

# INCORPORATING MULTILEVEL TECHNIQUES INTO QUALITY CONTROL CHARTS

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# QUALITY CONTROL IN MENTAL HEALTH

- Evaluate System, Programs, and Client progress
- Allocate and reallocate clinical resources more efficiently
- Improve and maintain clinical program fidelity
- Identify most effective programs based upon consumer needs

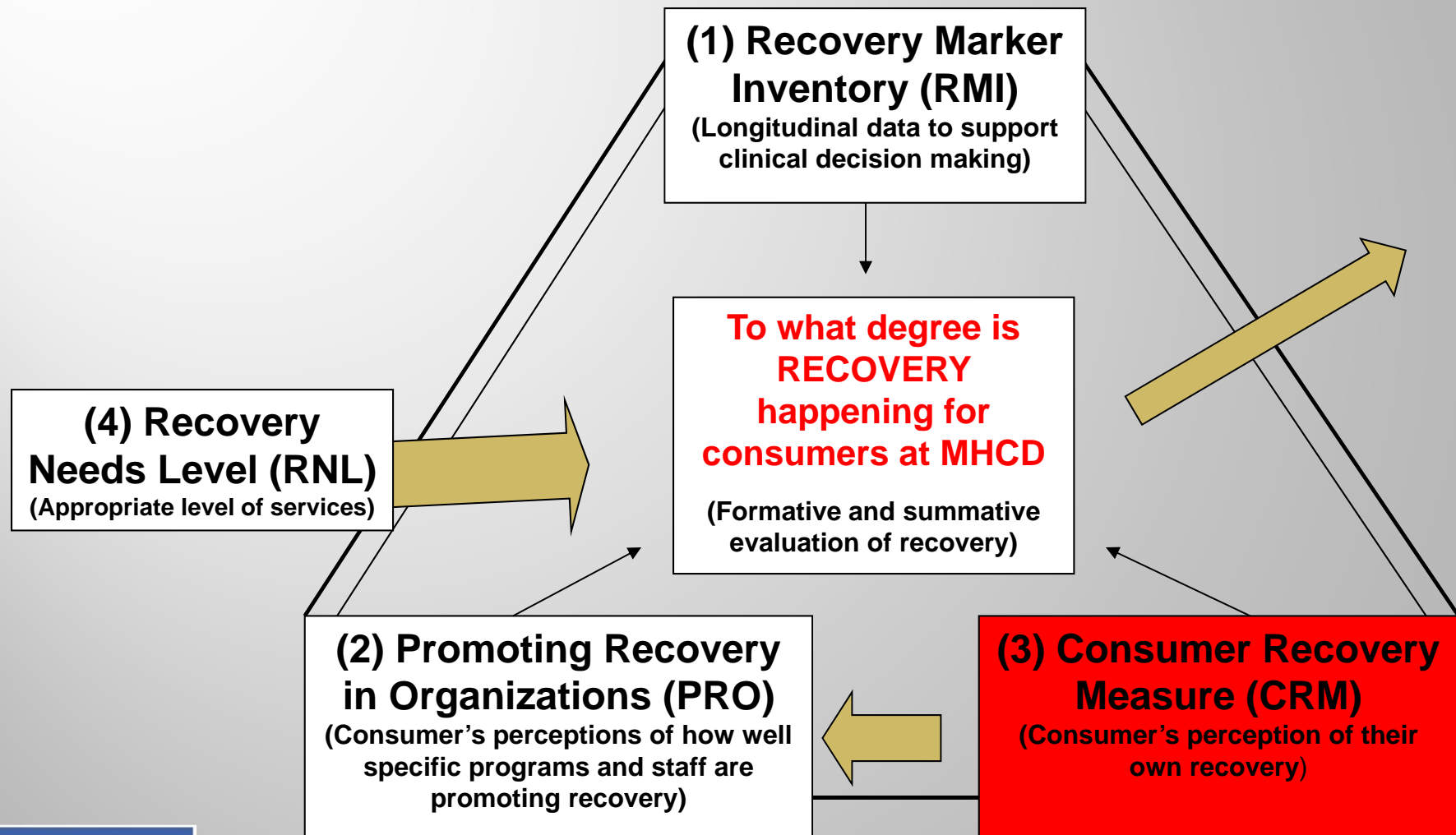
# MENTAL HEALTH RECOVERY

Concept of Recovery has taken root around the world

Working Definition (MHCD):

*“A non-linear process of growth by which people move from lower to higher levels of fulfillment in the areas of hope, safety, level of symptom interference, social networks, and activity.”*

# RECOVERY OUTCOMES



# CONSUMER RECOVERY MEASURE

The CRM V3.0 includes 15 items, some are listed below:

1. Lately I feel like I've been making important contributions (**active-growth**)
2. I have hope for the future (**hope**)
3. There are some people who cause me a lot of fear (**safety**)
4. I get a lot of support during the hard times (social network)
5. Life's pressures lead me to lose control (**symptom interference**)

# QUALITY CONTROL ISSUES IN RECOVERY

- Multiple sources of variability
  - Measurement
  - Consumer
  - Therapist
  - System
- Changing environmental, treatment, and consumer specific factors affect outcome measurements.
- Difficulty in detection of small changes due to large variability within and among consumers

