

# **Using Experimental Design and Statistical Software to Investigate the Impact of Amines on Metalworking Fluid Lubricity**

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# Background

# About Quaker Chemical Corp.



- » **Global Headquarters: Conshohocken, PA**
- » **Supplier of industrial process fluids since 1918**
- » **2,160 associates worldwide**
- » **26 locations in 21 countries**
- » **2018 sales: \$867.5m**
- » **2018 R&D expenditures: \$24.5m**



# Metalworking Fluids

- » **Oil emulsified in water**
- » **Cools and lubricates tool and part**
- » **Extends tool life**
- » **Removes chips and debris**
- » **Prevents rust and corrosion**



<http://www.fabricatingandmetalworking.com/2015/06/a-new-wave-of-metalworking-fluids/>

# Metalworking Fluids



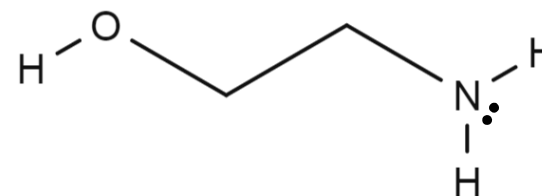
## MWF Composition



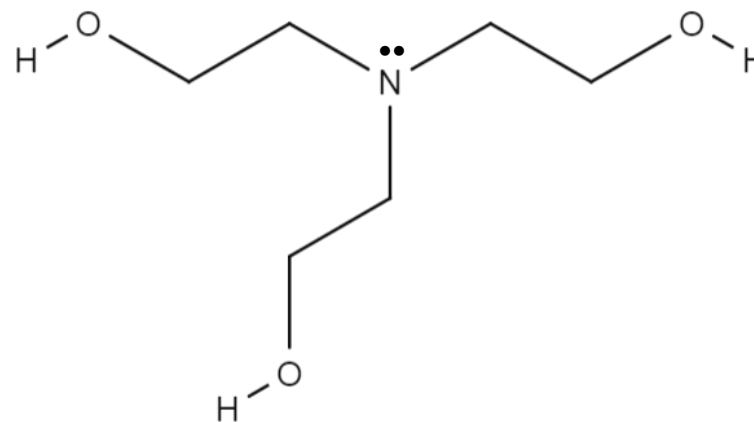
- » **Carrier oil: 20-50%**
- » **Lubricity additives: 5-15%**
- » **Surfactants:**
  - Fatty acids: 5-15%
  - Emulsifiers: 5-15%
- » **Amines: 5-15%**
- » **Corrosion inhibitors: 1-5%**
- » **Biocides: 0.5-5%**

# Amines

- » **Weak bases**
- » **React with fatty acids and other acid species**
- » **Maintain pH at ~9.2–9.5**
- » **Help to prevent biological growth in emulsions**
- » **Aid in corrosion resistance**
- » ***Provide lubricity***



**Mono-ethanolamine (MEA)**



**Tri-ethanolamine (TEA)**



# The Problem

# Modifying an Existing Product

- » **“Product A” needed to be modified:**
  - Improve pH buffering
  - Reduce raw material cost
  - Maintain overall performance
- » **Formulated “Product B”**
  - Like-for-like swaps, cost rebalancing
  - Changed the amine package
- » **Product B was not the same as Product A:**
  - **Lubricity was noticeably worse**
  - Product A tapping torque: ~160 N-cm
  - Product B tapping torque: ~185 N-cm

# Comparing the Products

**Both products were similar:**

Raw Material	Product A	Product B
Carrier Oil	Moderately Expensive	Similar, less expensive
Lubricity Additives	No changes	
Fatty Acids	No changes	
Emulsifiers	6.5% fatty alcohol	4.0% fatty alcohol
	Expensive ethoxylated emulsifier	Less expensive ethoxylated emulsifier
	—	Additional emulsifier (1.0%)
Amine Package	Needed Improvement	More amine, better performance

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Total Amine Milli-equivalents	108.8	135.9

# What is Degrading Lubricity?

- » An initial investigation was conducted
- » Turned to OFAT experimentation first:
  - Looking for a quick-fix
  - Same amount of fatty alcohol : **Product B still worse**
- » Used DOE to investigate:
  - Rebalancing the emulsifier package : **no effect**
  - Rebalancing the fatty acid & emulsifiers : **no effect**
- » ***We needed to take a different approach!***



The Investigation

# Re-Examine the Differences

- » **Four things to investigate:**
  - Difference between carrier oils
  - The amine packages
  - Difference between ethoxylated emulsifiers
  - The additional emulsifier in Product B
- » **We set up a factorial experiment to examine the drivers**

Factor	Low (Product A)	High (Product B)
Carrier Oil	Expensive	Cheap
Amine Package	Product A	Product B
Ethoxylated Emulsifier	Expensive	Cheap
Additional Emulsifier	0	1.0%

- » **16 samples, no replicates, no center points**

# The MicroTap LabTap II G8:

## Instrument Highlights:

- » **Torque range: 50-700 N-cm**
- » **Spindle speed: 300-3000 RPM**
- » **Max thread depth: 45 mm**
- » **Variety of aluminum/steel alloys**
- » **Range of spindles: M2.5-M10**
- » **Cutting and forming operation**
- » **Operational and statistical software**
- **Quantitative response (N-cm)**
- **High-precision**



# Factorial Results

## Model with ABCD Term Removed:

### Response 1: Tapping Torque

Source	Sum of Squares	df	Mean Square	F-value	p-value	
<b>Model</b>	416.22	14	29.73	2.68	0.4492	not significant
A-Carrier Oil	6.25	1	6.25	0.5625	0.5903	
B-Amine Pkg.	330.03	1	330.03	29.70	0.1155	
C-Ethoxylated Surf.	0.4444	1	0.4444	0.0400	0.8743	
D-Add'l Eth. Surf	16.00	1	16.00	1.44	0.4423	
AB	5.44	1	5.44	0.4900	0.6112	
AC	20.25	1	20.25	1.82	0.4059	
AD	4.69	1	4.69	0.4225	0.6331	
BC	0.0278	1	0.0278	0.0025	0.9682	
BD	0.2500	1	0.2500	0.0225	0.9052	
CD	9.00	1	9.00	0.8100	0.5335	
ABC	0.1111	1	0.1111	0.0100	0.9365	
ABD	1.00	1	1.00	0.0900	0.8145	
ACD	14.69	1	14.69	1.32	0.4557	
BCD	8.03	1	8.03	0.7225	0.5515	
<b>Residual</b>	11.11	1	11.11			
<b>Cor Total</b>	427.33	15				

