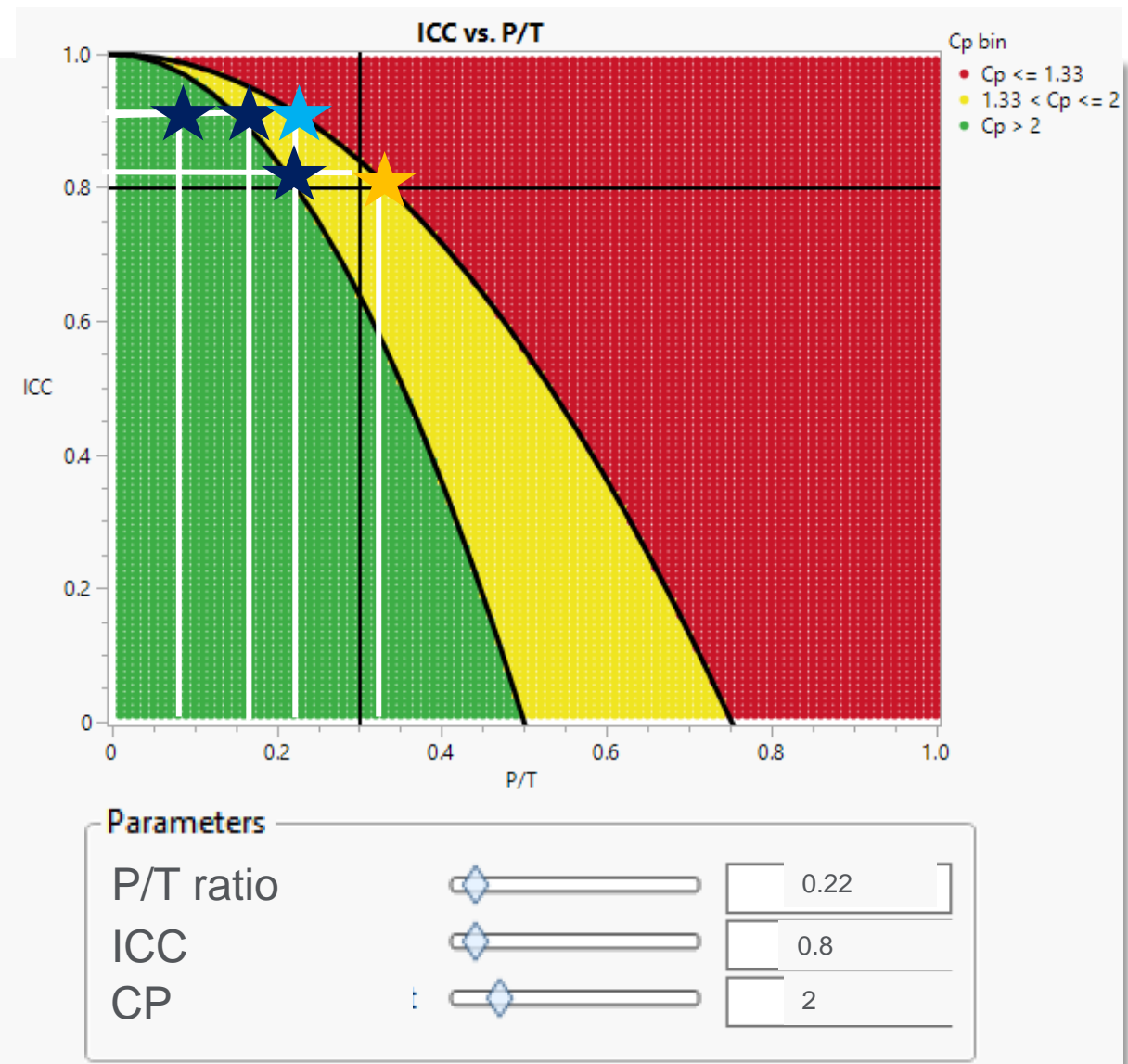
3: Profiler Development

Background

- ▶ Need to digest continuous improvement direction, but current calculations are manual, lower efficiency

Possible Features

- ▶ Profiler free adjustment function.
- ▶ Provide auto optimization suggestion basing on current PT ratio and ICC data to reach CP>2 target:
 - If CP> 2, what is the prolife suggestion?
 - If Cp <= 1.33, P/T < 0.3 what is the prolife suggestion?
 - If Cp <= 1.33, P/T > 0.3 what is the prolife suggestion?
 - ...





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