

National Academy of Sciences
*Role of Physical Activity in Obesity Treatment and
Related Health Outcomes in Adults*
July 29th, 2025.



***Individual Differences in Body Composition and
Cardiometabolic Response to Exercise***

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Medicine, Division of Endocrinology and Metabolism
Queen's University
Kingston, Ontario, Canada

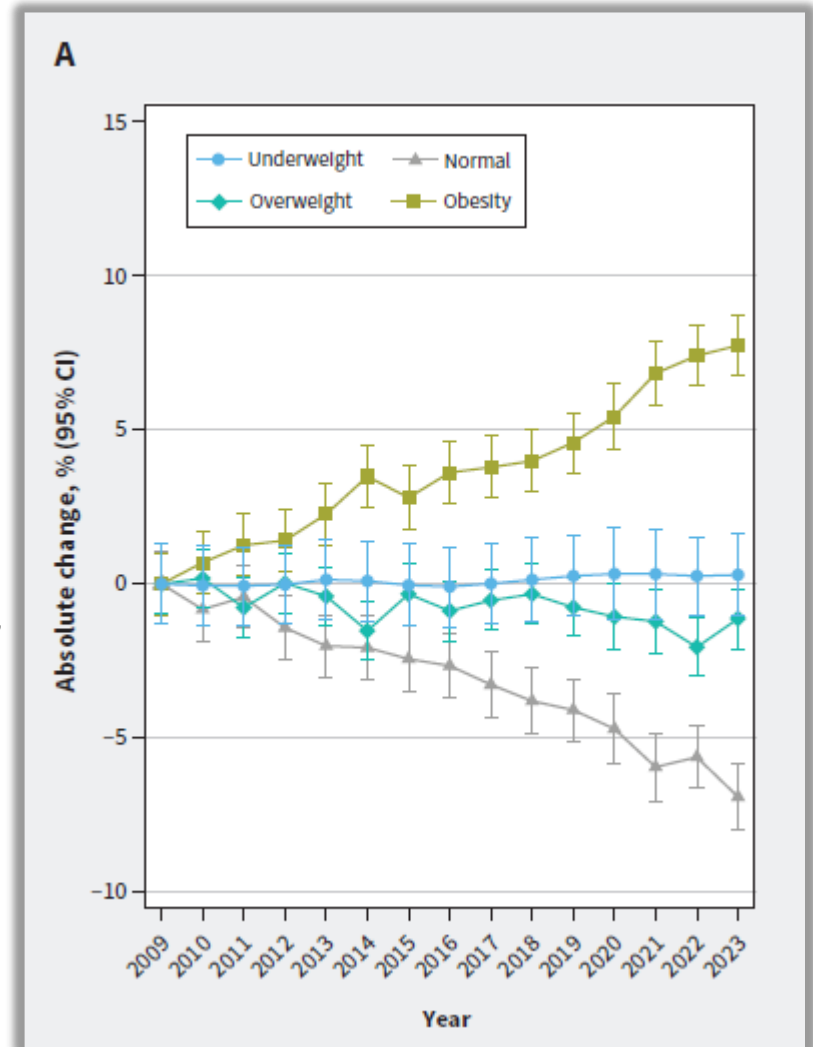


I have no financial or non-financial relationships, interests, or affiliations to disclose

Trends in obesity defined by body mass index among adults before and during the COVID-19 pandemic: a repeated cross-sectional study of the 2009–2023 Canadian Community Health Surveys

Laura N. Anderson PhD, Rabiul Islam PhD, Arthur Sweetman PhD

“Prevalence of BMI-defined obesity increased from 24.9% in 2009 to 32.7% in 2023 (absolute increase 7.7%).”



Physical Activity and Obesity Management: Individual Variability

Section 1:

In what context do we consider individual variability in response to exercise?

Section 2:

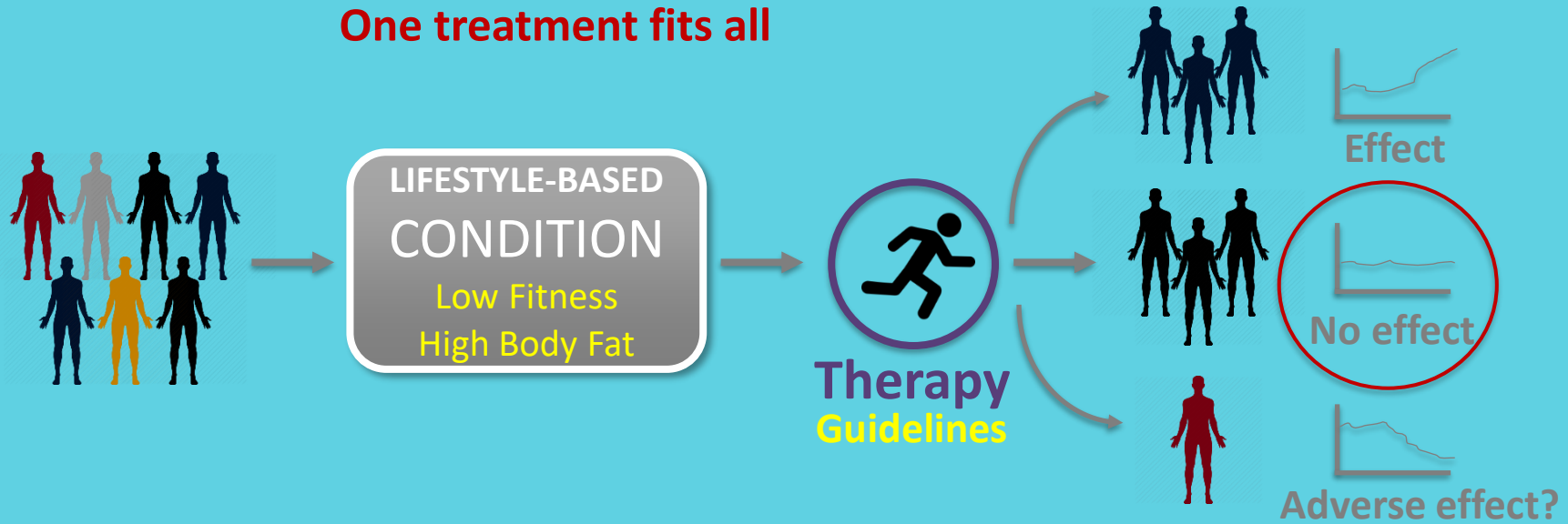
Determining the existence of exercise-induced variability for any trait *is a complex issue*.

Section 3:

Summary observations regarding exercise-induced variability in body composition and selected cardiometabolic risk factors.

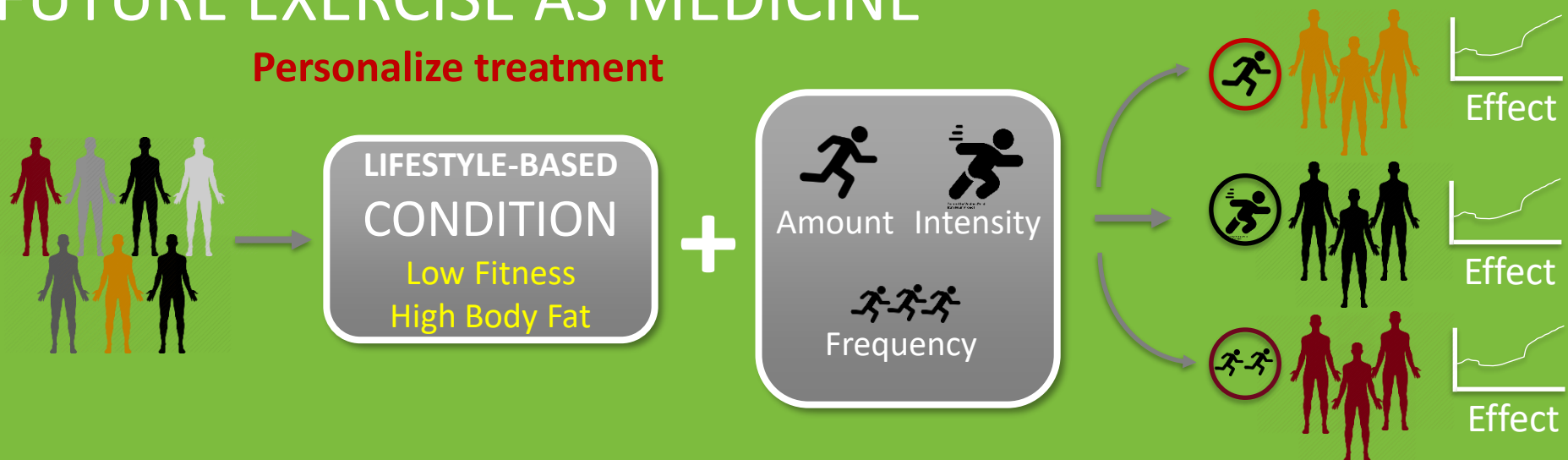
CURRENT EXERCISE AS MEDICINE

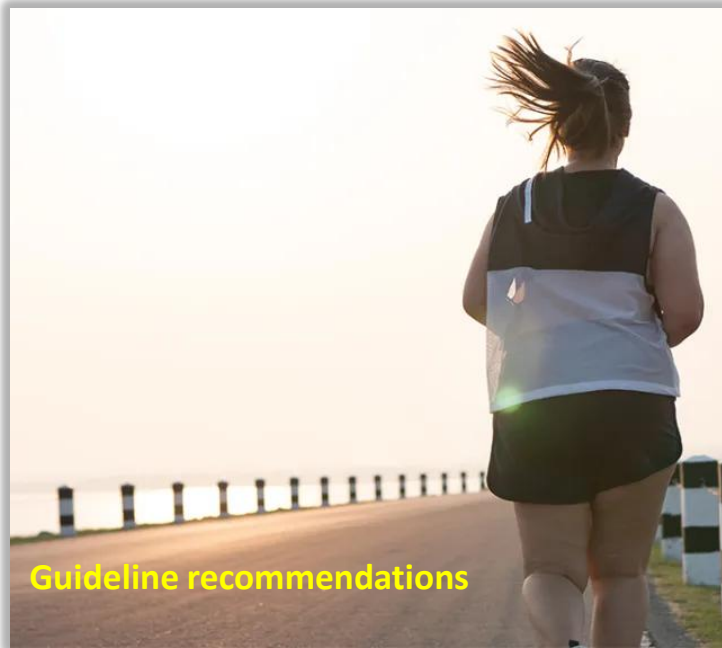
One treatment fits all



FUTURE EXERCISE AS MEDICINE

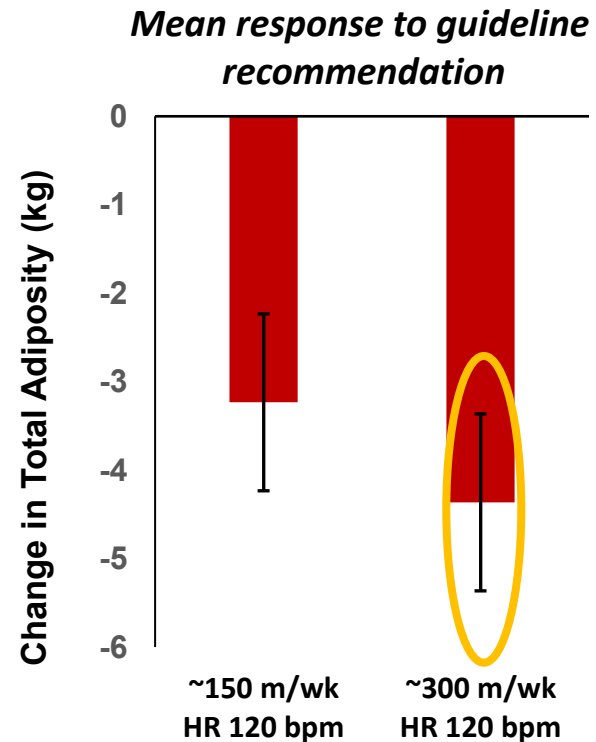
Personalize treatment



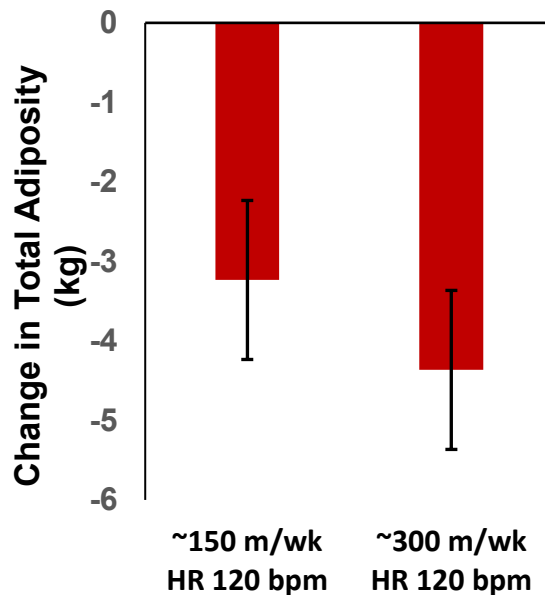


Obesity management guidelines worldwide prescribe increased aerobic-type physical activity (such as brisk walking) for more than 150 minutes per week.

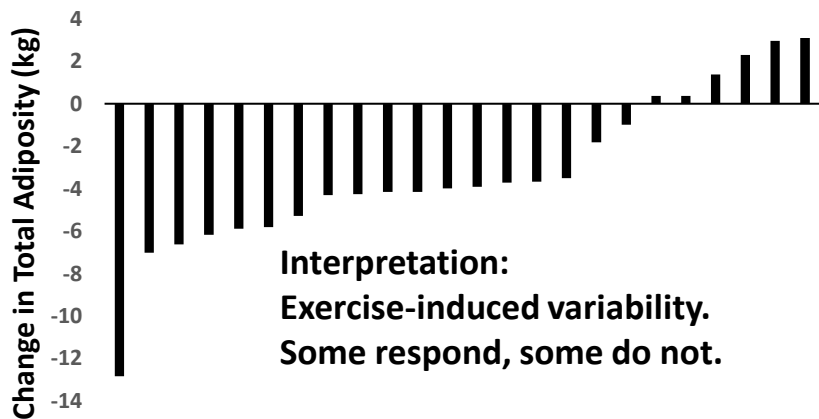
American College of Sports Medicine Position Stands, recommend 200 to 300 minutes a week for long-term weight loss.