# Factorial Results

## Model with Main & 2-Factor Interactions:

Response 1: Tapping Torque

Source	Sum of Squares	df	Mean Square	F-value	p-value	
<b>Model</b>	392.39	10	39.24	5.61	0.0353	significant
A-Carrier Oil	6.25	1	6.25	0.8943	0.3877	
B-Amine Pkg.	330.03	1	330.03	47.22	0.0010	
C-Ethoxylated Surf.	0.4444	1	0.4444	0.0636	0.8109	
D-Add'l Eth. Surf	16.00	1	16.00	2.29	0.1907	
AB	5.44	1	5.44	0.7790	0.4179	
AC	20.25	1	20.25	2.90	0.1495	
AD	4.69	1	4.69	0.6717	0.4497	
BC	0.0278	1	0.0278	0.0040	0.9522	
BD	0.2500	1	0.2500	0.0358	0.8574	
CD	9.00	1	9.00	1.29	0.3079	
<b>Residual</b>	34.94	5	6.99			
<b>Cor Total</b>	427.33	15				

**Barely  
significant**

# Factorial Results

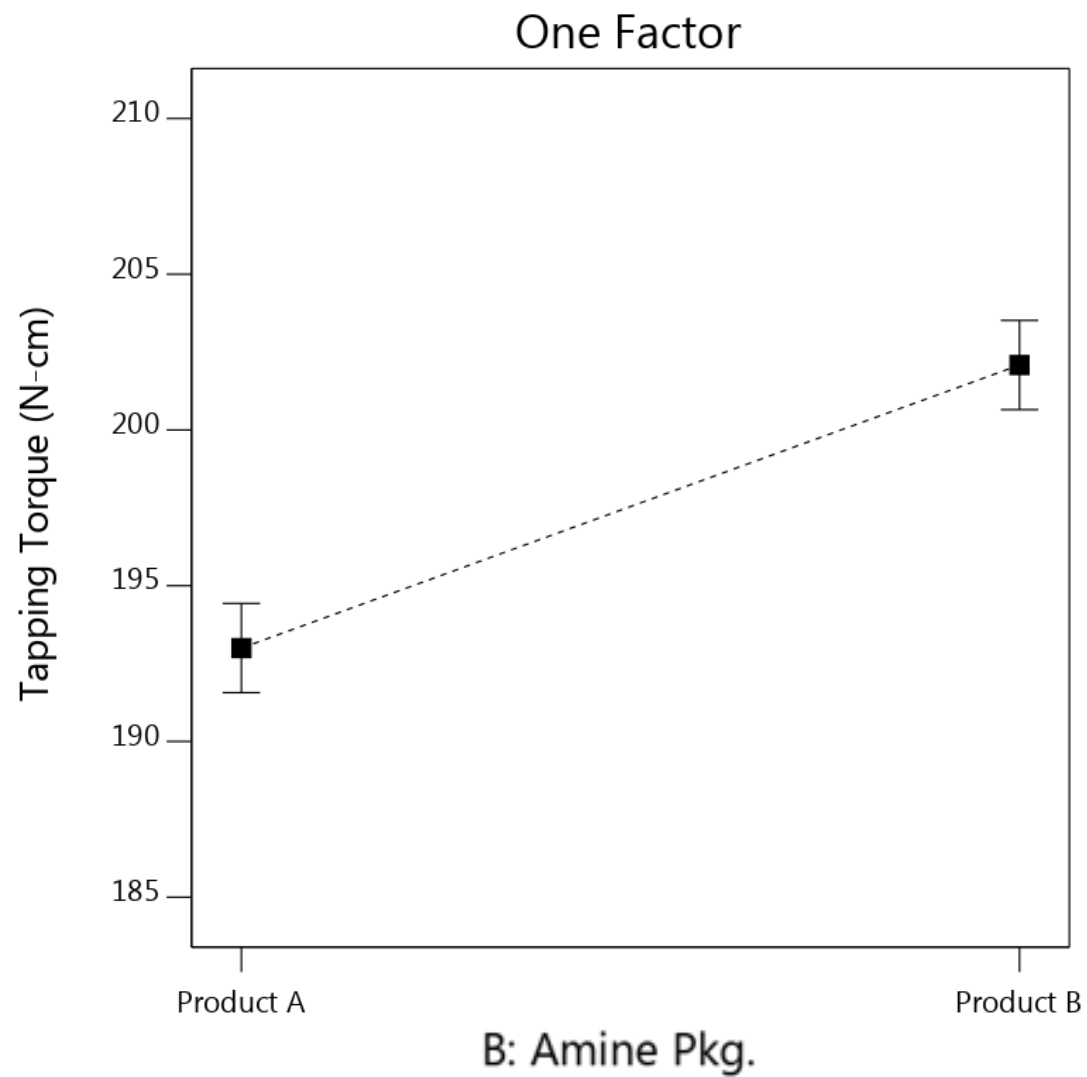
## Main Effects Model:

### Response 1: Tapping Torque

Source	Sum of Squares	df	Mean Square	F-value	p-value	
<b>Model</b>	352.72	4	88.18	13.00	0.0004	significant
A-Carrier Oil	6.25	1	6.25	0.9214	0.3577	
B-Amine Pkg.	330.03	1	330.03	48.66	< 0.0001	
C-Ethoxylated Surf.	0.4444	1	0.4444	0.0655	0.8027	
D-Add'l Eth. Surf	16.00	1	16.00	2.36	0.1528	
<b>Residual</b>	74.61	11	6.78			
<b>Cor Total</b>	427.33	15				