# MULTILEVEL MODELING AND RECOVERY

- Multilevel modeling allows for the partitioning of variance among multiple levels of nesting, i.e. measures within consumers within therapists
- Allows for regression based correction of expected outcomes for any unit at any level, i.e. conditional estimates based upon consumer characteristics in environment or treatment.
- Can be used to simultaneously monitor multiple aspects of the system from measurements to clinical sites.
- Based upon Mixed-Effects ANOVA design

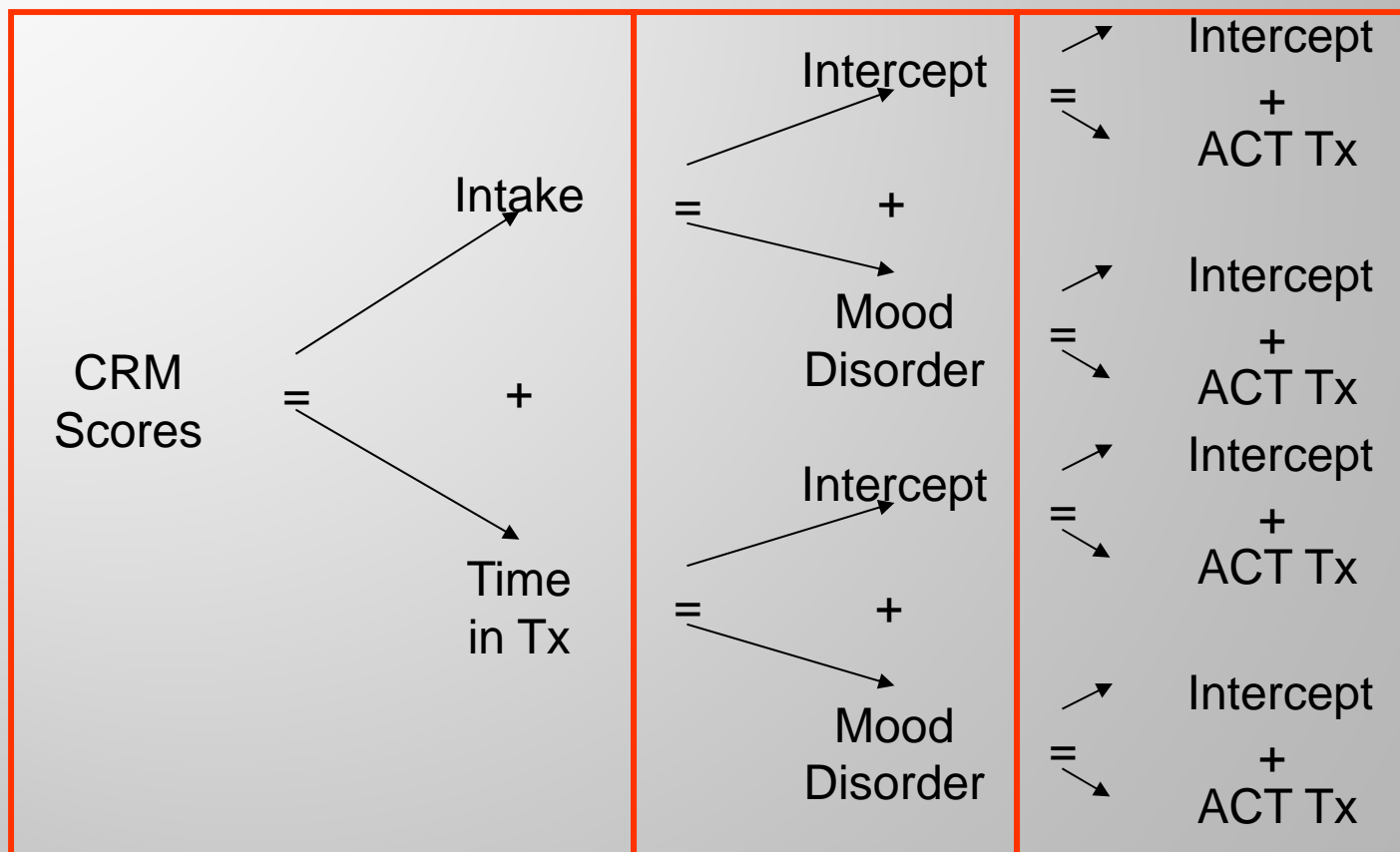


# EXAMPLE OF MULTILEVEL MODELING CONCEPTS

## Consumer Level Effect

### Typical SLR Model

### System Level Effect



Higher Level

Effects