Individual variation in adipose tissue (MRI) response at 24 weeks to standardized exercise in adults with obesity

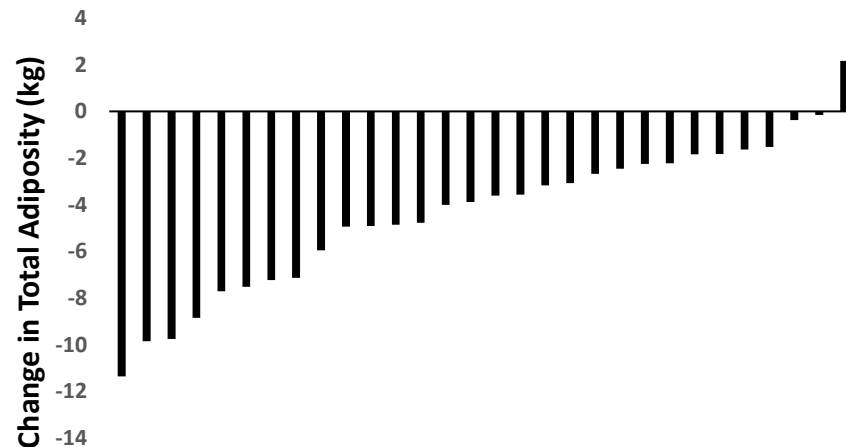


Implication for obesity management?



Interpretation:
Exercise-induced variability.
Some respond, some do not.

Individual Participants (n=24)
~150 m/wk



Individual Participants (n=30)
~300 m/wk...

Exercise
is Medicine®

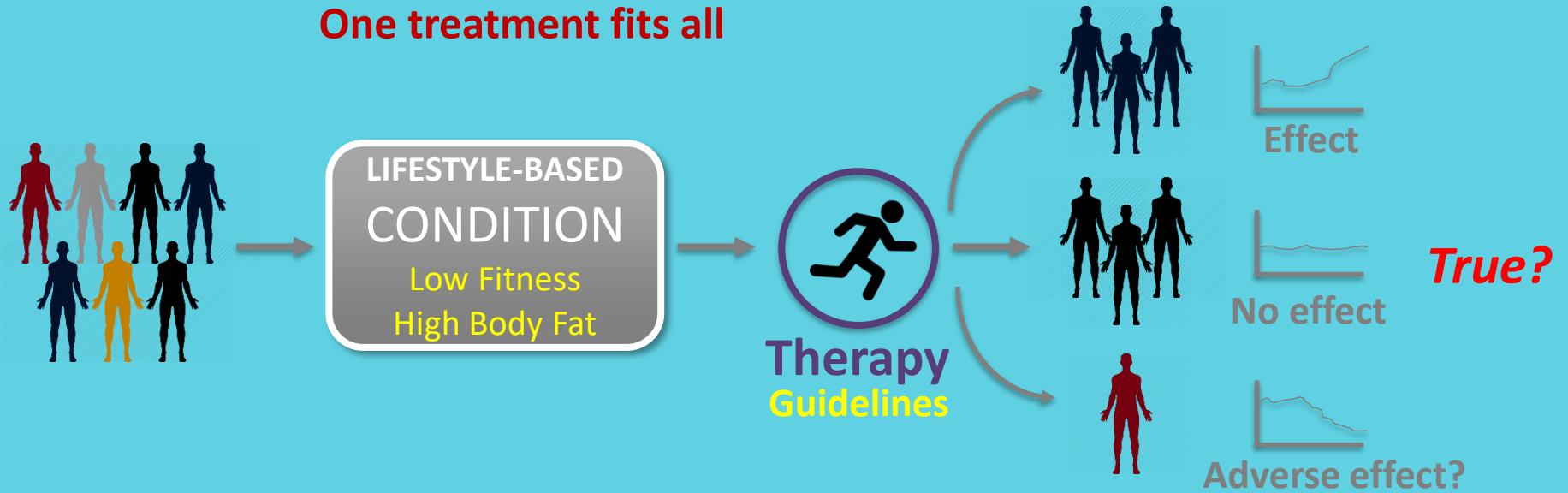
AMERICAN COLLEGE
of SPORTS MEDICINE®



We use consensus guidelines, based on **group** response, to prescribe the exercise dose, the **individual** response to the exercise dose is used to interpret treatment efficacy / benefit.

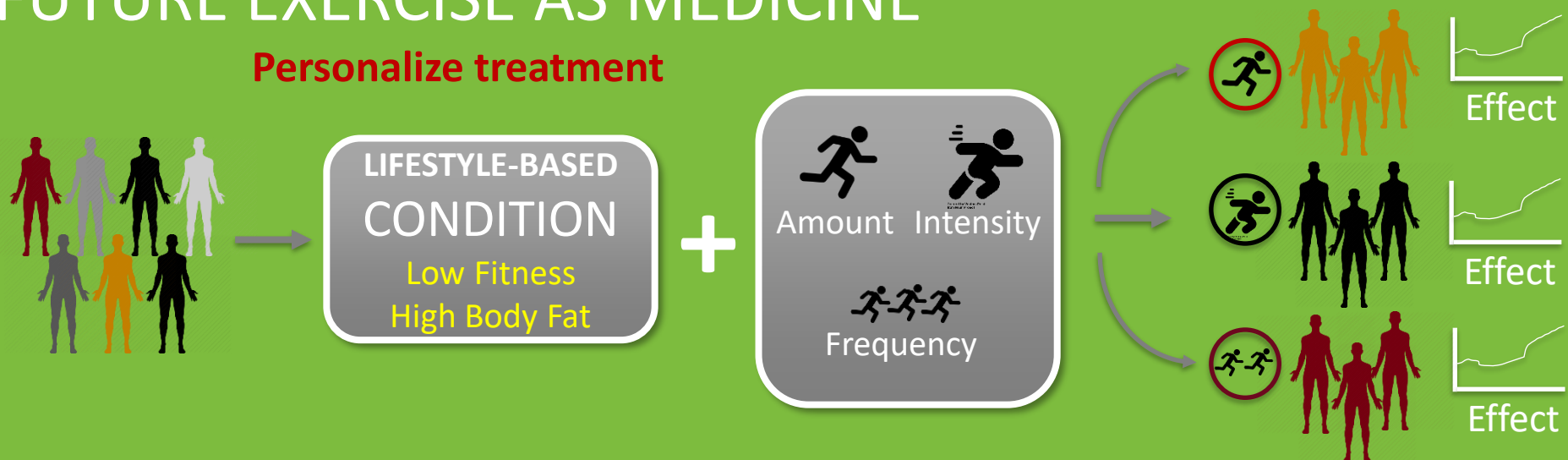
CURRENT EXERCISE AS MEDICINE

One treatment fits all

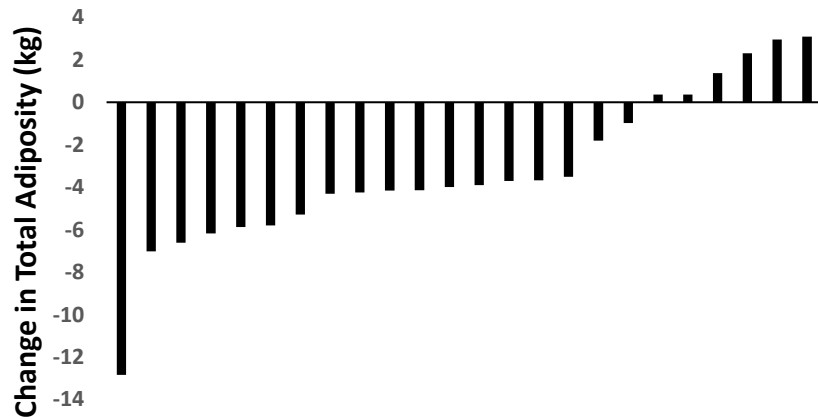
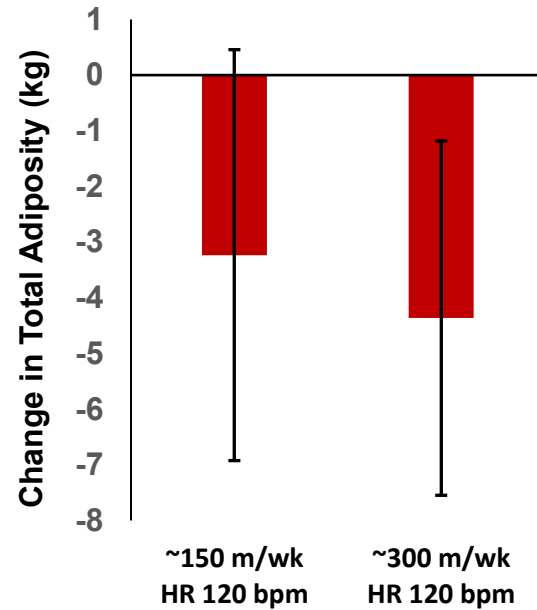


FUTURE EXERCISE AS MEDICINE

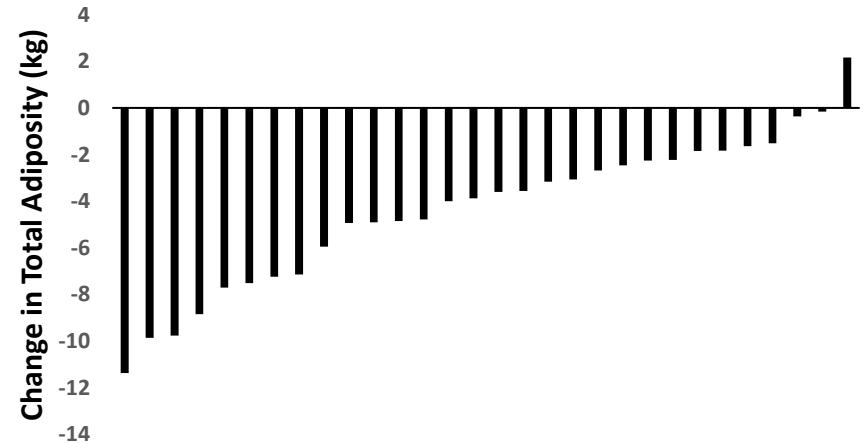
Personalize treatment



Individual variation in adipose tissue (MRI) response at 24 weeks to standardized exercise in adults with obesity

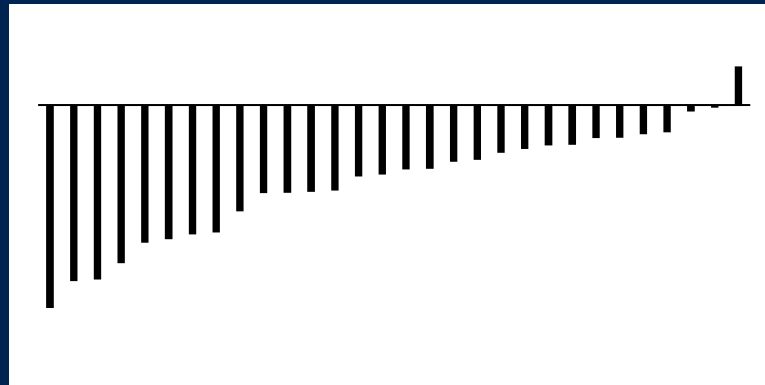


Individual Participants (n=24)
~150 m/wk



Individual Participants (n=30)
~300 m/wk...

Individual variation in adipose tissue (MRI) response at 24 weeks to standardized exercise in adults with obesity



The question is not whether variability post exercise will be observed.
But rather:

- 1) Is the variability due to treatment?
- 2) Is the variability clinically meaningful?
- 3) Is the *individual* treatment response beyond the technical error?

Change in Total Adiposity (kg)

4
2
0
-2
-4
-6
-8
-10
-12
-14

Individual Participants (n=24)
~150 m/wk

Change in To

0
-8
-10
-12
-14

Individual Participants (n=30)
~300 m/wk...



Physical Activity and Obesity Management: Individual Variability

Section 1:

In what context do we consider individual variability in response to exercise, and is it important?

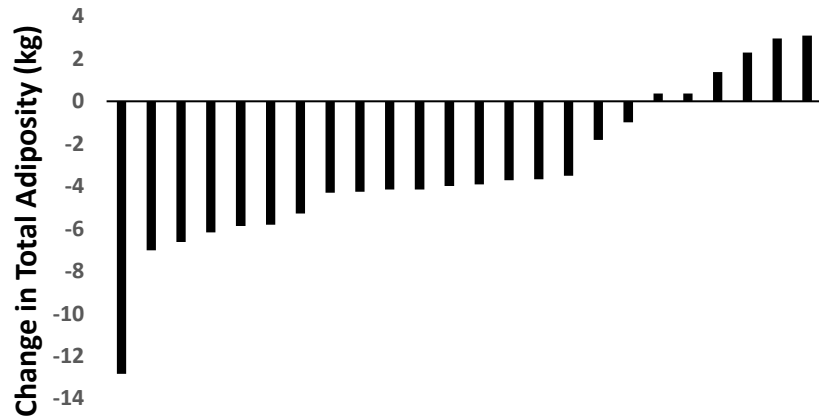
Section 2:

Determining the existence of exercise-induced variability for any trait is a complex issue.

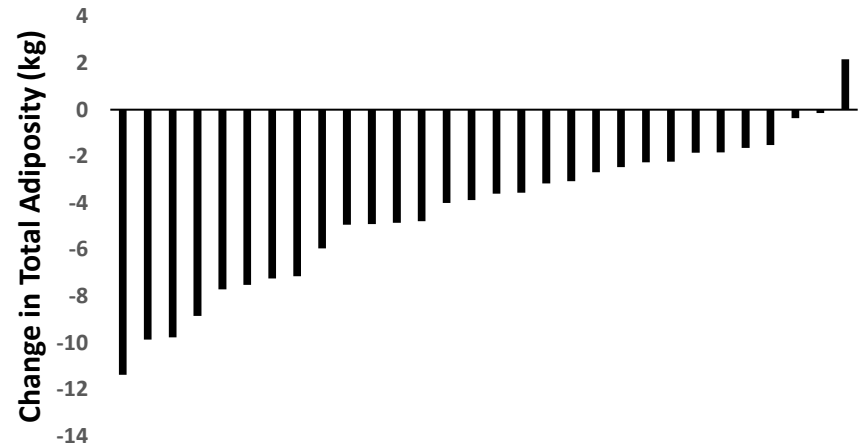
Section 3:

Summary observations regarding exercise-induced variability in body composition and selected cardiometabolic risk factors.