<b>Std. Dev.</b>	2.60		<b>R<sup>2</sup></b>	0.8254	
<b>Mean</b>	199.33		<b>Adjusted R<sup>2</sup></b>	0.7619	
<b>C.V. %</b>	1.31		<b>Predicted R<sup>2</sup></b>	0.6306	
			<b>Adeq Precision</b>	8.7003	

# Factorial Results





**Further Exploration**

# The Starting Point

- » **Amines are affecting machining performance**
- » **Questions that arose:**
  - Which amines are having the strongest effect?
  - Does total amine make a difference?
  - Can we tailor amine packages to desired performance?
- » **The best way to answer these questions was with a mixture design**

# The Design

- **Investigating 6 amines:**
  - 3 are in Product B
  - 3 are new amines
  - *Not investigating the amine package of Product A*
- » **Formulating to a total of 135.9 amine milli-equivalents**
- » **Assessing each amine over a different range:**
  - Based on usage guidelines
- » **Experimental logistics:**
  - Optimal design setup with Design-Expert® software
  - Augmented simplex lattice
  - Additional lack of fit points for better coverage
  - 2 blocks of 22 samples each
  - **Adequate fraction of design space (FDS)**

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# The “Dummy Factor”

- » **A mixture-amount technique**
- » **Allows us to vary the total amount of material**
- » **Adds one extra component to the experiment**
- » **Does not contribute active material**
  - **Adds inert material**
  - **Reduces the total active material**

<b>Dummy %</b>	<b>Active %</b>	<b>Perceived Total %</b>
<b>0</b>	<b>100</b>	<b>100</b>
<b>5</b>	<b>95</b>	<b>100</b>
<b>10</b>	<b>90</b>	<b>100</b>
<b>⋮</b>	<b>⋮</b>	<b>⋮</b>

# Experimental Setup

Component	Low	High
Amine A	0	82.0
Amine B	0	42.7
Amine C	0	27.6
Amine D	15.2	30.5
Amine E	0	22.5
Amine F	0	39.7
Dummy	0	67.95
<b>Total</b>	<b>135.9 milli-equivalents</b>	