8



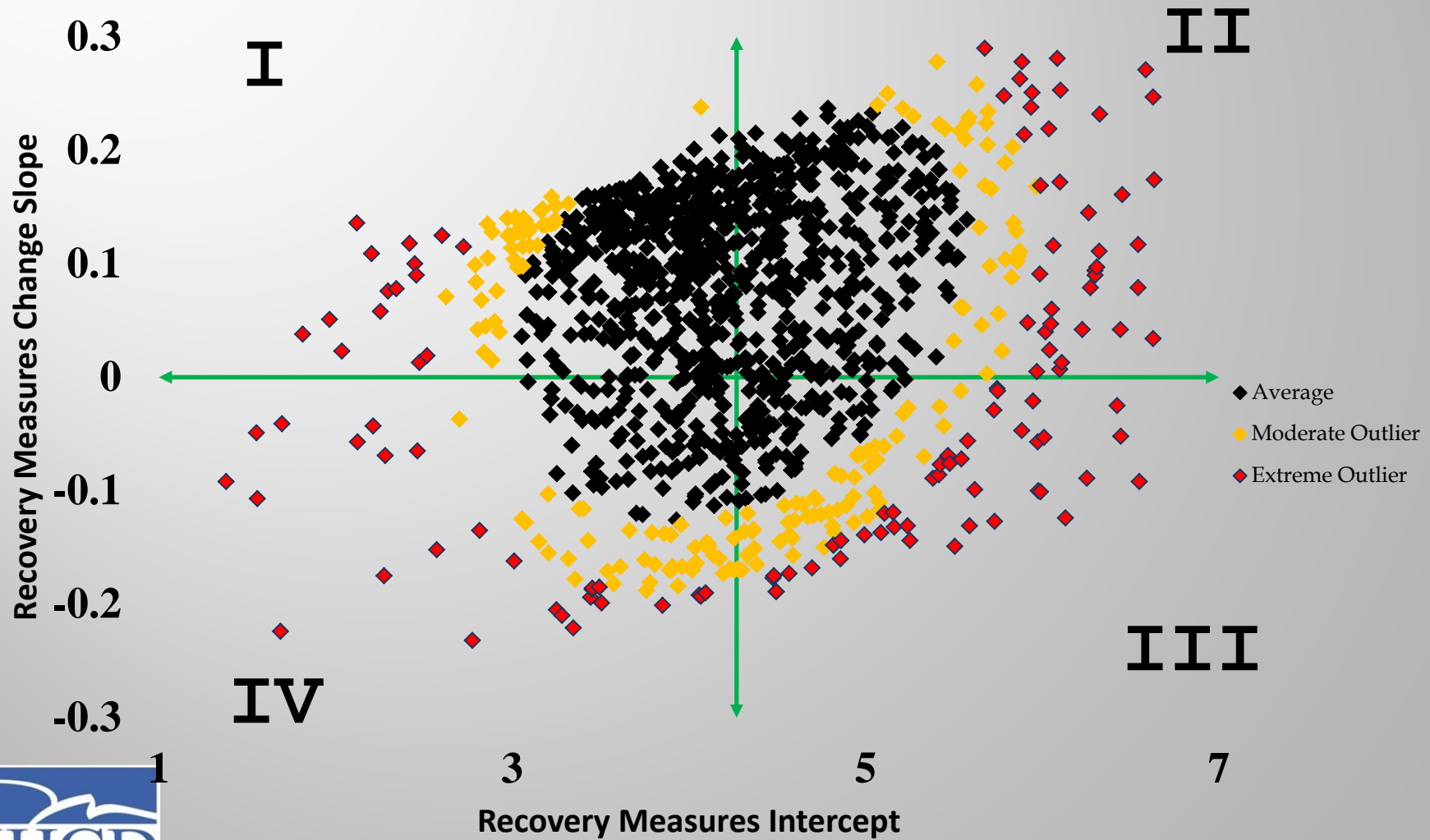
# Applications of ML Control Charts

- Program Level
  - Recovery Change Chart
  - Recovery versus Environmental Support Chart
- Team Level
  - Recovery Change Chart
  - Recovery versus Environmental Support Chart
- Consumer Level
  - Recovery Detection Chart

# Recovery Change Chart

- ▣ Allows view of starting point and rate of change
- ▣ Bivariate Control Chart for plotting of regression parameters (intercept and slopes)
- ▣ Corrects for consumer demographics, environmental factors, and treatment factors.
  - Allows for standardized comparisons

# Recovery Change Chart



# Interpretation

## CRM Intercept

BELOW  
AVG.

ABOVE  
AVG.