Does *Individual* variation in adipose tissue (MRI) response to exercise in adults with obesity



Individual Participants (n=24)
~150 m/wk



Individual Participants (n=30)
~300 m/wk...

To determine whether or not **exercise-induced** variability exists for a given trait, study designs, ideally, require:

- Time-matched control group

- Criterion/reference methods

- Supervised, standardized exercise

- 24hr PA – Accelerometry (PA performed outside that prescribed)

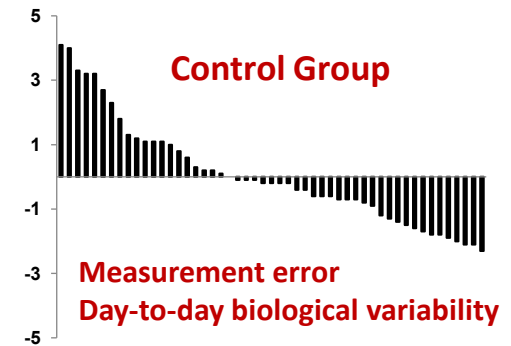
- Daily* self-recording of Energy intake

Inter-Individual Responses of Maximal Oxygen Uptake to Exercise Training: A Critical Review

Philip J. Williamson¹  · Greg Atkinson¹ · Alan M. Batterham¹

Sports Med (2017) 47:1501–1513

True inter-individual differences in exercise training response can be precisely quantified and appraised for clinical importance only with parallel information from a suitable comparator group or data from a relevant reliability study. Importantly, none of the studies resulting from the Health, Risk factors, exercise Training And Genetics (HERITAGE) Family Study included a comparator sample.



$$SD_R = \sqrt{SD_I^2 - SD_C^2}$$

If the SD within the time-matched control group is not *meaningfully* different from the SD in the exercise group (**SD_r**), there are no inter-individual differences (variability) in response to exercise.

To determine whether exercise-induced response variability exists:

Question 1: Is there clinically meaningful variability in response to standardized exercise?

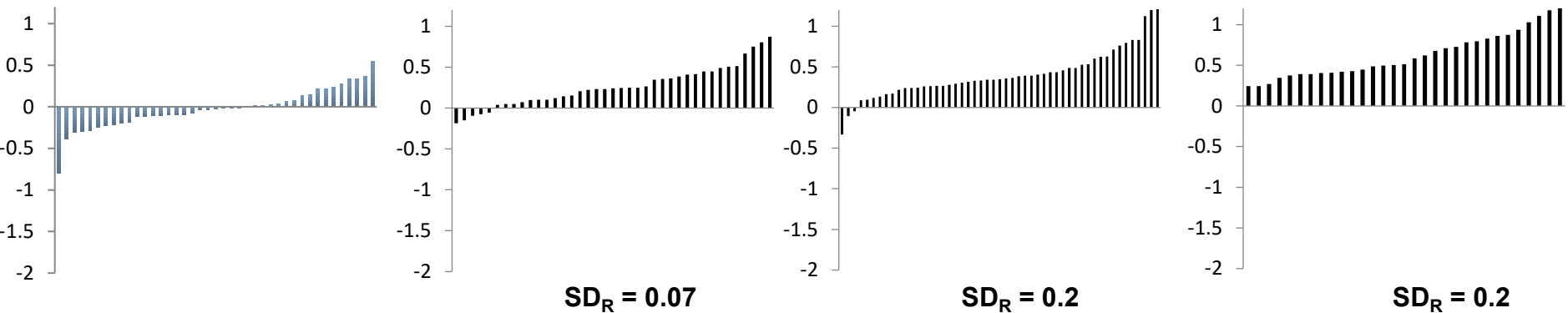
Control

LALI (150 min/week)

HALI (300 min/week, 50%)

HAHI (200 min/week, 75%)

ΔCRF at 24 weeks (L/min)



$$SD_R = \sqrt{SD_I^2 - SD_C^2}$$

If SD_R is clinically meaningful, then exercise-induced variability exists

However, whether a given individual result is beyond the 'technical error' observed within the control group requires further investigation.

To determine whether exercise-induced response variability exists:

Question 2: To what degree are we 'certain' that the individual response is exercise-induced?

$$TE = \frac{\sqrt{\sum(\text{measure1} - \text{measure2})^2}}{2n}$$

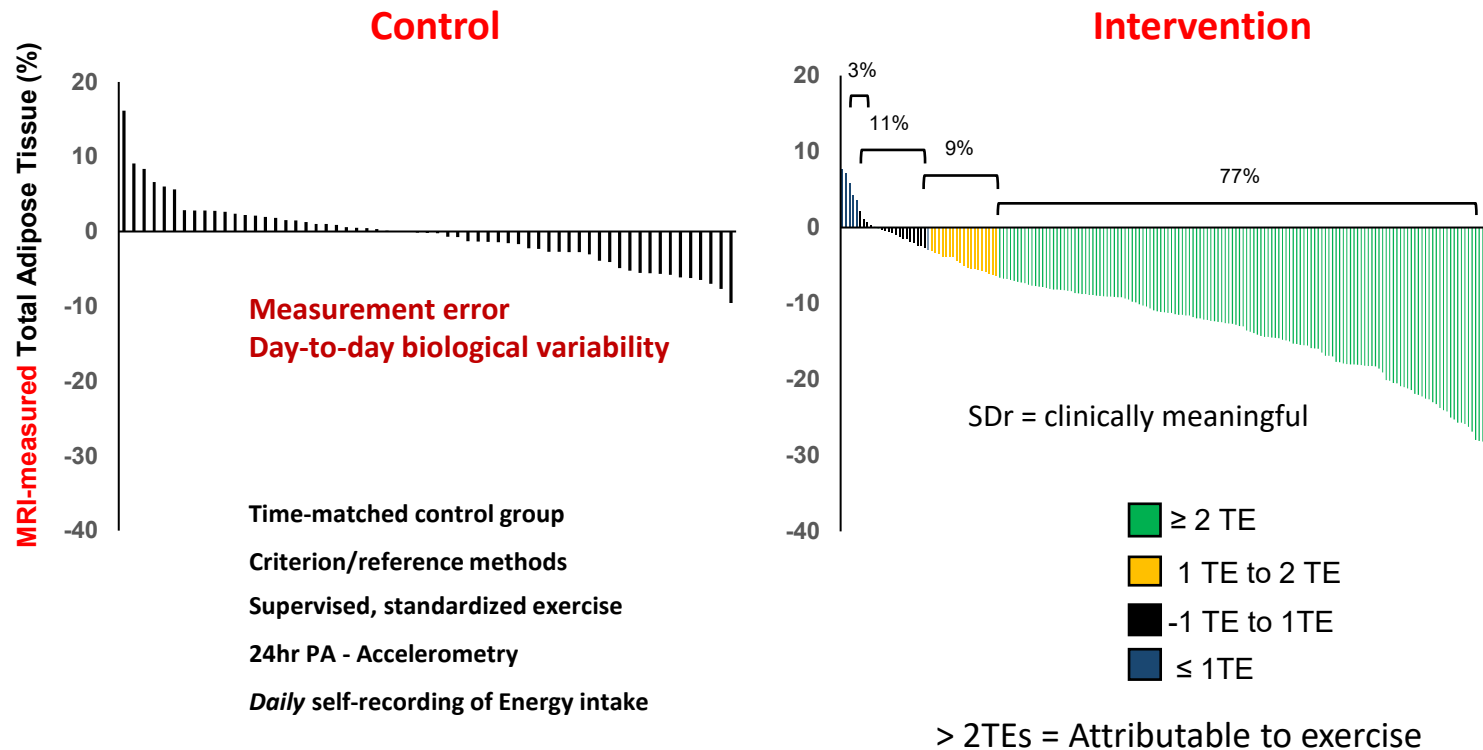
TE reflects measurement error
and day-to-day biological variability

The data used to derive the TE is obtained from a time-matched control group (use the pre- and post-treatment scores from the control group participants).

Is the individual response to exercise (pre-post intervention) **beyond** the TE (pre-post intervention) derived from the control group?

To determine whether exercise-induced response variability exists:

Question 2: To what degree are we 'certain' that the individual response is exercise-induced?



Individual 2-hr glucose response at 24 weeks to standardized, supervised exercise: effects of exercise amount and intensity in adults with obesity

Control

LALI

(150 min/wk @ 50%)

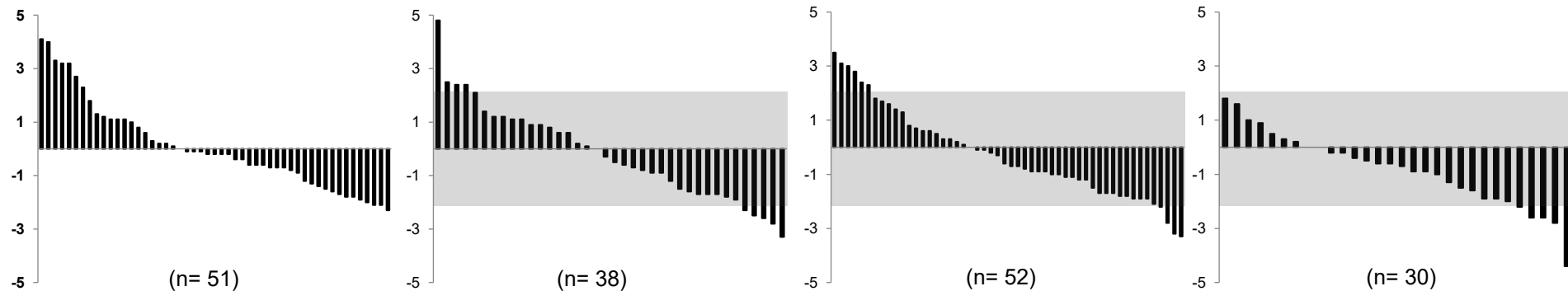
HALI

(300 min/wk @ 50%)


HAHI

(200 min/wk @ 75%)

Δ 2hr Glucose at 24 weeks (mmol/L)



No exercise-induced variability (SDr), and majority of Individual responses to exercise are 'uncertain' – do not exceed control group derived TE

 = TE, day-to-day variability of measurement ('time matched control group')

$$TE = \frac{\sqrt{\sum(\text{measure1} - \text{measure2})^2}}{2n}$$

Determining the existence of **exercise-induced variability** for any trait is a complex issue.

For researchers:

Time-matched *control group* in the trial design?

Criterion method, measure the outcome twice at each time point (pre-post)

Measure the outcome at multiple time points throughout the intervention

Account for physical activity outside of that prescribed, dietary intake

$$SD_R = \sqrt{SD_I^2 - SD_C^2}$$

Is there exercise-induced variability?

$$TE = \frac{\sqrt{\sum(\text{measure1} - \text{measure2})^2}}{2n}$$

Is the individual exercise response *beyond* the TE derived from the control group?

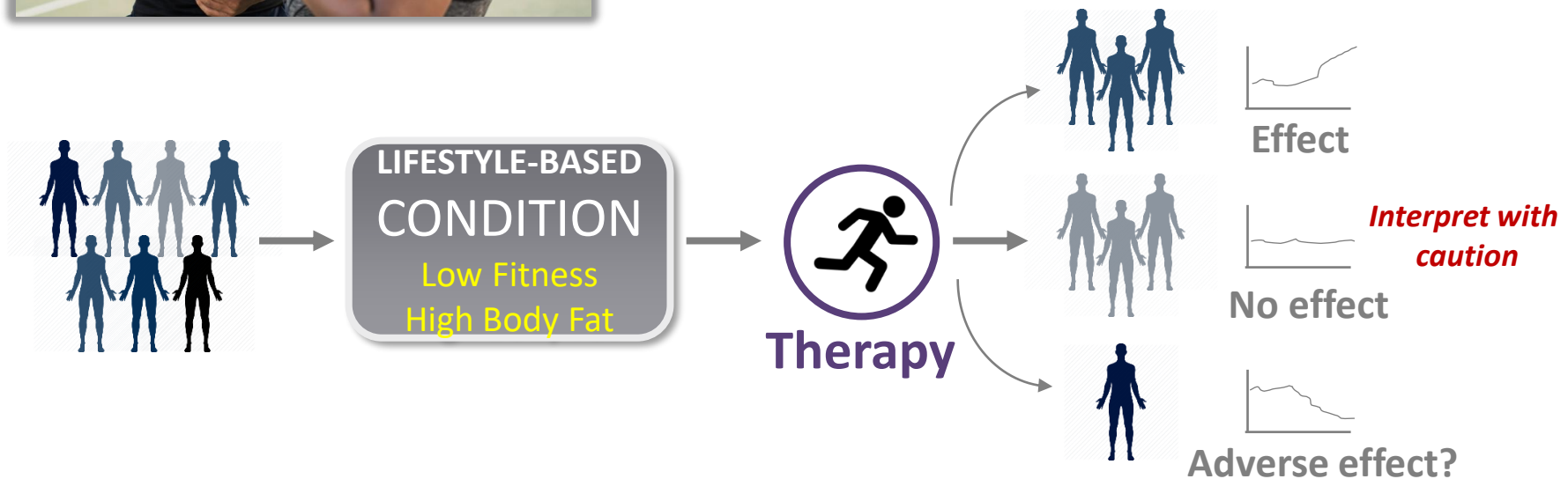
Determining the existence of **exercise-induced variability** for any trait is a complex issue.

For practitioners:



Obesity management guidelines worldwide prescribe increased aerobic-type physical activity (such as brisk walking) for more than 150 minutes per week.

American College of Sports Medicine Position Stands, recommend 200 to 300 minutes a week for sustained weight loss.



Measure the trait of interest, as often as possible

Measurement precision – TE (measurement error) is it known?