# Experimental Results

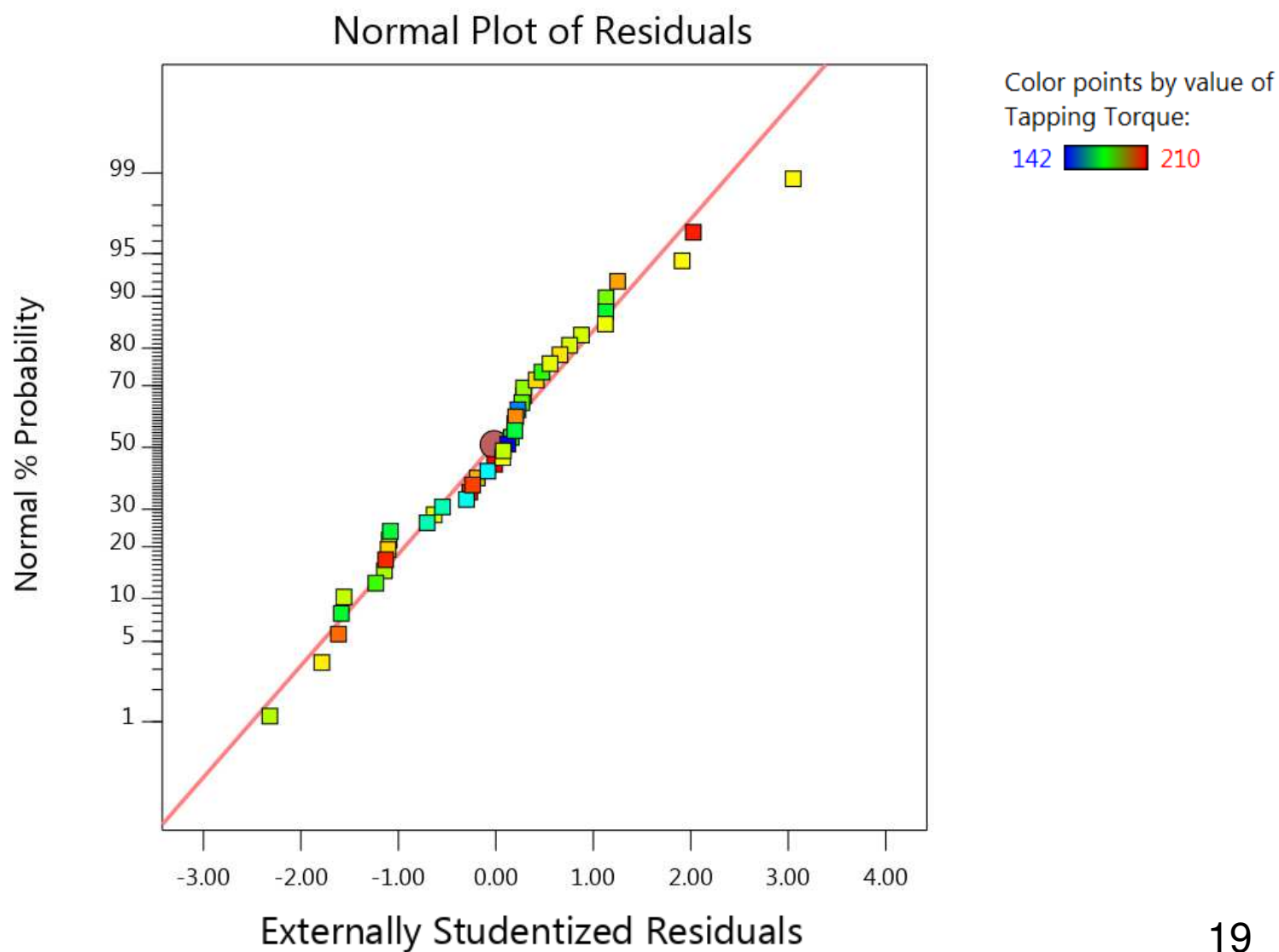
## Reduced Special Cubic Model

Source	Sum of Squares	df	Mean Square	F-value	p-value	
Block	37.59	1	37.59			
<b>Model</b>	10795.21	23	469.36	115.90	< 0.0001	significant
<sup>(1)</sup> Linear Mixture	8825.42	6	1470.90	363.20	< 0.0001	
AB	0.2477	1	0.2477	0.0612	0.8073	
AC	192.90	1	192.90	47.63	< 0.0001	
AD	180.12	1	180.12	44.48	< 0.0001	
AE	4.63	1	4.63	1.14	0.2984	
AF	149.20	1	149.20	36.84	< 0.0001	
AG	121.53	1	121.53	30.01	< 0.0001	
BC	214.16	1	214.16	52.88	< 0.0001	
BD	85.22	1	85.22	21.04	0.0002	
BE	4.16	1	4.16	1.03	0.3234	
BG	85.20	1	85.20	21.04	0.0002	
CD	339.67	1	339.67	83.87	< 0.0001	
CE	35.54	1	35.54	8.78	0.0080	
CF	13.64	1	13.64	3.37	0.0822	
CG	47.29	1	47.29	11.68	0.0029	
DF	18.29	1	18.29	4.52	0.0469	
ABD	125.85	1	125.85	31.08	< 0.0001	
ABE	44.10	1	44.10	10.89	0.0038	
<b>Residual</b>	76.95	19	4.05			
Lack of Fit	57.56	15	3.84	0.7916	0.6725	not significant
Pure Error	19.39	4	4.85			
<b>Cor Total</b>	10909.74	43				

<b>Std. Dev.</b>	2.01	<b>R<sup>2</sup></b>	0.9929
<b>Mean</b>	186.64	<b>Adjusted R<sup>2</sup></b>	0.9844
<b>C.V. %</b>	1.08	<b>Predicted R<sup>2</sup></b>	0.9537
		<b>Adeq Precision</b>	44.9299