CRM Slope

Decreasing  
Increasing

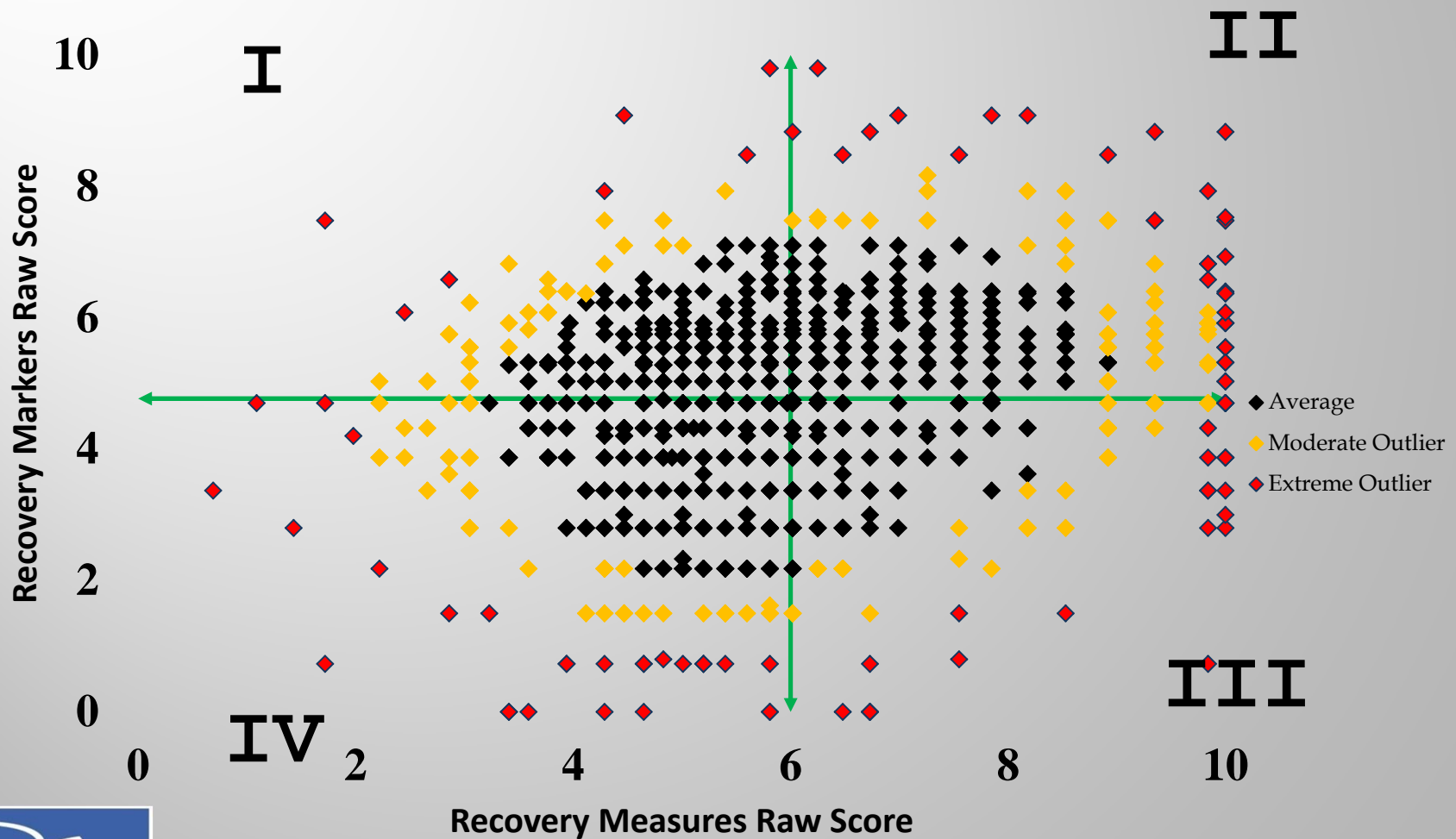
I	II
IV	III

**NOTE: ANY Outlier within a quadrant indicates it is farther away from the average than would be expected under typical circumstances.**

# Recovery versus Environmental Chart

- ▣ Allows simultaneous view of raw recovery and environmental scores

# Recovery versus Environmental Factors Chart



# Interpretation

## RECOVERY MEASURES

### RECOVERY MARKERS

		BELOW AVG.	ABOVE AVG.
RECOVERY MARKERS	ABOVE AVG.	<b>I</b>	<b>II</b>
	BELOW AVG.	<b>IV</b>	<b>III</b>

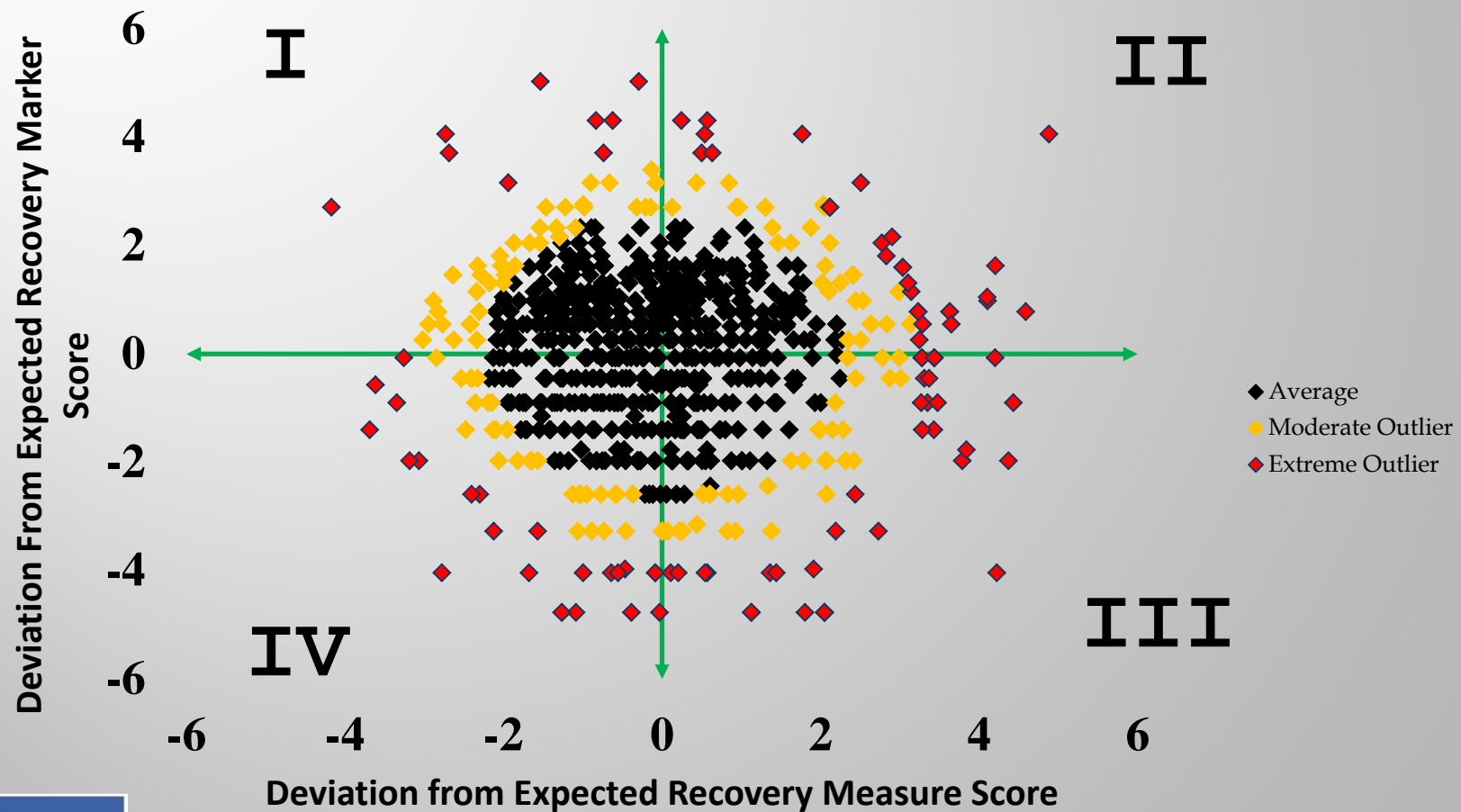
**NOTE: ANY Outlier within a quadrant indicates it is farther away from the average RMI and CRM than would be expected under typical circumstances.**