Consensus statement



Precision exercise medicine: understanding exercise response variability

Robert Ross,¹ Bret H Goodpaster,² Lauren G Koch,³ Mark A Sarzynski,⁴ Wendy M Kohrt,⁵ Neil M Johannsen,^{6,7} James S Skinner,⁸ Alex Castro,⁹ Brian A Irving,^{7,10} Robert C Noland,¹¹ Lauren M Sparks,² Guillaume Spielmann,^{7,10} Andrew G Day,¹² Werner Pitsch,¹³ William G Hopkins,¹⁴ Claude Bouchard¹⁵

Br J Sport Med 2018

rossr@queensu.ca

Physiological Reports

Open Access

Physiological Reports ISSN 2051-817X

REVIEW ARTICLE

An appraisal of the SD_{IR} as an estimate of true individual differences in training responsiveness in parallel-arm exercise randomized controlled trials

Jacob T. Bonafiglia¹, Andrea M. Brennan, Robert Ross & Brendon J. Gurd
School of Kinesiology and Health Studies, Queen's University, Kingston, Ontario

Jacob T. Bonafiglia is a PhD Candidate studying under the supervision of Dr. Brendon Gurd in the School of Kinesiology and Health Studies at Queen's University in Kingston, Ontario, Canada. Their research is focused on exercise and skeletal muscle physiology in humans, with a current emphasis on exploring the statistical approaches and underlying mechanisms of individual response variability to exercise training. Drs. Andrea Brennan and Robert Ross also share an interest in individual responses to exercise training, with a particular focus on using large randomized controlled trials to investigate response variability in clinically-relevant health outcomes.

Physiol Rep 2019

Directions for Exercise Treatment Response Heterogeneity and Individual Response Research

Authors

Travis J. Hrubeniuk^{1,2}, Jacob T. Bonafiglia³, Danielle R. Bouchard^{2,4}, Brendon J. Gurd³, Martin Sénéchal^{2,4}

Int J Sport Med 2022

Repeated testing for the assessment of individual response to exercise training

Anne Hecksteden,¹ Werner Pitsch,² Friederike Rosenberger,^{3,4} and Tim Meyer¹

¹Institute of Sports and Preventive Medicine, Saarland University, Saarbruecken, Germany; ²Institute for Sport Sciences, Department of Sociology and Economics of Sports, Saarland University, Saarbruecken, Germany; ³Healthcare University, Saarbruecken, Germany; ⁴Healthcare University, Saarbruecken, Germany

J Appl Physiol 2018

The application of repeated testing and monoexponential regressions to classify individual cardiorespiratory fitness responses to exercise training

Jacob T. Bonafiglia¹, Robert Ross¹, Brendon J. Gurd¹

Eur J Appl Physiol 2019

Physical Activity and Obesity Management: Individual Variability

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Section 3:

Summary observations regarding exercise-induced variability in body composition and selected cardiometabolic risk factors.

When trying to determine the existence of individual variability in response to exercise for any trait..

Toward Personalized Exercise Medicine: A Cautionary Tale

ANDREA M. BRENNAN¹, ANDREW G. DAY², JOHN CLARKE², and ROBERT ROSS^{3,4}

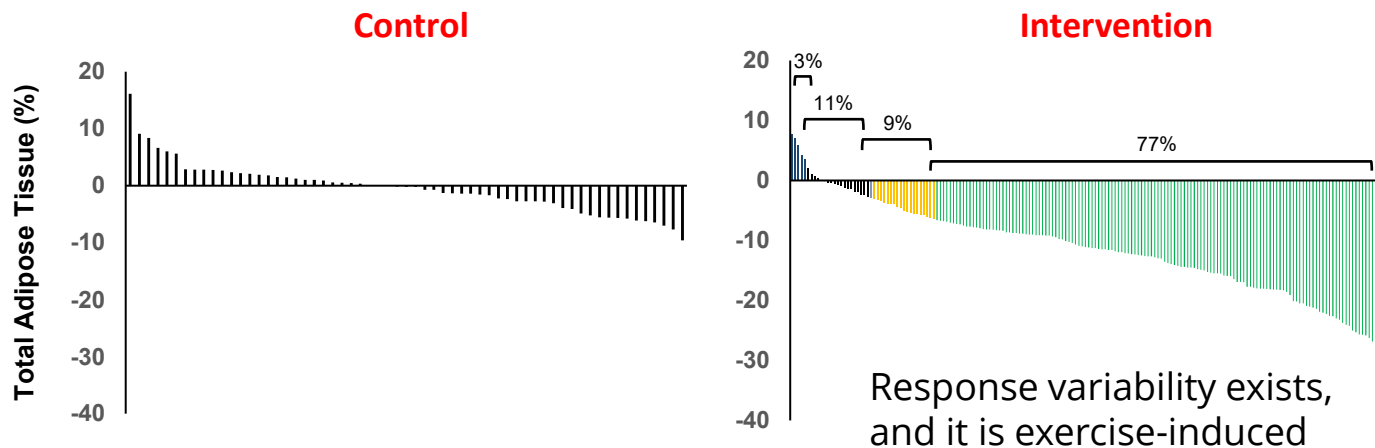
¹AdventHealth Orlando, Translational Research Institute, Orlando, FL; ²Kingston Health Sciences Centre, Kingston, Ontario, CANADA; ³Department of Medicine, Division of Endocrinology and Metabolism, Queen's University, Kingston, Ontario, CANADA; and ⁴School of Kinesiology and Health Studies, Queen's University, Kingston, Ontario, CANADA

MSSE 54: 1861-68, 2022.



Andrea Brennan, PhD
Research Scientist
AdventHealth Research Institute
Orlando, USA

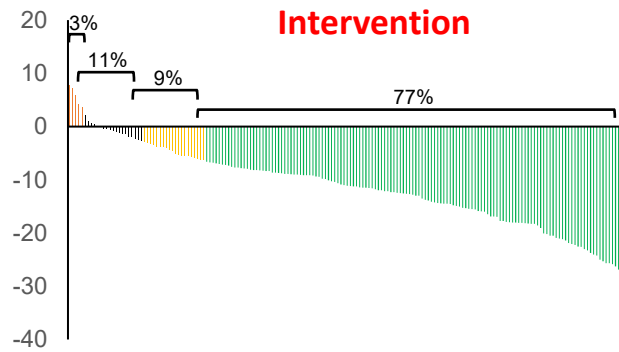
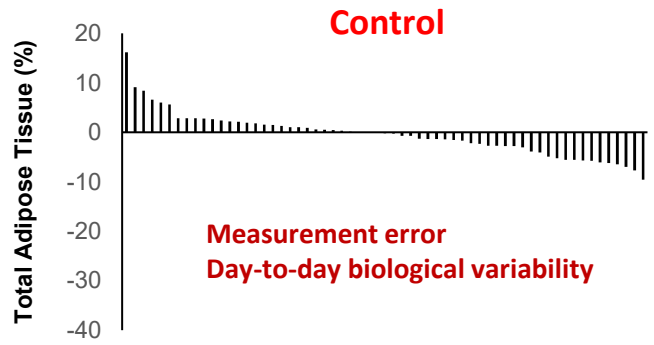
**After adjustment for the variability observed within the control group,
To what extent do changes in exercise-induced body composition or
cardiometabolic risk factors exist?**



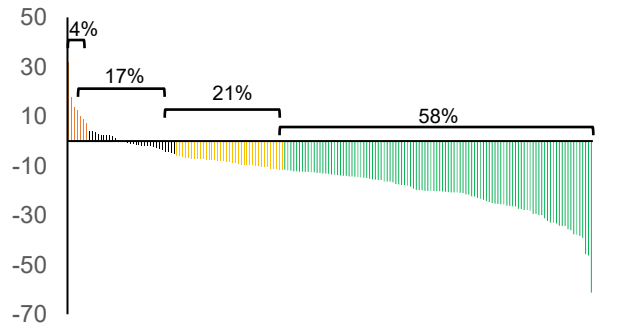
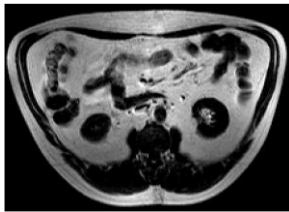
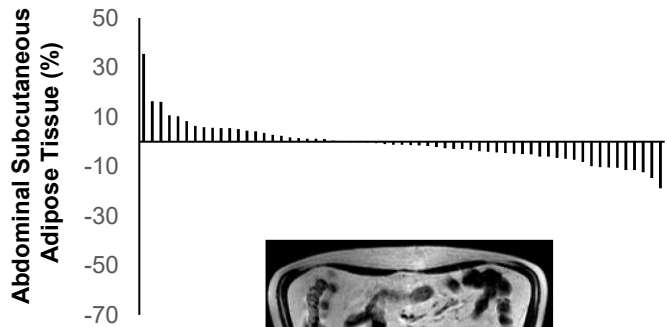
- ≥ 2 TE
- 1 TE to 2 TE
- -1 TE to 1TE
- ≤ 1 TE

We are '*certain*' that 77% of the participants benefitted from the exercise intervention whereas for 23%, we are '*uncertain*'

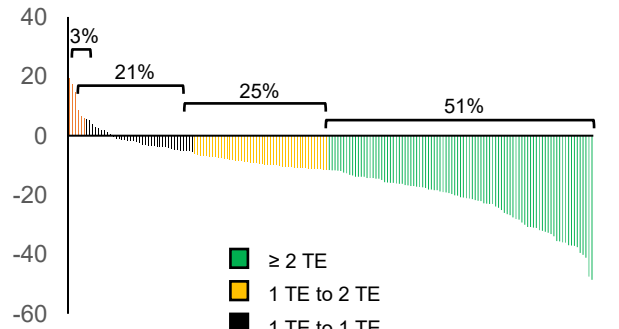
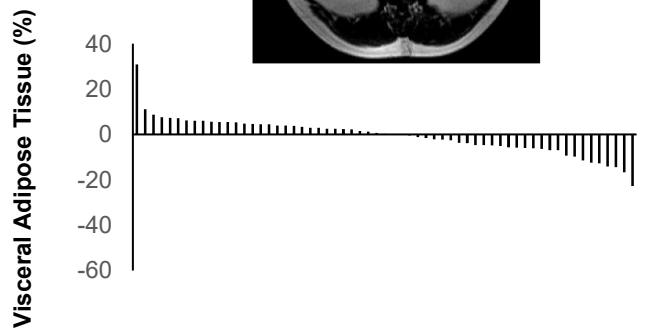
Individual MRI-measured adipose tissue (%) response to standardized exercise in adults with obesity



Control = 87
Exercise = 251

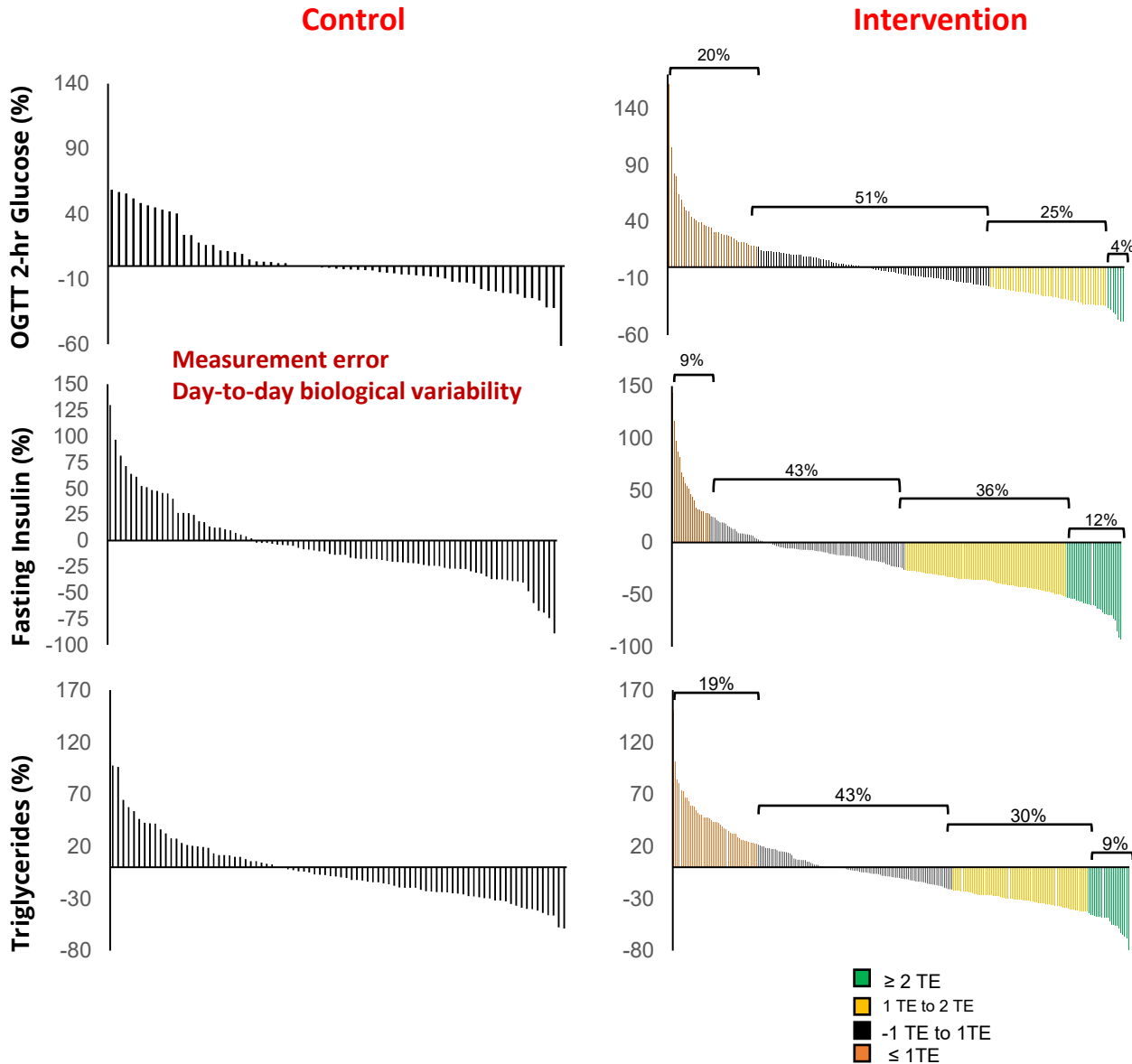


Time-matched control group
Criterion/reference methods
Supervised, standardized exercise
24hr PA - Accelerometry
Daily self-recording of Energy intake