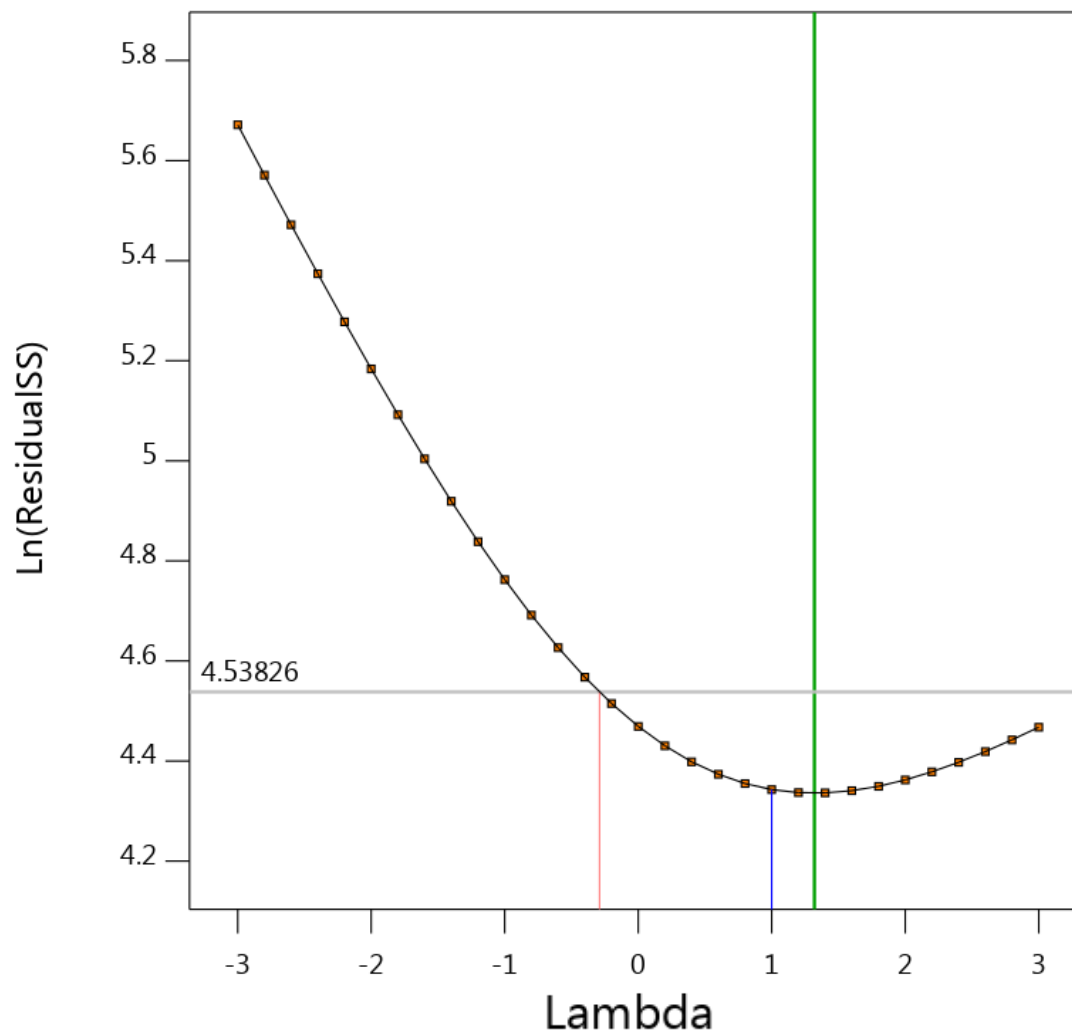
### Response 1: Tapping Torque

# Experiment Diagnostics



# Experiment Diagnostics

Box-Cox Plot for Power Transforms



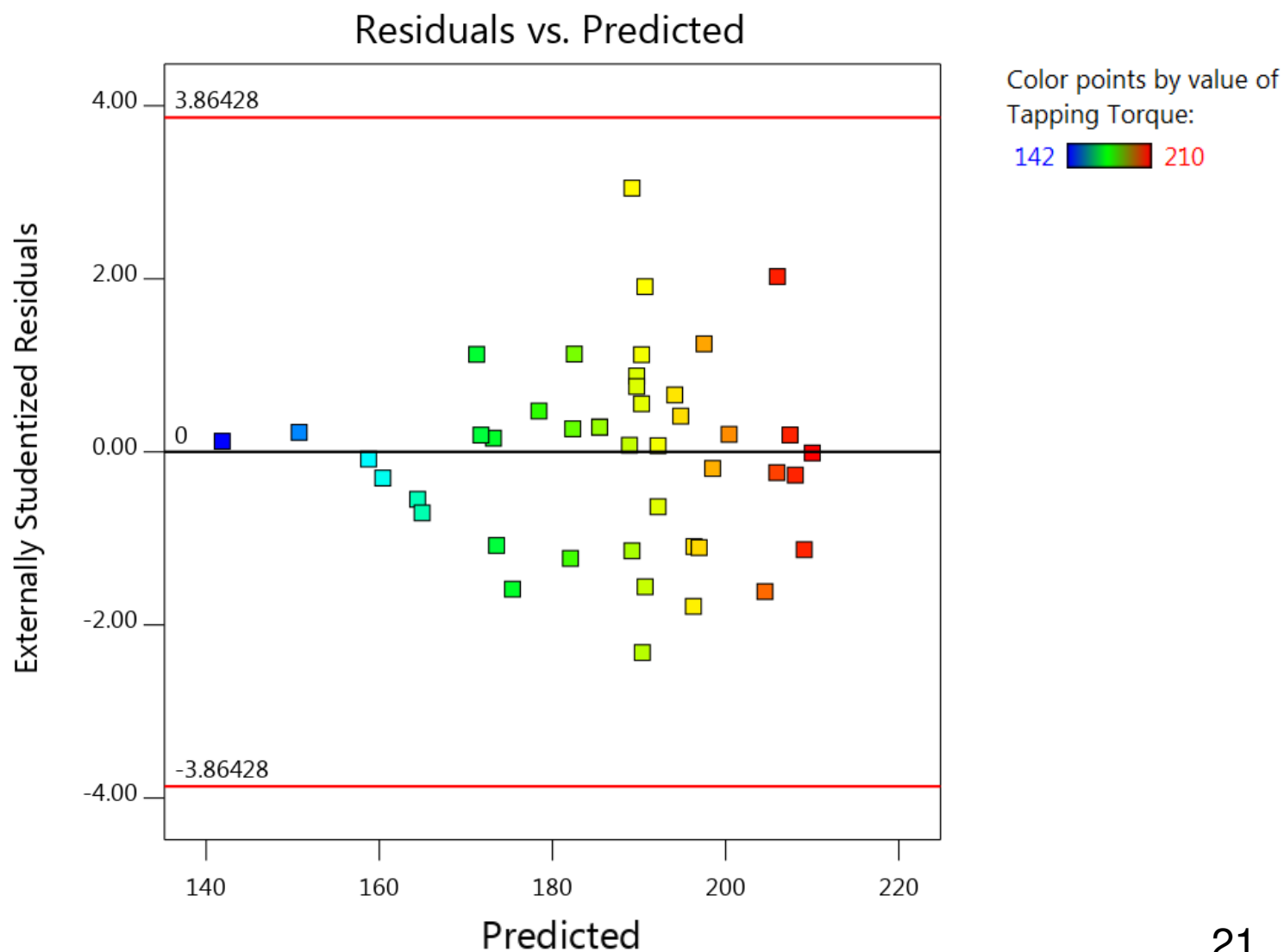
Current Lambda = 1

Best Lambda = 1.32

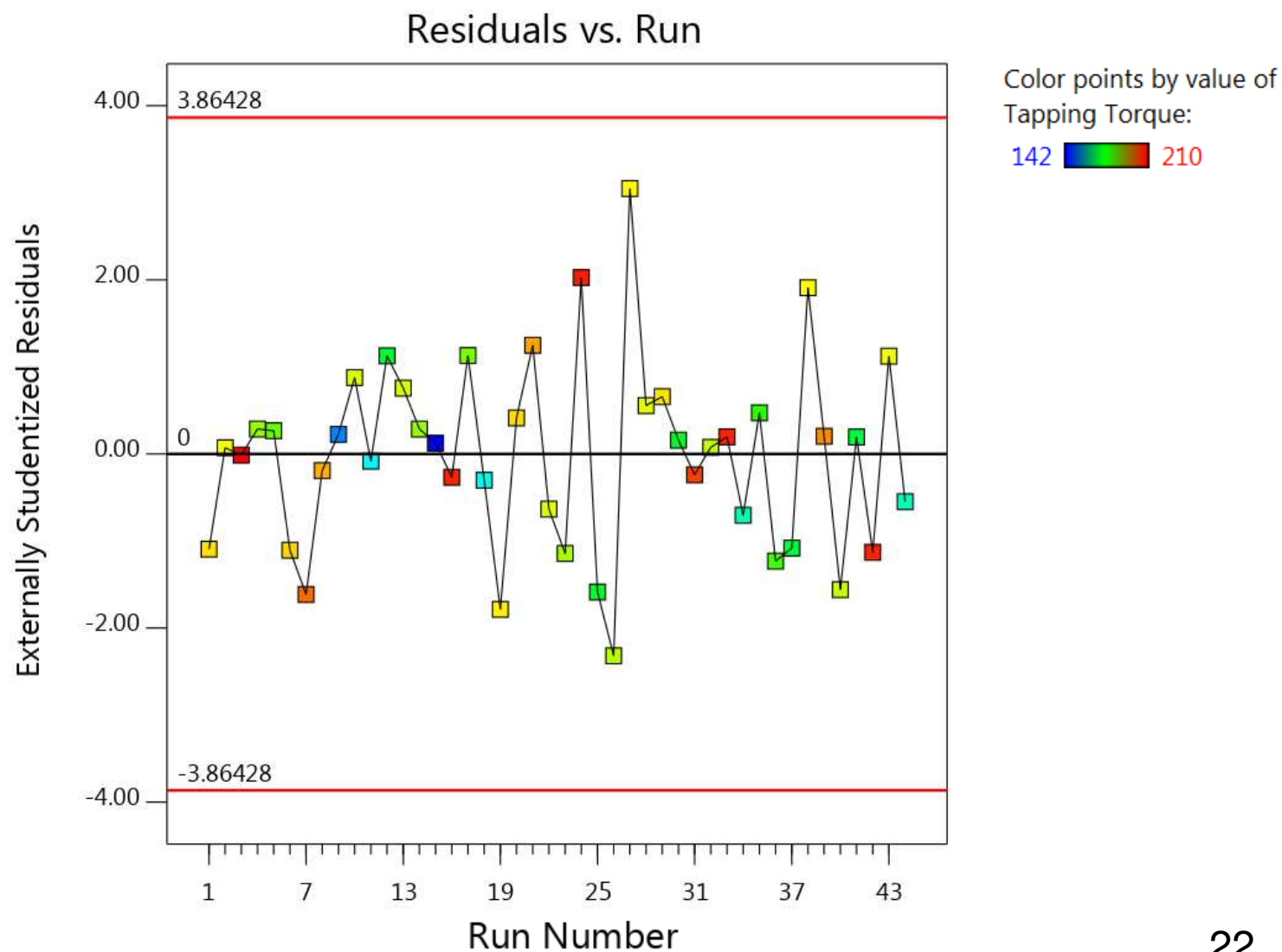
CI for Lambda: (-0.29, 3.5)