# Recovery versus Environmental Chart – ML Corrected

- ▣ Allows for simultaneous view of consumer deviations from the Multi-level predicted recovery and environmental scores.
- ▣ ML model corrects for consumer demographics, environmental, and treatment factors.

# Recovery versus Environmental Factors Chart – ML Corrected



# Interpretation

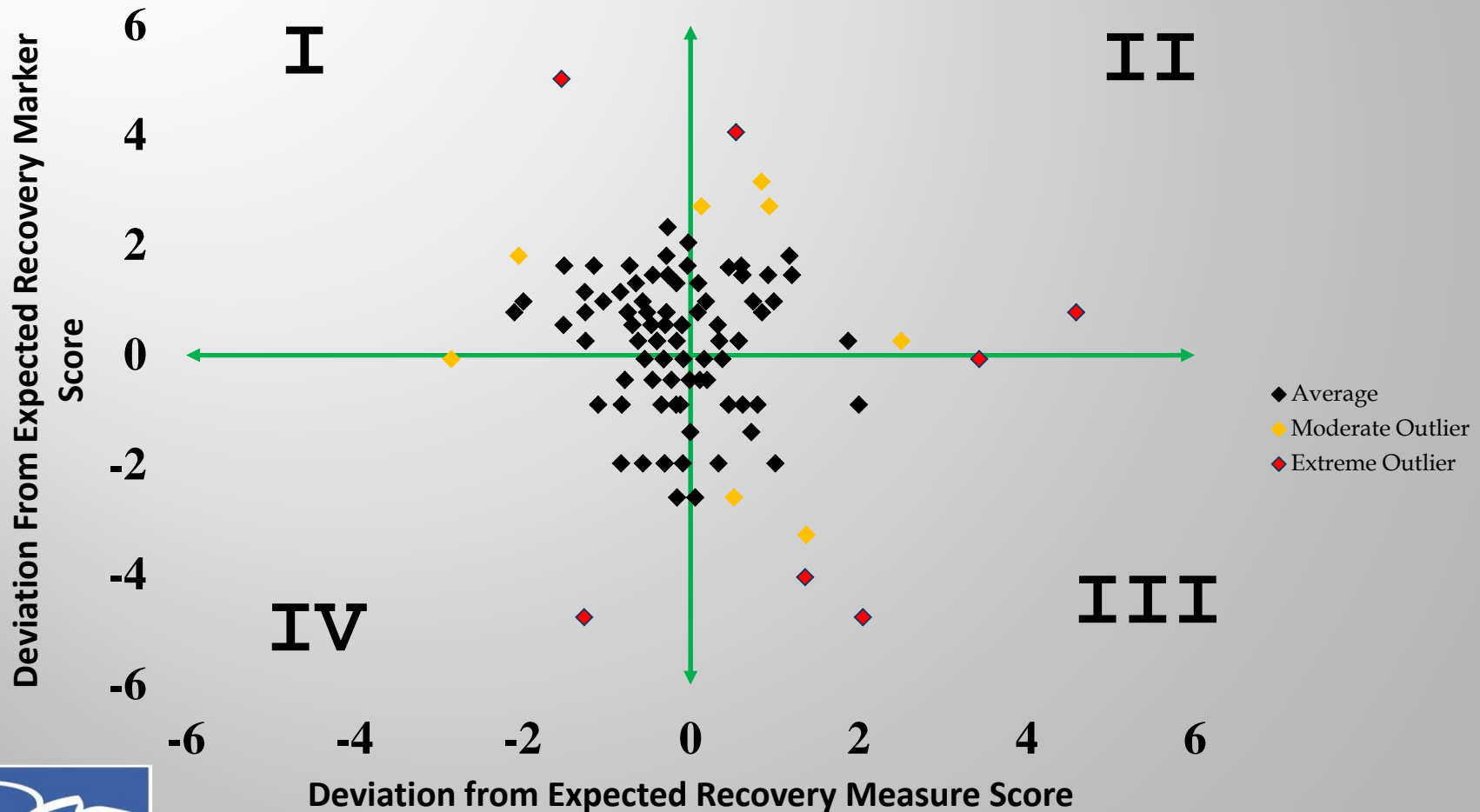
## RECOVERY MEASURES

### RECOVERY MARKERS

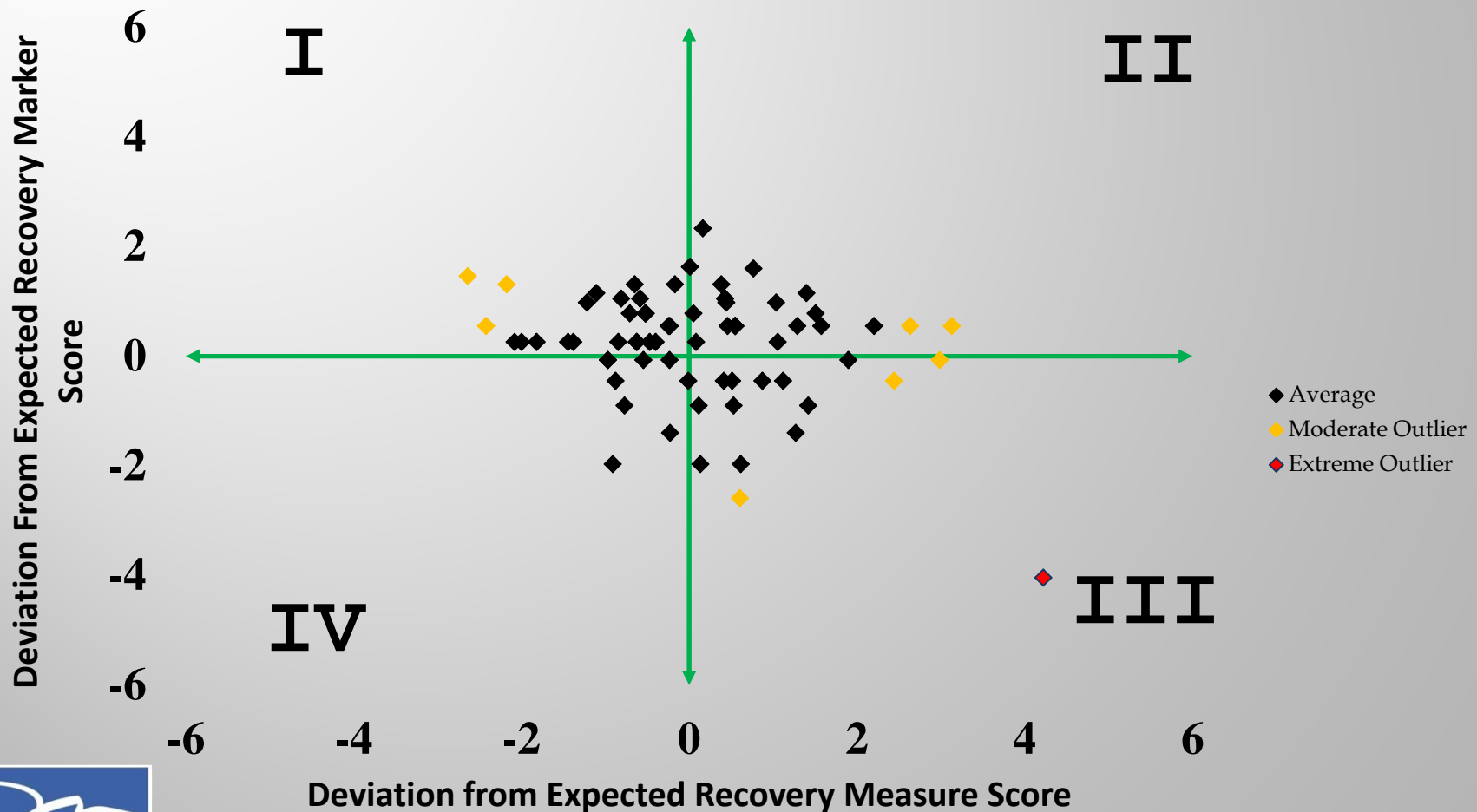
		BELOW Expected	ABOVE Expected
RECOVERY MARKERS	ABOVE Expected	<b>I</b>	<b>II</b>
	BELOW Expected	<b>IV</b>	<b>III</b>

**NOTE: ANY Outlier within a quadrant indicates it is farther away from the expected RMI and CRM than would be typical.**

# Recovery versus Environmental Factors Chart ML Corrected-Team Level



# Recovery versus Environmental Factors Chart ML Corrected-Team Level



# UTILIZATION OF BIVARIATE CONTROL CHART

- Identify “outlying” consumers to help determine aspects of a program that promote self-perceived recovery, and those aspects that may be a deterrent to improvement in self-perceived recovery.
- Allow for identification of consumers who may need further resources or different treatment.
- Allows for overview of consumer progress, where comparisons over time may allow for evaluation of process changes and overall consumer effect.