■ ≥ 2 TE
■ 1 TE to 2 TE
■ -1 TE to 1 TE
■ ≤ 1 TE

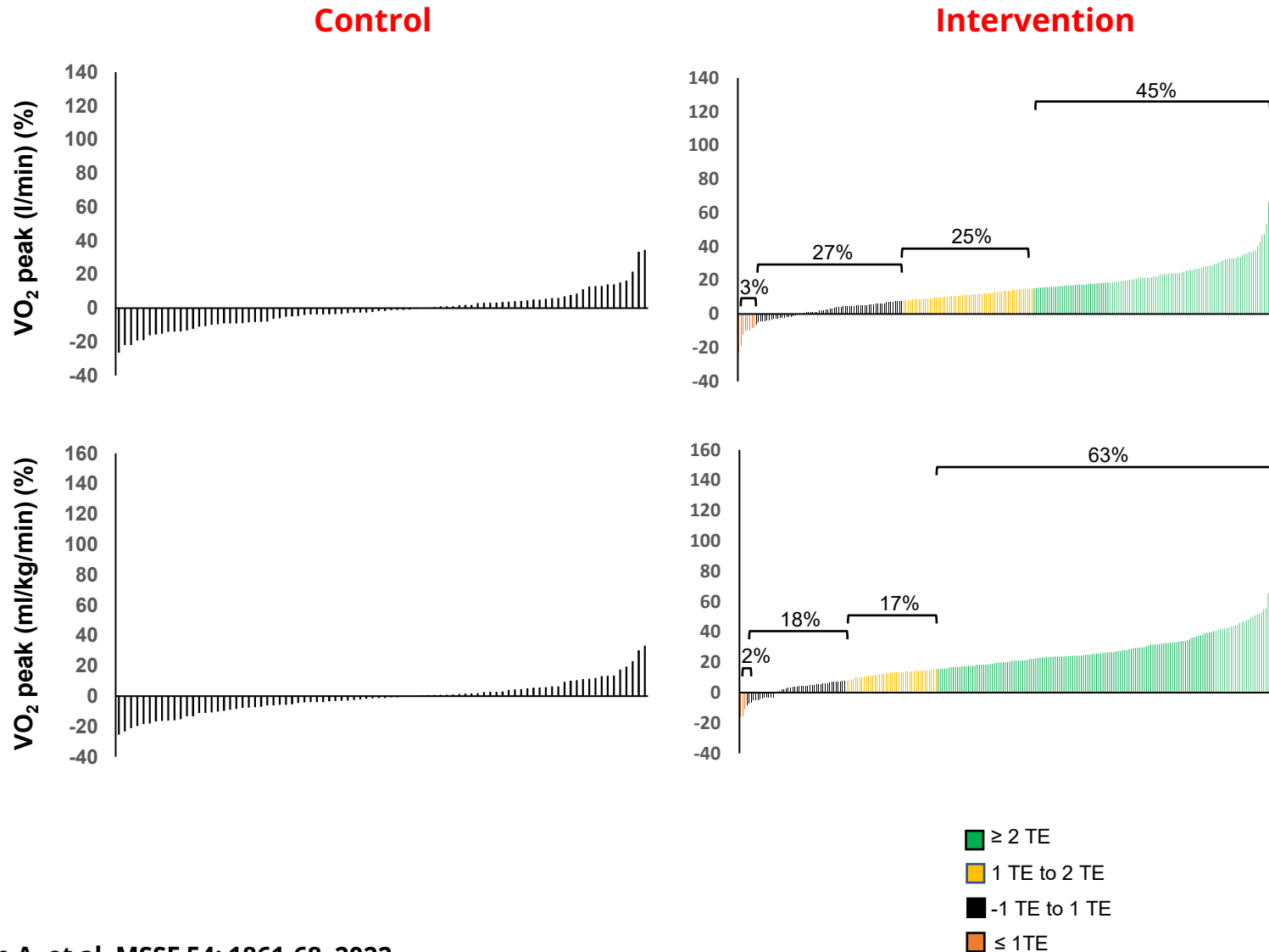
Individual cardiometabolic response (%) to standardized exercise in adults with obesity



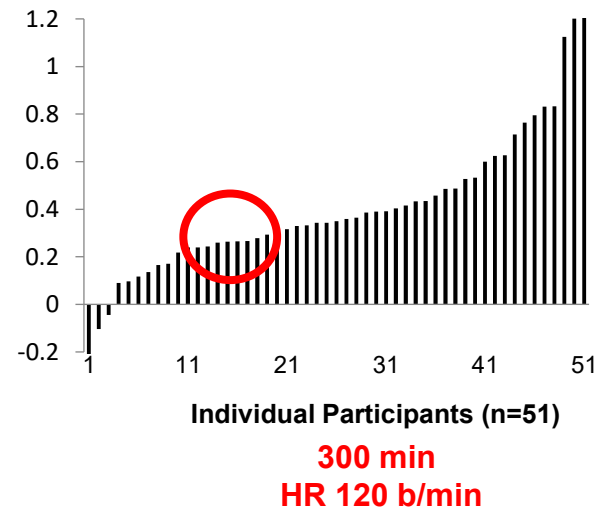
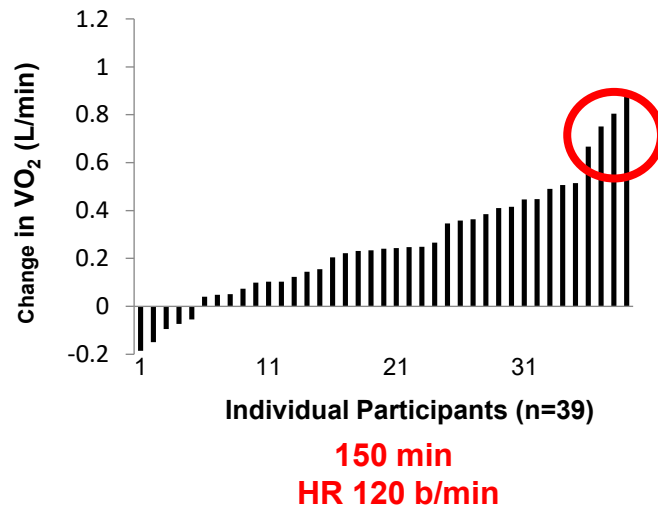
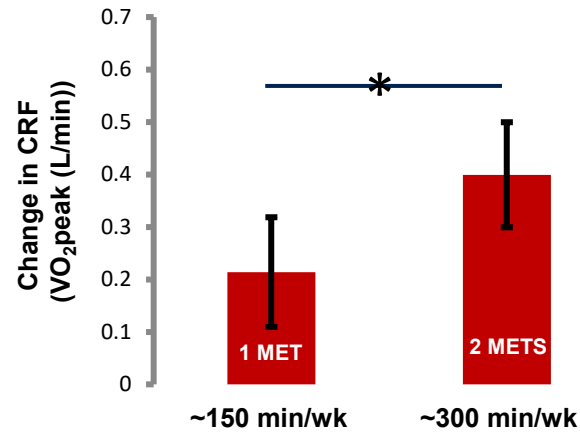
Control = 87
Exercise = 251

Time-matched control group
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Daily self-recording of Energy intake

Individual CPET-measured CRF response to standardized exercise in adults with obesity

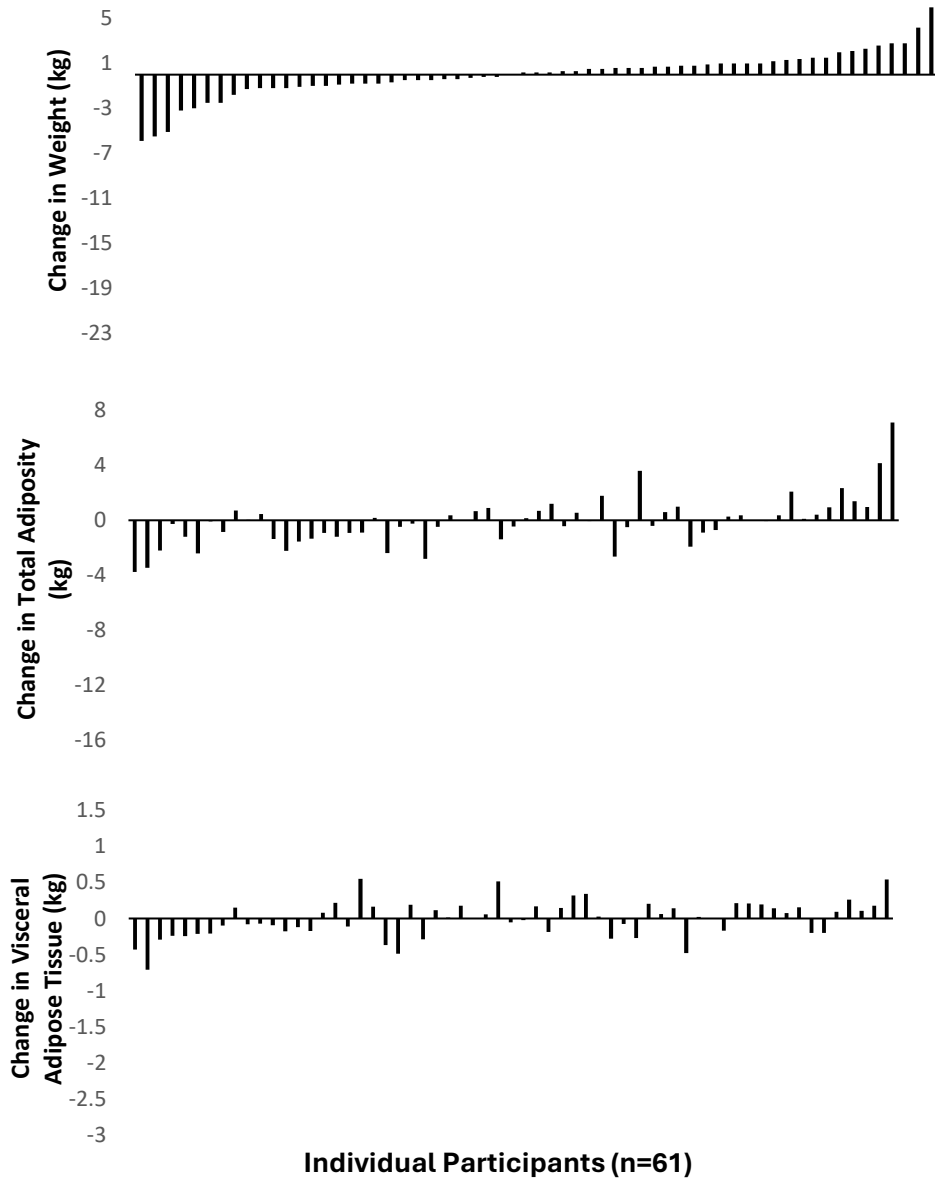


Does *Individual* variation in CRF response to standardized exercise in adults with obesity exist?

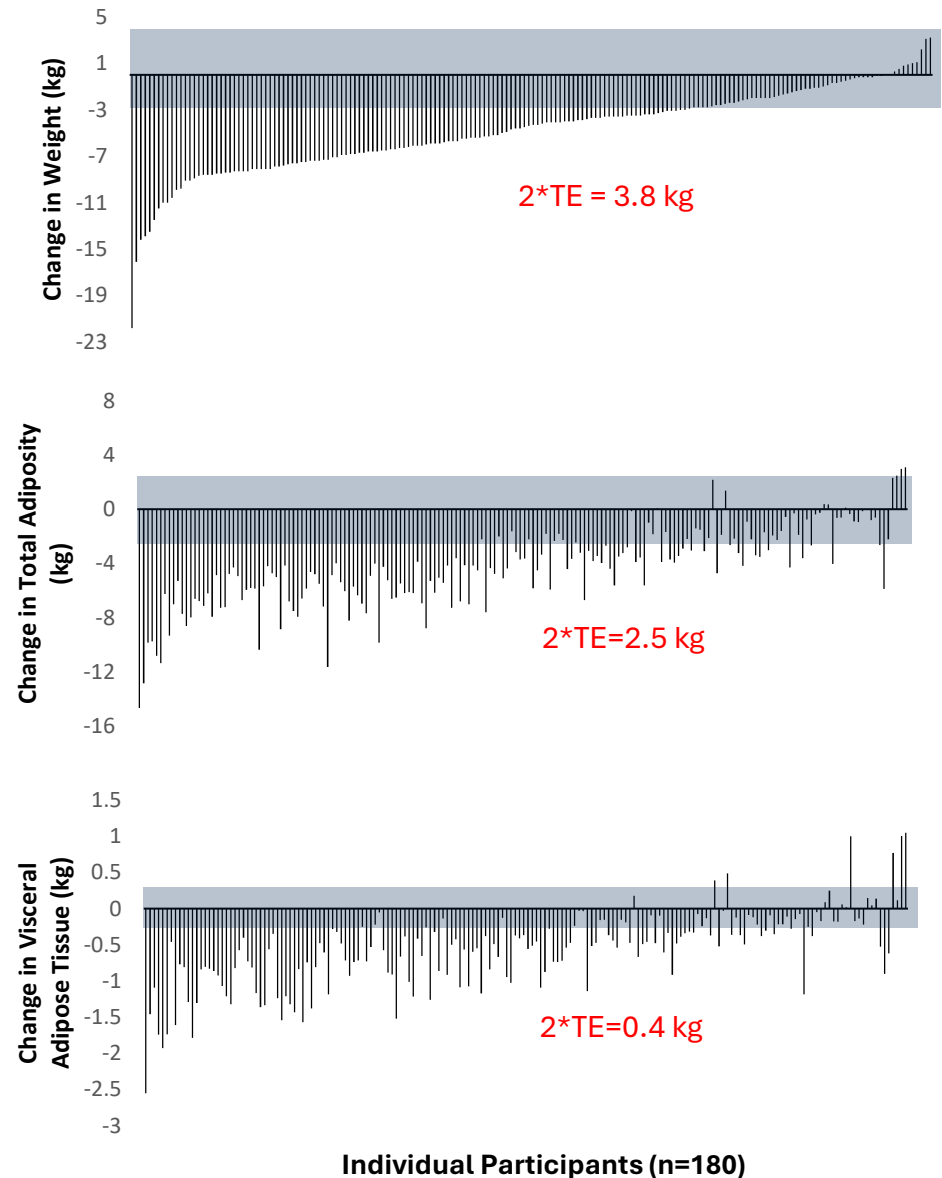


Does individual change in body weight predict corresponding change in adipose tissue depots?