Recommended transform:  
None  
(Lambda = 1)

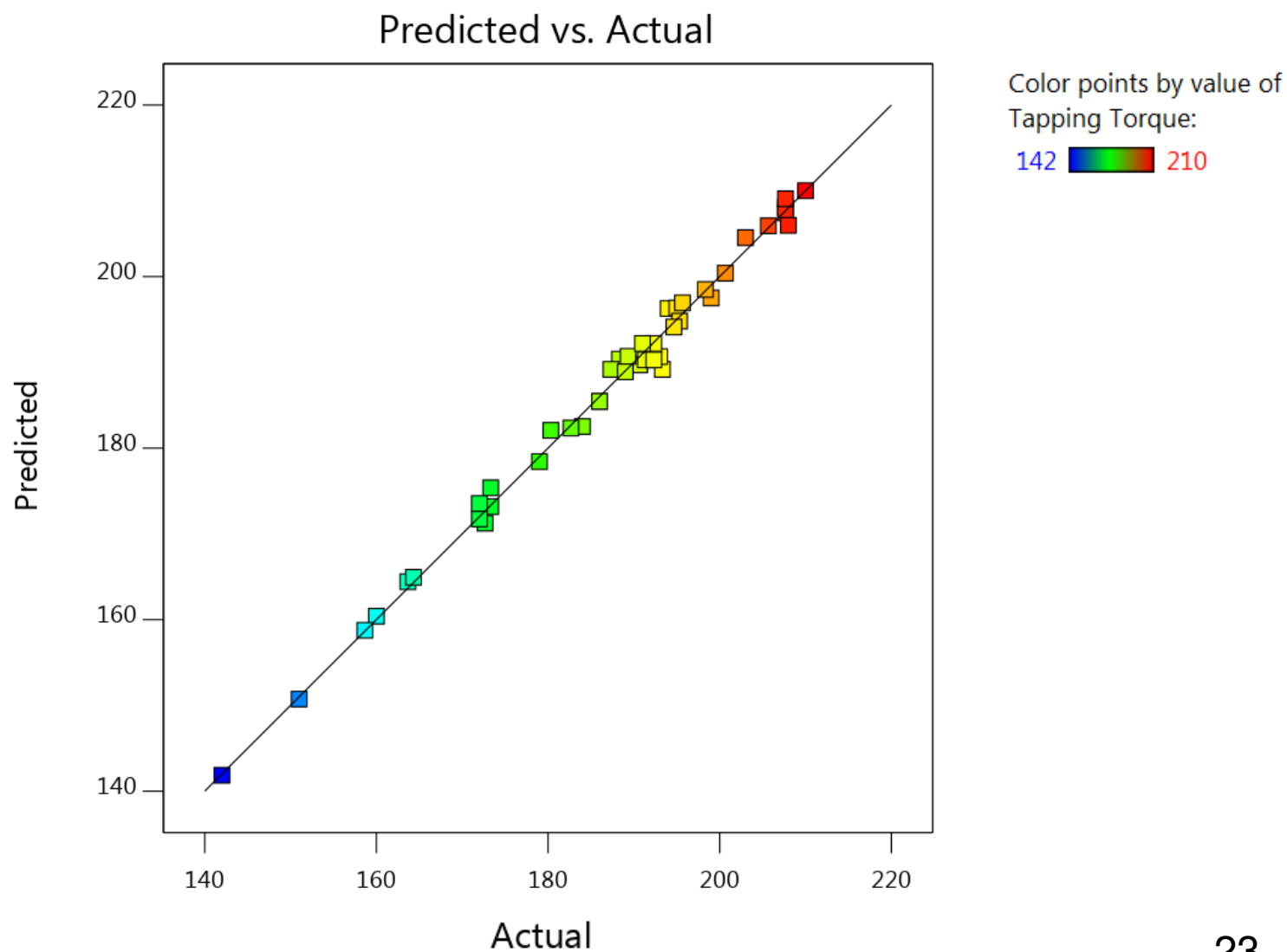
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