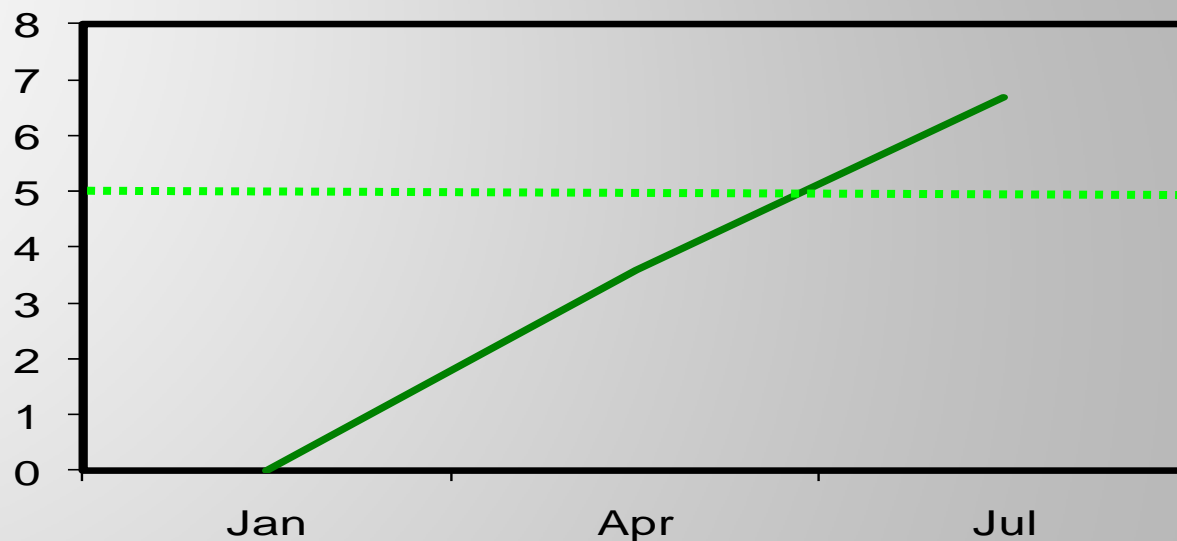
# RECOVERY DETECTION CHART

- CUSUM for Consumers (between consumer comparisons)
- 2 Parts
  - Self-Comparing – Accumulates residuals from consumer's comparison point
  - Peer-Comparing – Accumulates residuals from ML predicted values.
- Allows for determination of a consumer's progress as compared to themselves and peers in same treatment with environmental and demographic similarities