Control

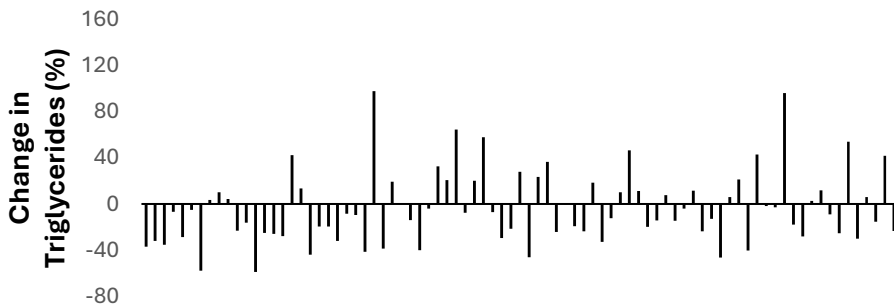
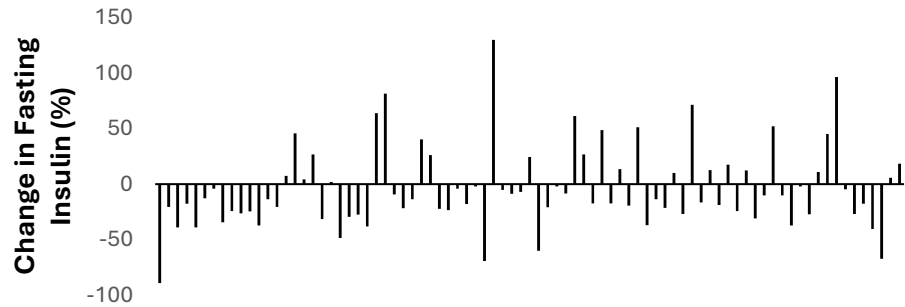
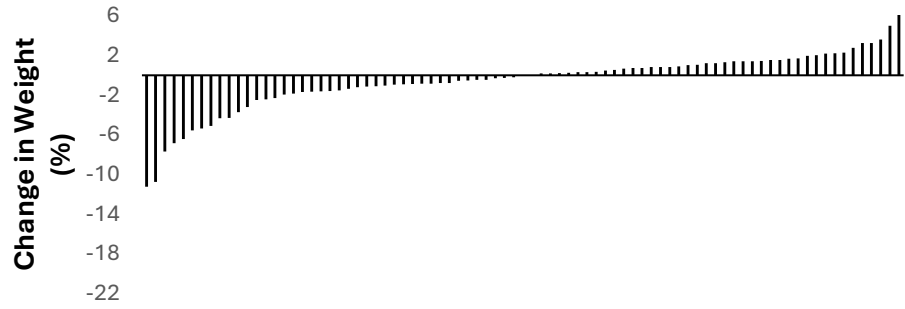


Exercise

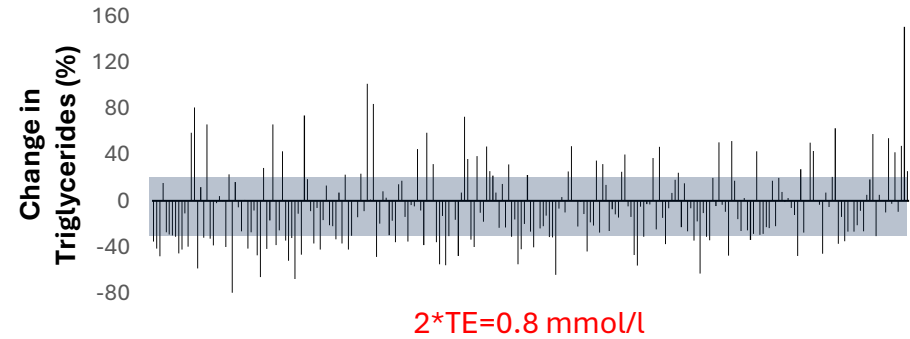
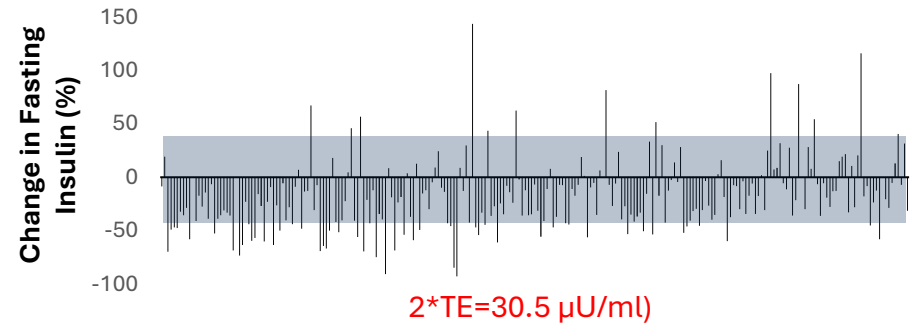
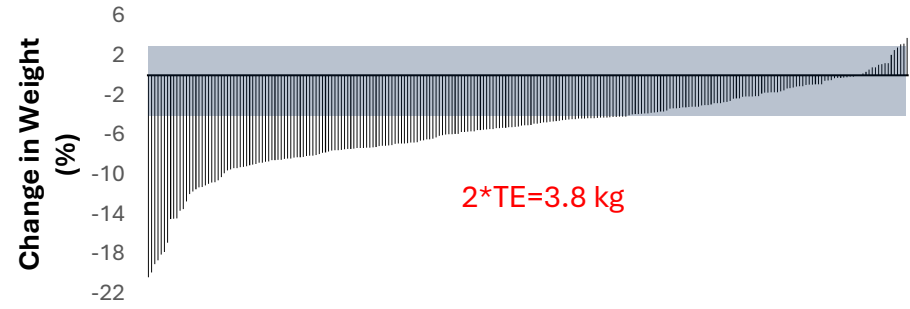


Does individual change in body weight predict corresponding change in metabolic risk factors?

Control

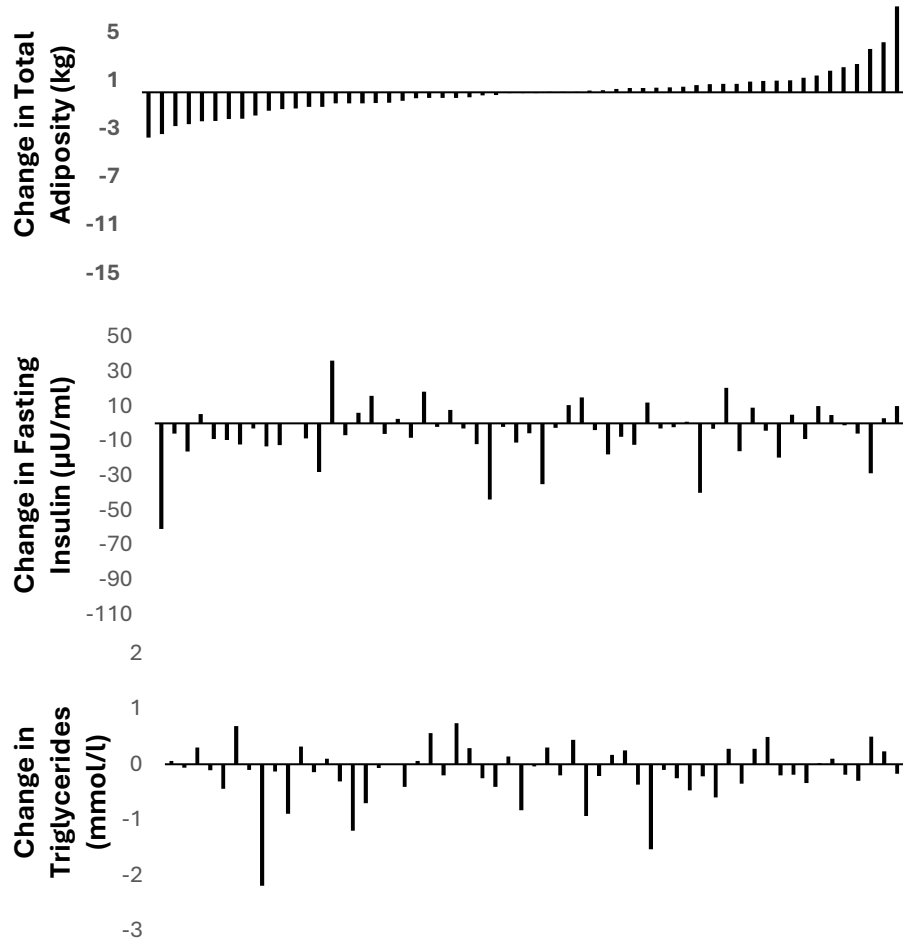


Exercise



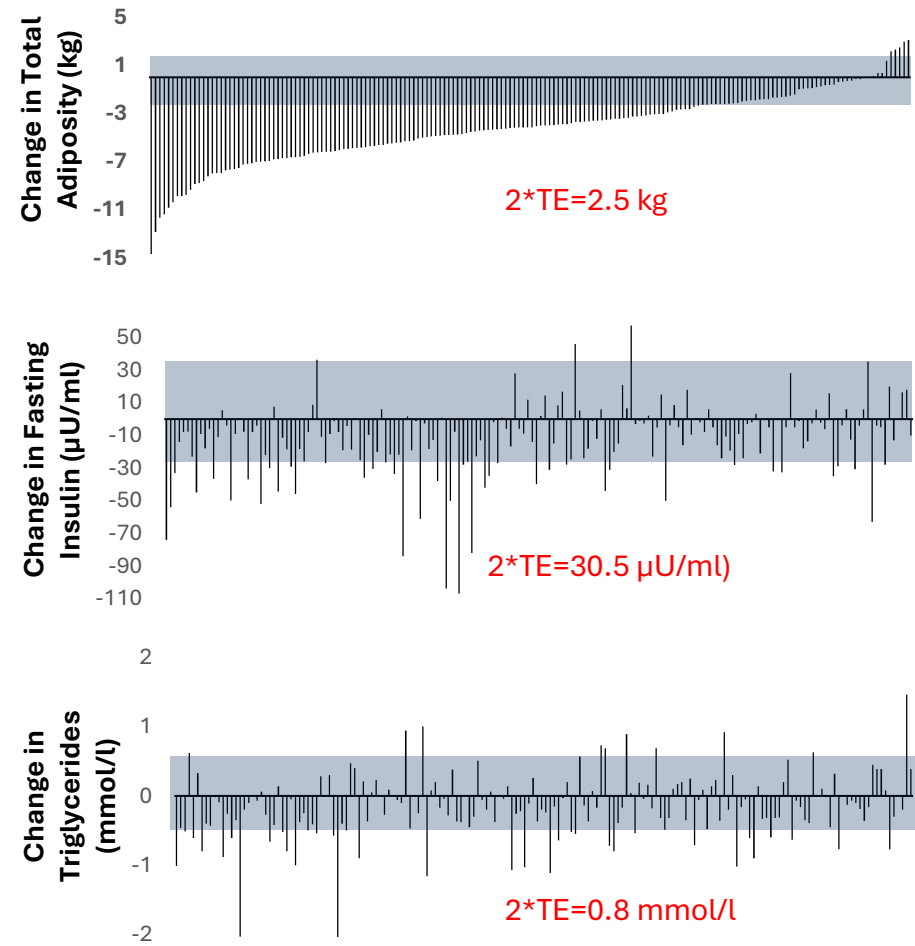
Do individual changes in adiposity correspond to change in metabolic risk factors?

Control



Individual Participants (n=57)

Exercise



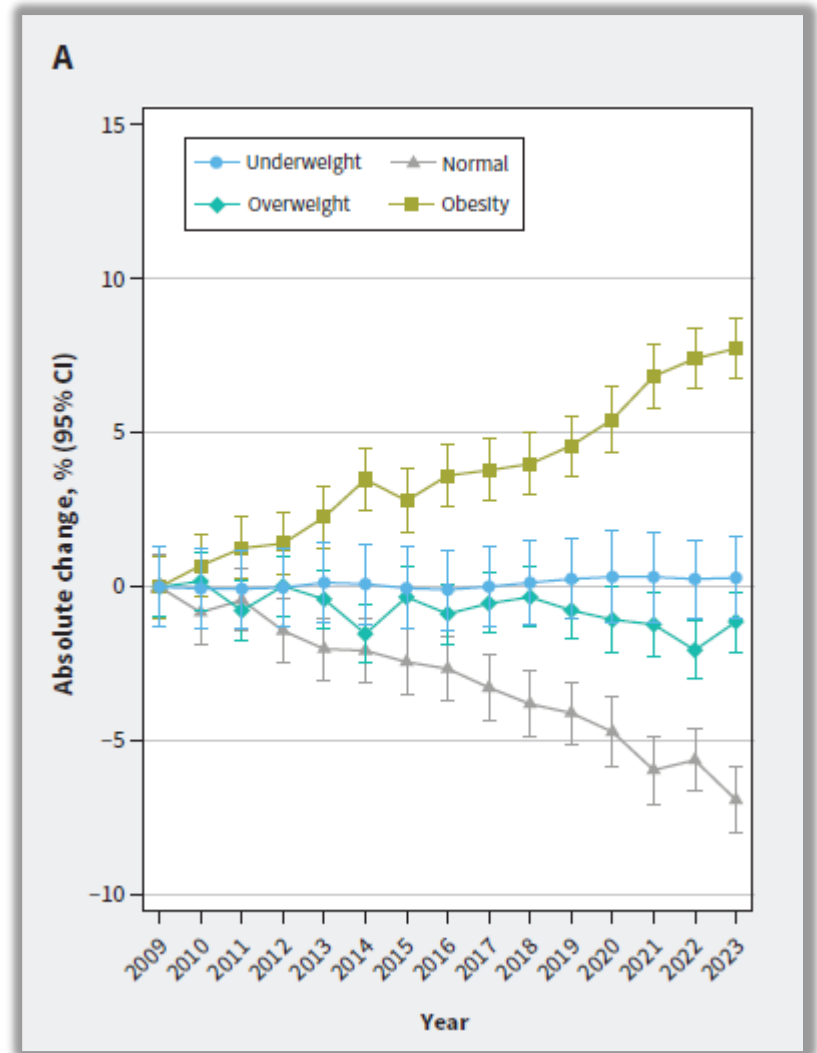
Individual Participants (n=174)