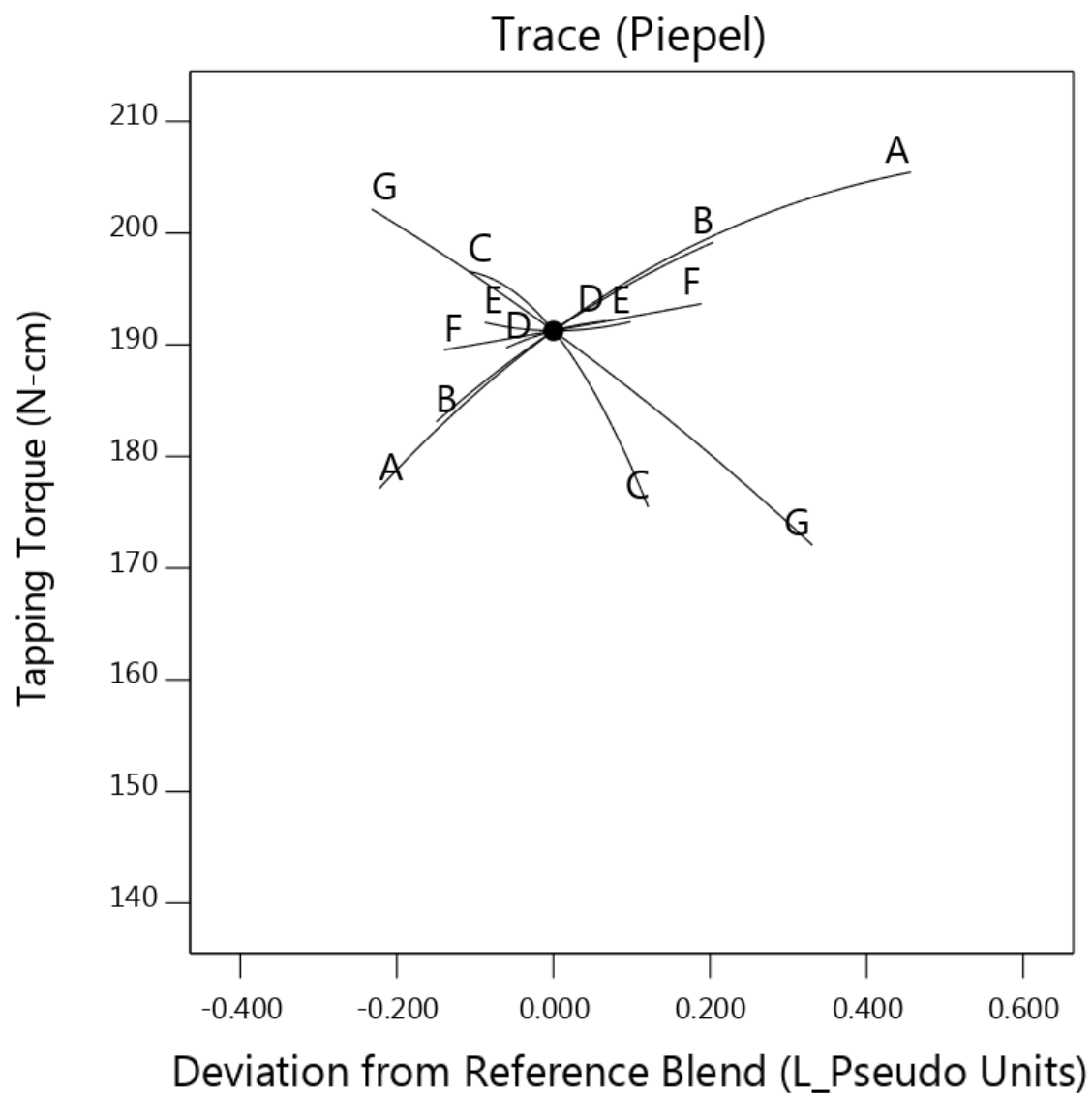
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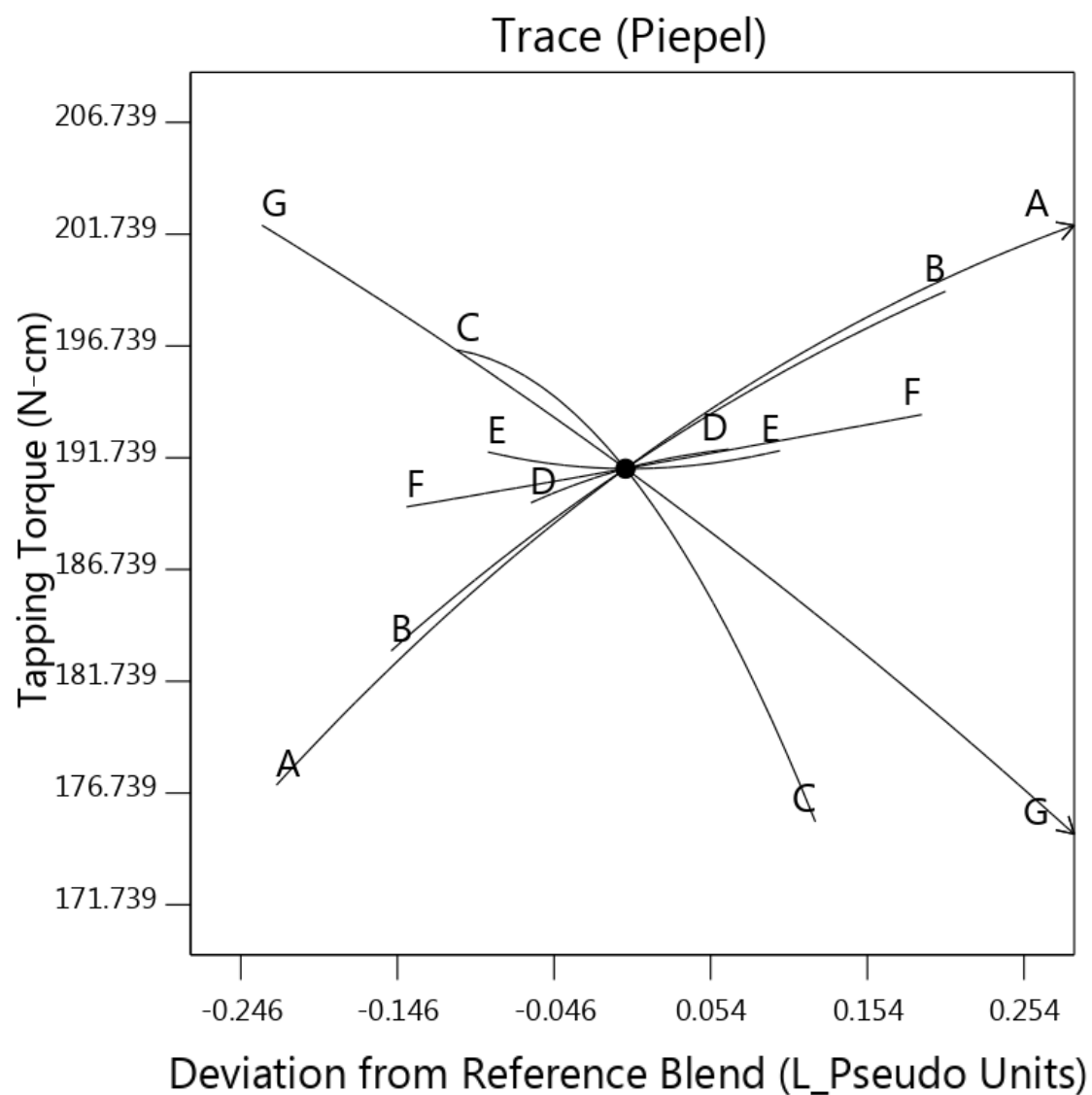
# Trace Plot