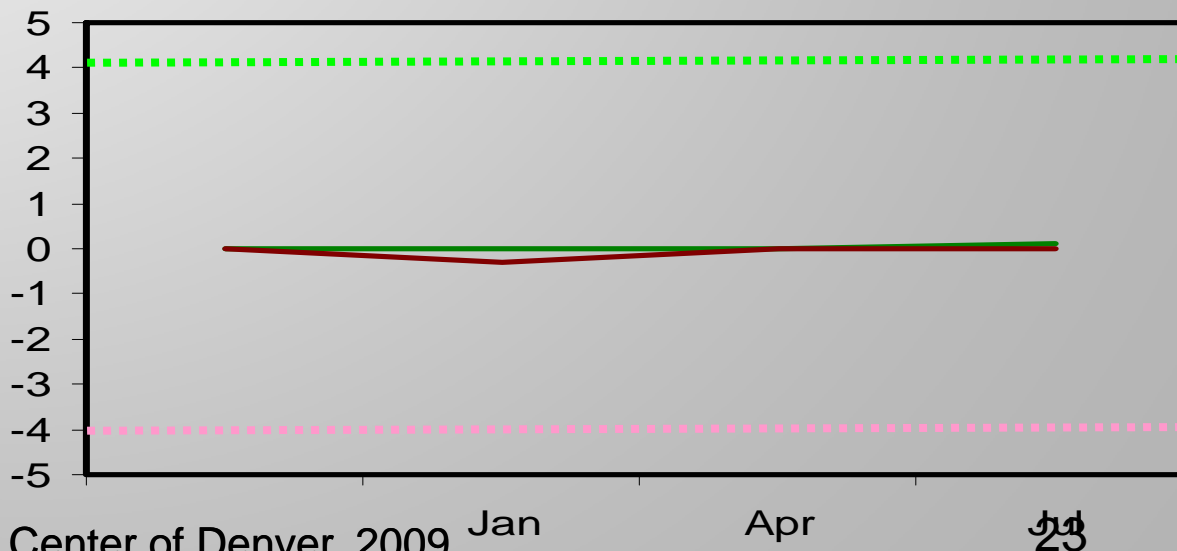


# EXAMPLE ML CORRECTED RECOVERY DETECTION CHART

Self-Comparing  
CUSUM

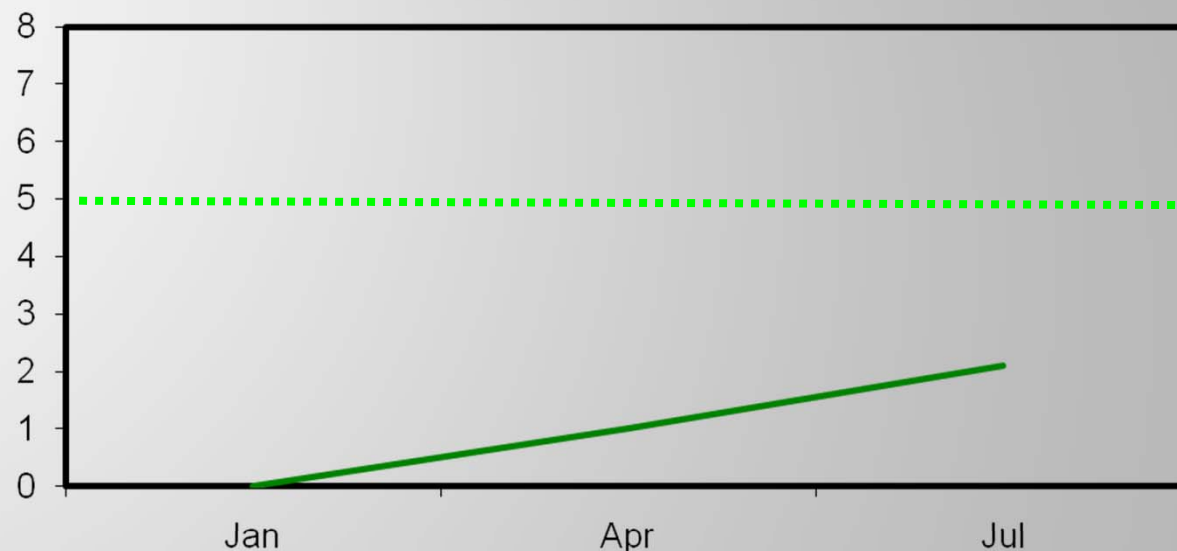


Peer-Comparing  
CUSUM

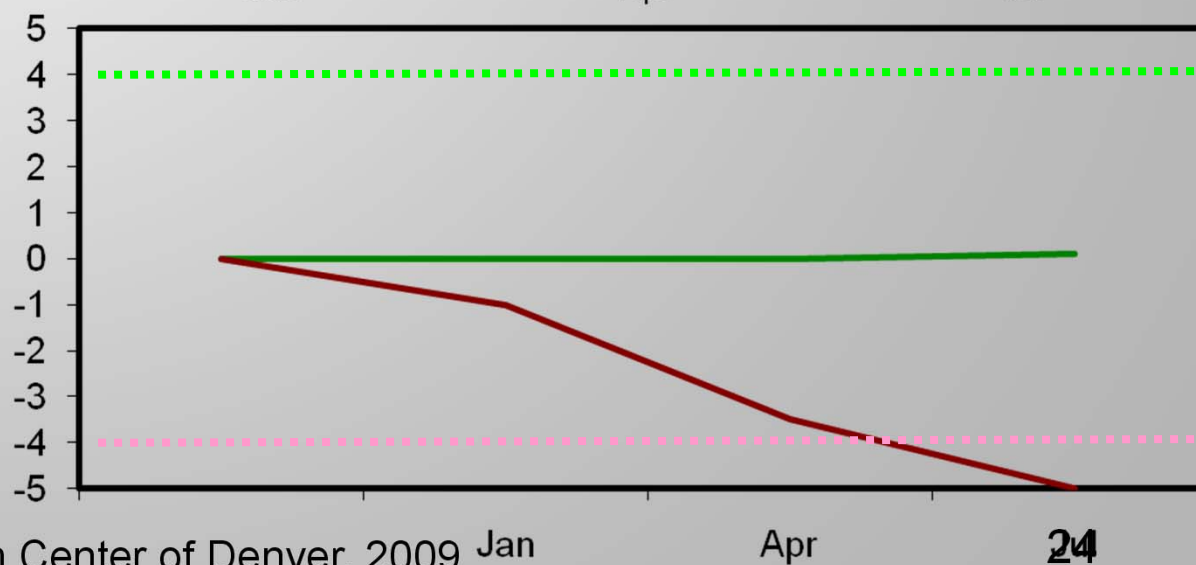


# EXAMPLE ML CORRECTED RECOVERY DETECTION CHART

Self-Comparing  
CUSUM



Peer-Comparing  
CUSUM



# SUMMARY OF BENEFITS

- Allow for more efficient allocation of treatment and resources.
- Identify program aspects that promote or deter improvement in self-perceived recovery.
- Identify consumer in need of additional treatment or resources.
- Allow for the identification of consumer and system factors that affect or interact with consumer outcomes and program effectiveness.
- Being able to cater to differing needs of the wide variety of consumers served.
- Identification of Episodes of Care

# FUTURE DIRECTIONS

- Identify clinically significant patterns
- Develop objective method for interpretation by clinical staff
- Expand to other recovery measures and aspects.
- Coordinate with data mining to identify relationships between services and recovery outcomes
- Automate quality control process

# LITERATURE

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# QUESTIONS???

## MORE INFORMATION.....

**If you would like to see more information  
concerning MHCD's work with Recovery please  
visit:**

**<http://www.outcomesmhcd.com/>**