SUMMARY

Trends in obesity defined by body mass index among adults before and during the COVID-19 pandemic: a repeated cross-sectional study of the 2009–2023 Canadian Community Health Surveys

Laura N. Anderson PhD, Rabiul Islam PhD, Arthur Sweetman PhD

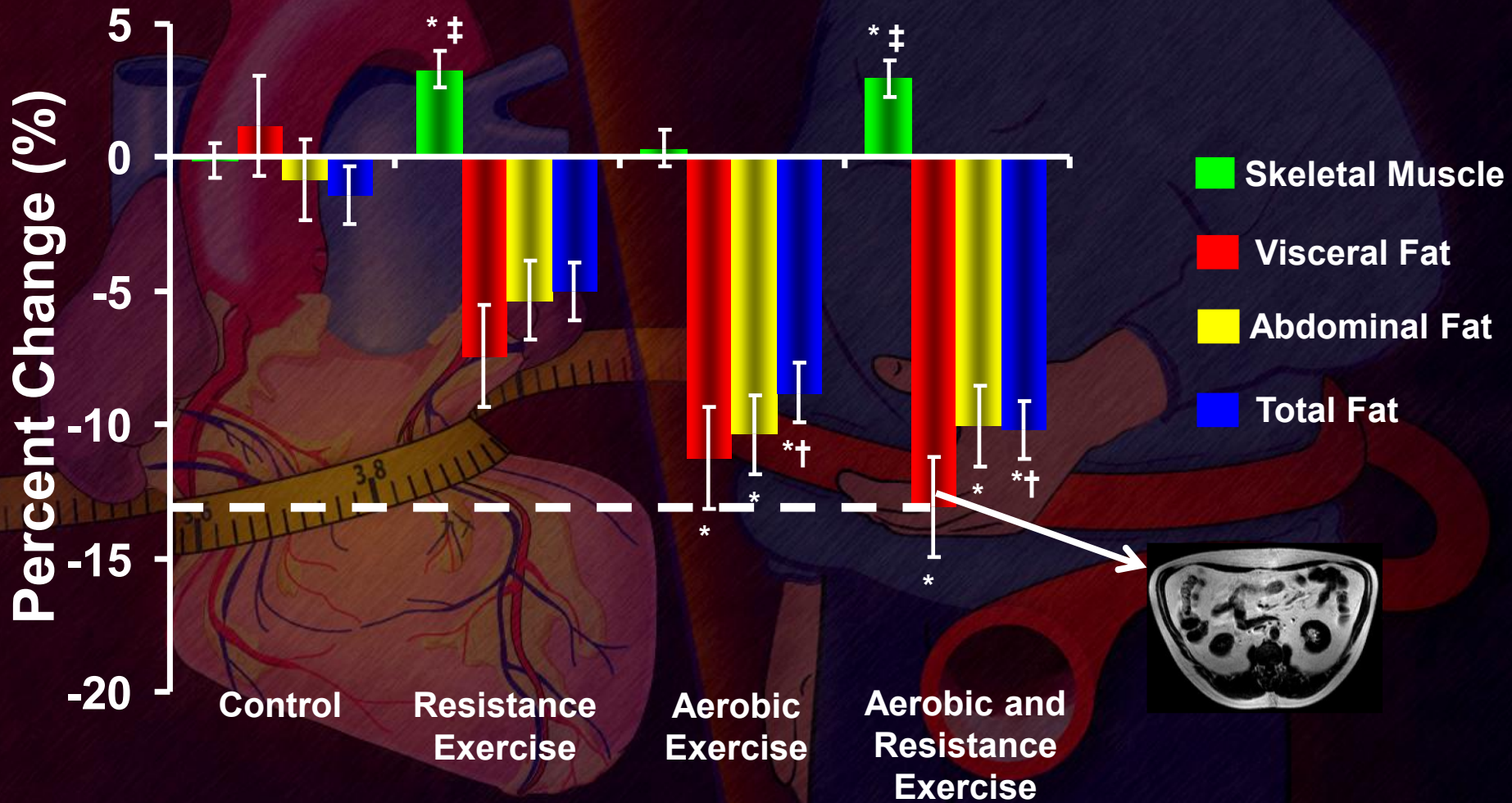
This is a terrifying observation



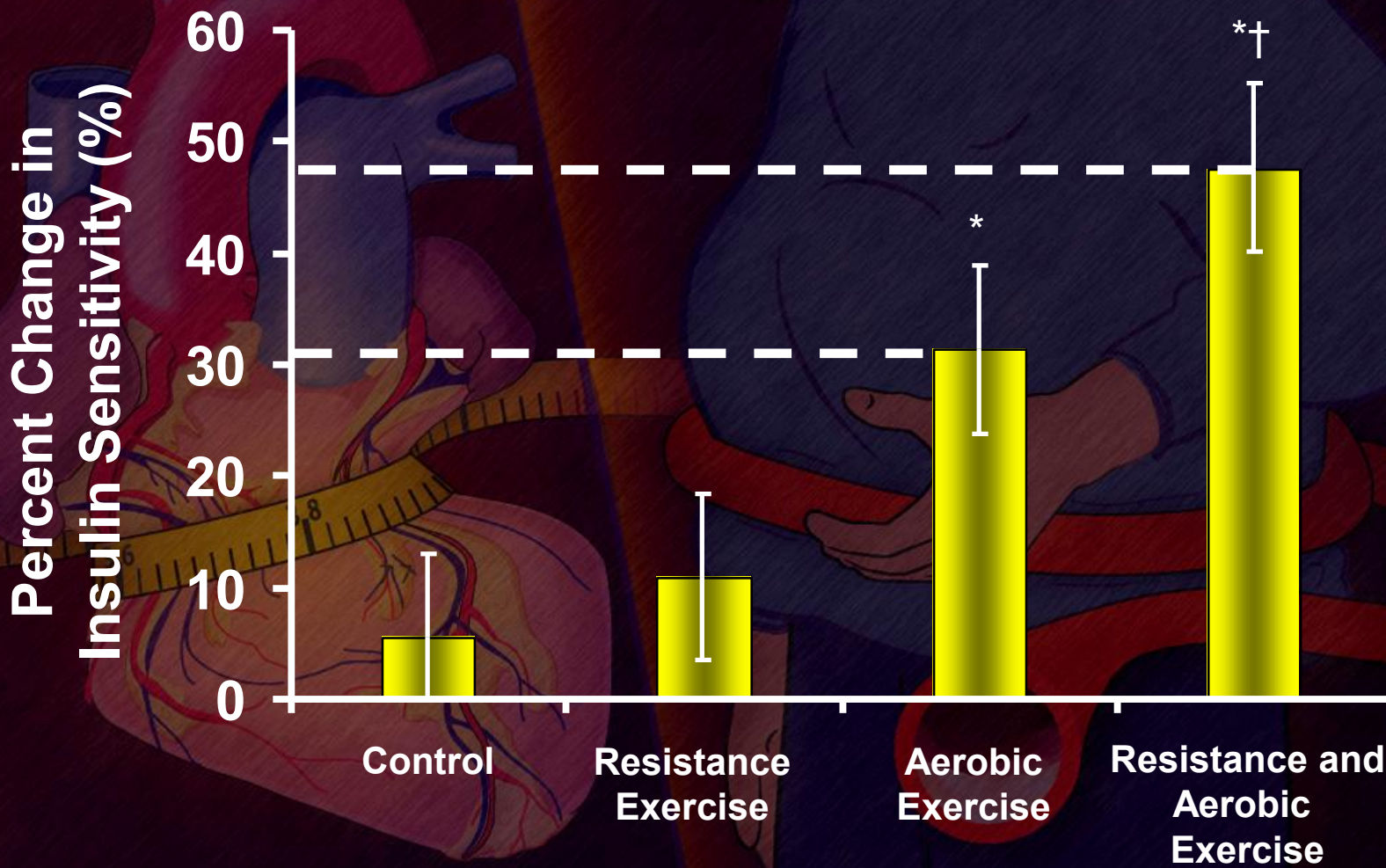
Exercise must/should be a fundamental component in strategies designed to prevent and/or manage overweight or obesity

Certainty of exercise benefit based on treatment group versus control group is established

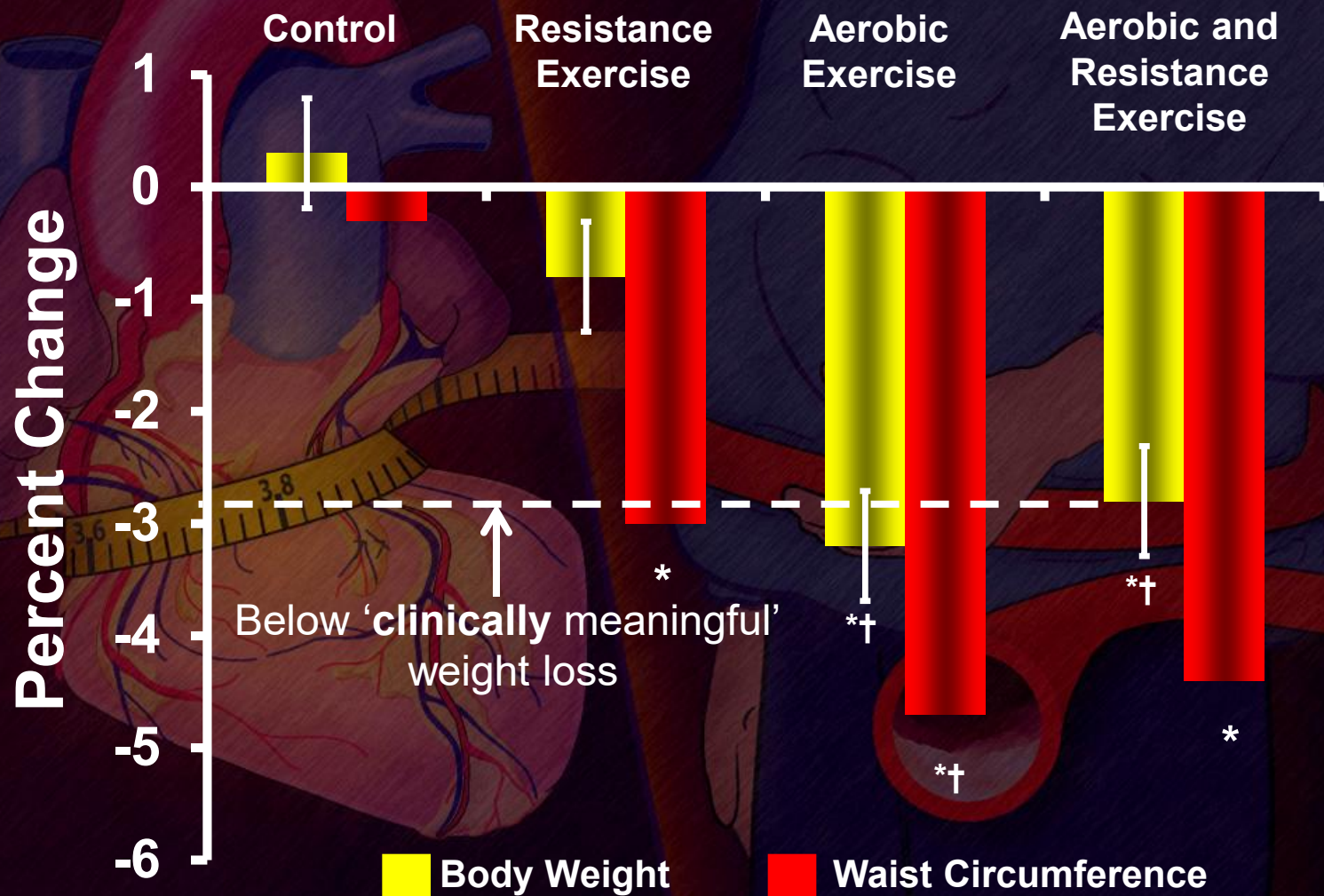
Effects of Exercise Modality on Visceral Fat, Total Fat and Skeletal Muscle in Older Men and Women: A Randomized Controlled Trial



Effects of Exercise Modality on Insulin Resistance in Older Men and Women: A Randomized Controlled Trial



Effects of Exercise Modality on Body Weight and Waist Circumference in Older Men and Women

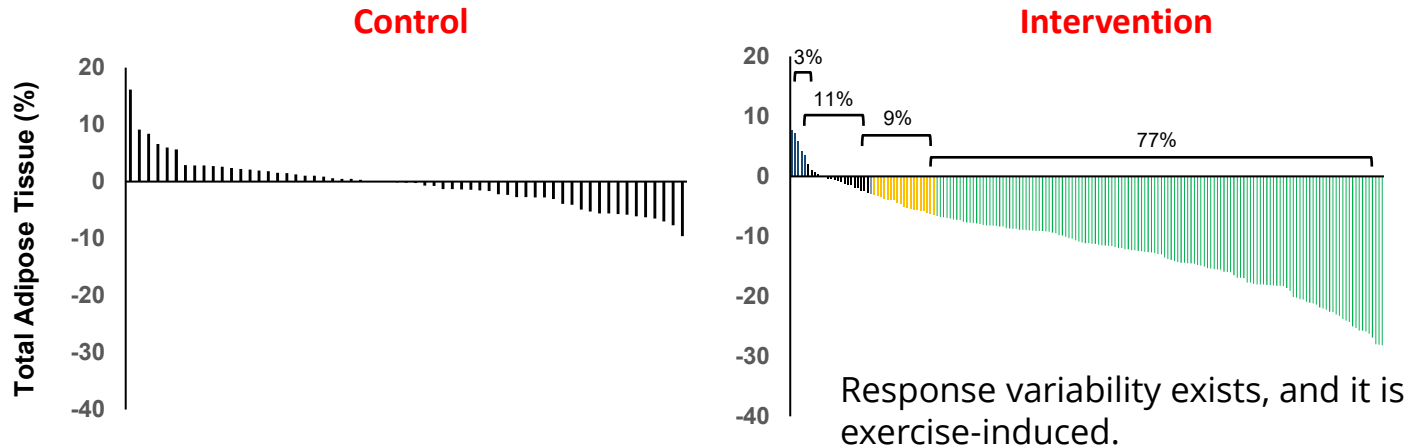


Exercise must/should be a fundamental component in strategies designed to prevent and/or manage overweight or obesity

Certainty of exercise benefit based on treatment group versus control group is established

Certainty of exercise benefit for a given individual is not established

Does individual variability in total and regional adipose tissue response to guideline exercise exist?