## Actual Components

A: Amine A = 0.0268832  
B: Amine B = 0.0180449  
C: Amine C = 0.0129664  
D: Amine D = 0.0225346  
E: Amine E = 0.0106047  
F: Amine F = 0.0168672  
G: Dummy = 0.027999

# Trace Plot

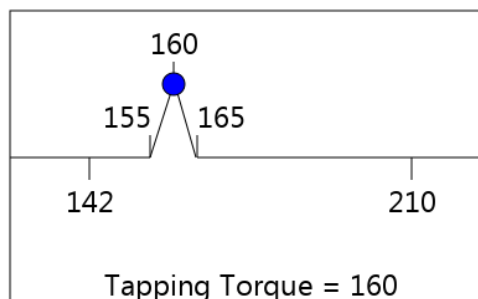
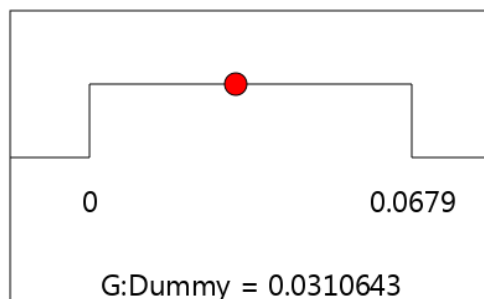
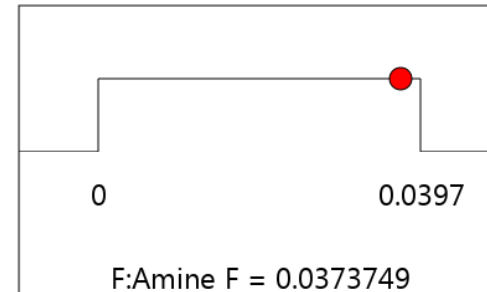
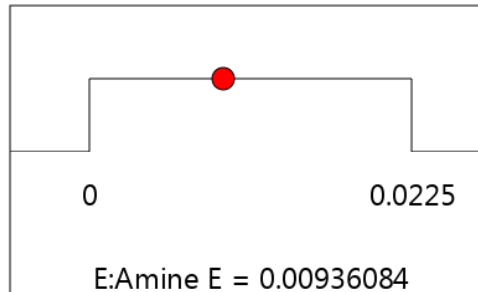
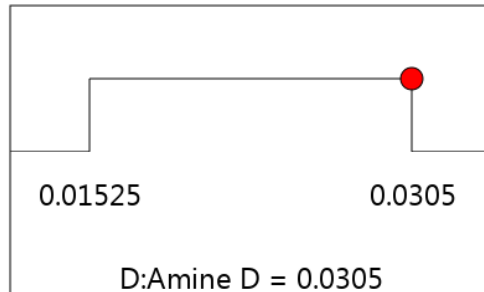
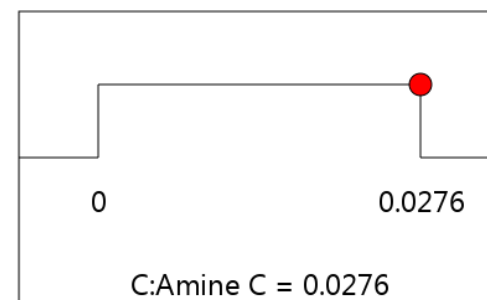
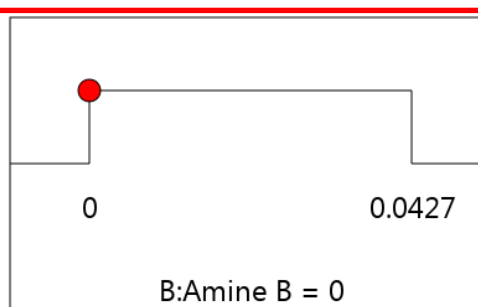
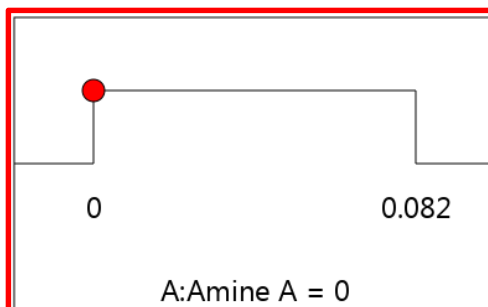


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# Optimizing the Formulation

## Optimal formulations, no component constraints:



**Total mEq: 107.2**  
**Product A: 108.8**

Desirability = 1.000  
Solution 1 out of 81



# Summary and Conclusions

# Summary

- » Major takeaways from the investigation:
  - ***Amines are playing a major role in MWF lubrication***
  - ***The total amount of amine is almost as important as the choice of amines***
- » Experimental design was able to determine the source of the performance issue
- » We can use experimental design and Design-Expert<sup>®</sup> to analyze and optimize amine packages
- » This information is being applied to other MWF development projects
- » Experimental design has a place at Quaker!



# Thank you!

**For questions or comments:**  
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**610-832-7819**