There is benefit for **most** adults

- ≥ 2 TE
- 1 TE to 2 TE
- -1 TE to 1TE
- ≤ 1 TE

Efficacy trials – internal control

Time-matched control group

Criterion/reference methods

Supervised, standardized exercise

24hr PA - Accelerometry

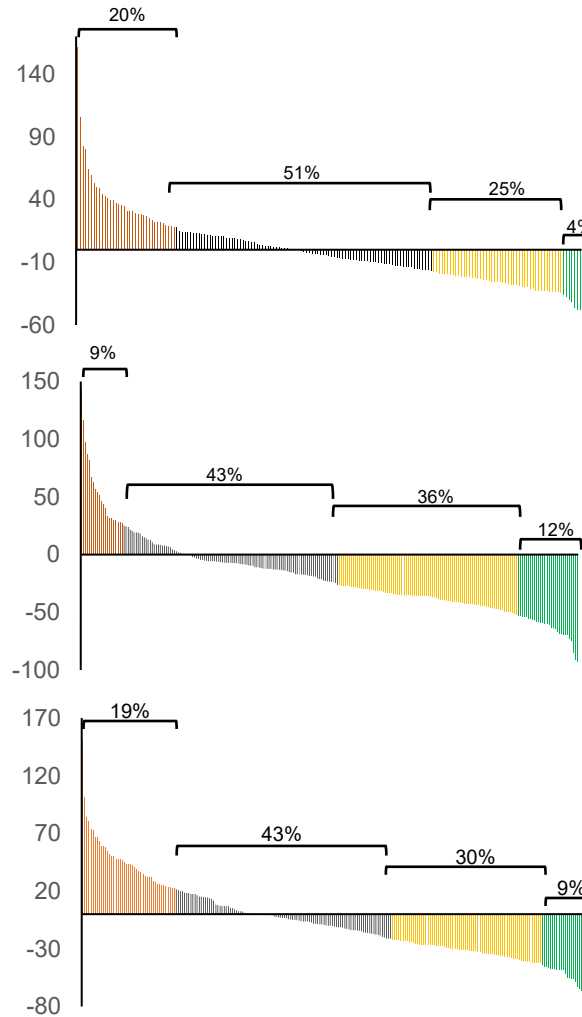
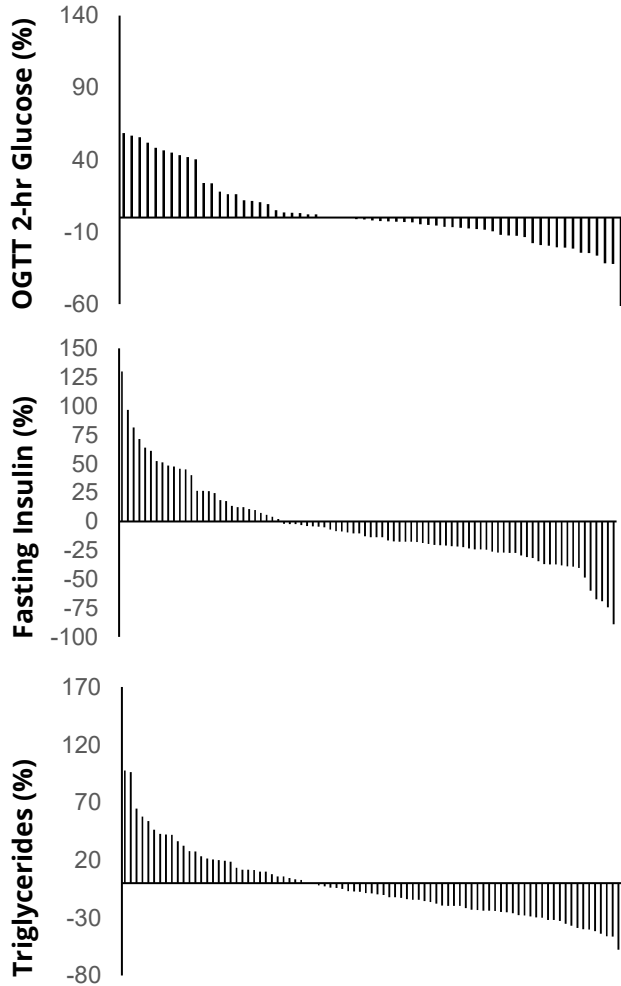
Daily self-recording of Energy intake

Individual cardiometabolic response (%) to standardized exercise in adults with obesity

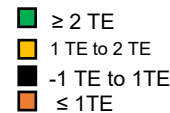
Control

Intervention

Control = 87
Exercise = 251



Time-matched control group
Criterion/reference methods
 Supervised, standardized exercise
 24hr PA - Accelerometry
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Determining the existence of **exercise-induced variability** for any trait is a complex issue.

For researchers:

Time-matched *control group* in the trial design?

Measure the outcome twice at each time point (pre-post) – improve precision

Measure the outcome at multiple time points throughout the intervention

Account for physical activity outside of that prescribed, dietary intake

$$SD_R = \sqrt{SD_I^2 - SD_C^2}$$

Is there exercise-induced variability?

$$TE = \frac{\sqrt{\sum(\text{measure1} - \text{measure2})^2}}{2n}$$

Is the individual exercise response *beyond* the TE derived from the control group?

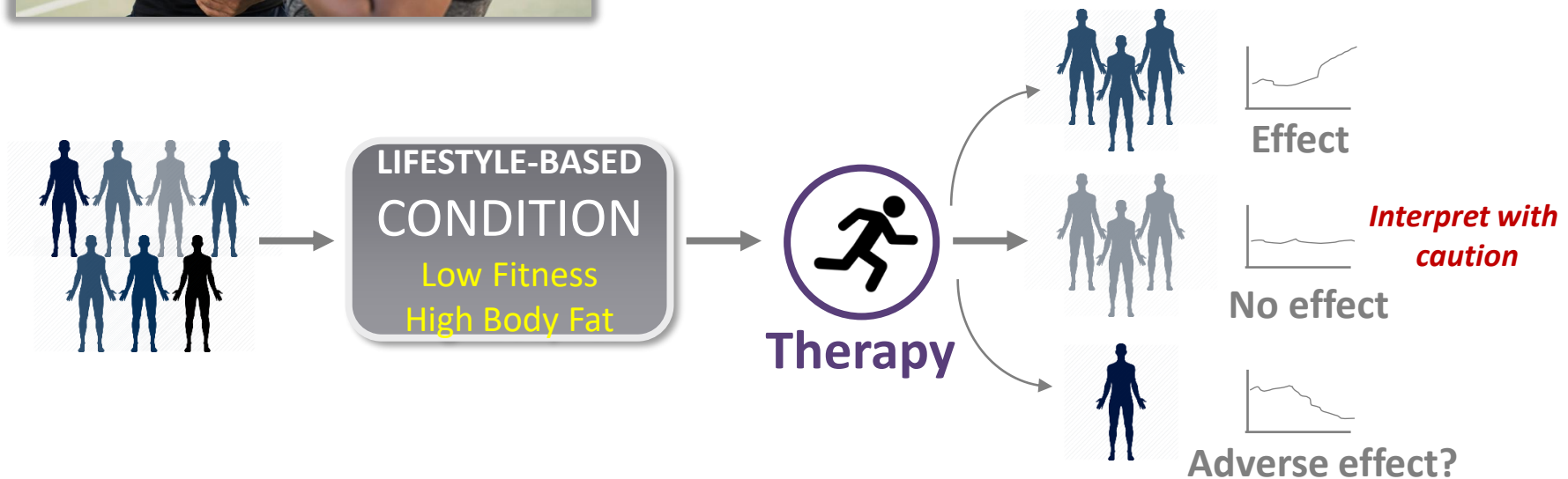
Determining the existence of **exercise-induced variability** for any trait is a complex issue.

For practitioners:



Obesity management guidelines worldwide prescribe increased aerobic-type physical activity (such as brisk walking) for more than 150 minutes per week.

American College of Sports Medicine Position Stands, recommend 200 to 300 minutes a week for sustained weight loss.

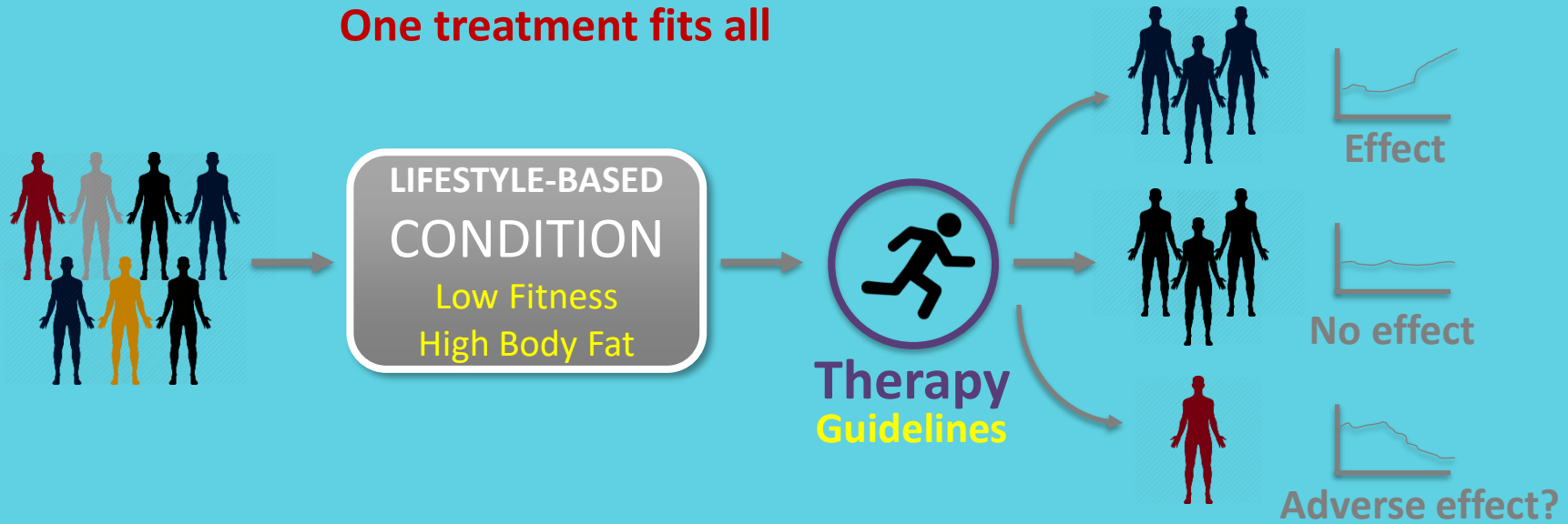


Measure the trait of interest, as often as possible

Measurement precision – TE (measurement error) is it known?

CURRENT EXERCISE AS MEDICINE

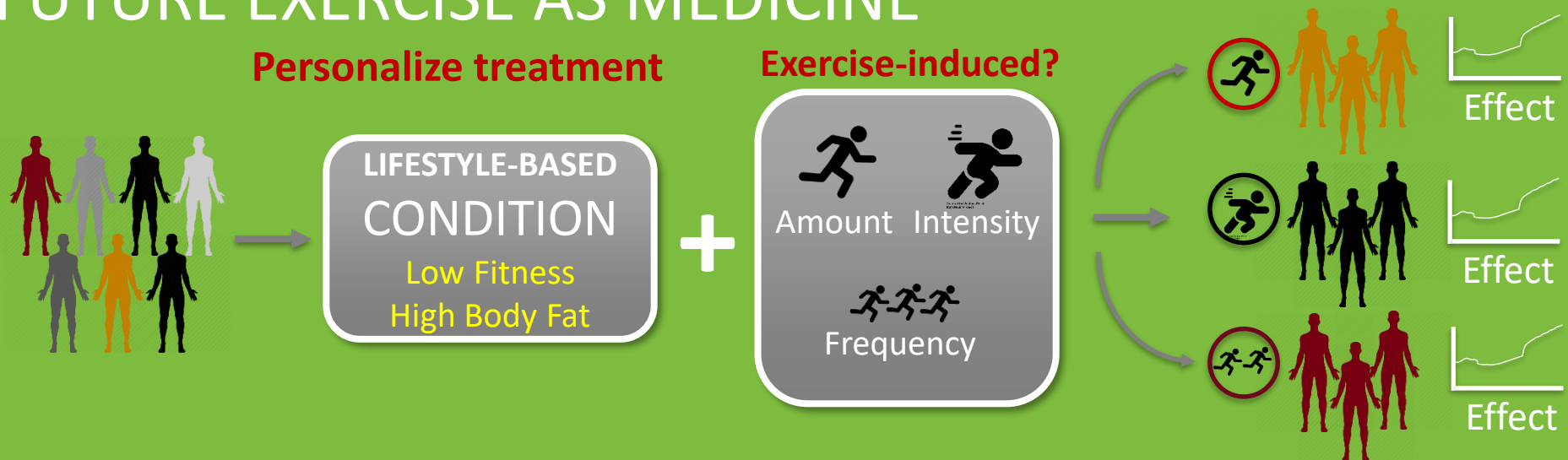
One treatment fits all



FUTURE EXERCISE AS MEDICINE

Personalize treatment

Exercise-induced?





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Thank You