

# The Case for Objective Measurement of Physical Activity

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Diet & -Omics Workshop

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# Overview

1. Questionnaire challenges
2. Population vs. individual-level data
3. Within-person activity time comparisons from 2003-2006

# Characteristics of Questionnaires

- Questionnaires and diaries
  - + Relatively inexpensive
  - Limited reliability and validity
    - General tendency to over-report
    - Low correlation with objective data
  - Burden varies with detail desired
  - + Can provide contextual information
- Commonly used in epidemiology and surveillance as well as for counseling and interventions

# Typical Question Approach (NHIS)

- The next questions are about physical activities (exercise, sports, physically active hobbies...) that you may do in your LEISURE time.
- How often do you do LIGHT OR MODERATE activities for AT LEAST 10 MINUTES that cause ONLY LIGHT sweating or a SLIGHT to MODERATE increase in breathing or heart rate?
- About how long do you do these light or moderate activities each time?

# Questionnaire Challenges

For the Respondent

# Questionnaire Cognitive Challenges

- Frequency
  - Actual vs. typical vs. ideal
- Duration
  - Accumulated short, variable bouts
- Intensity
  - Lost in translation, effect of age
- Integral calculus
  - One question for varying activities

# Complexity of Physical Activity

## What matters for you?

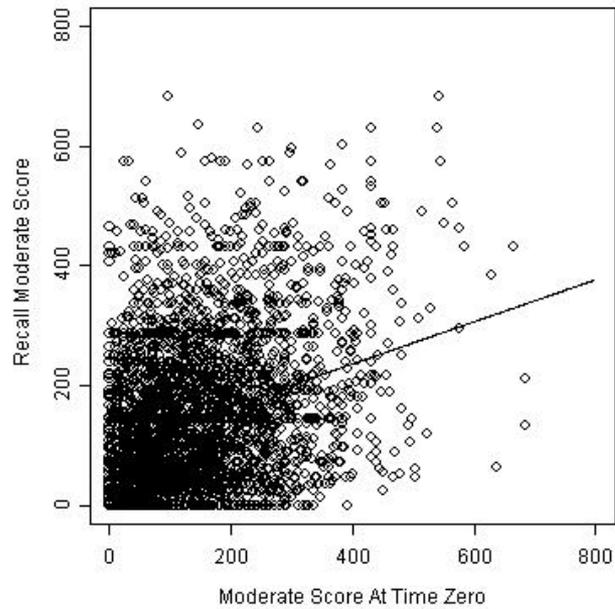
- Activity energy expenditure
- Activity time above some intensity threshold
  - What intensity and how defined (cutpoints)
  - Absolute intensity
  - Relative intensity
- Steps
  - Total
  - Activity steps (sustained bouts)
- Context of activity
  - Occupation
  - Transportation
  - Recreation, sport, leisure
  - Household tasks

# Measures Should Match Needs

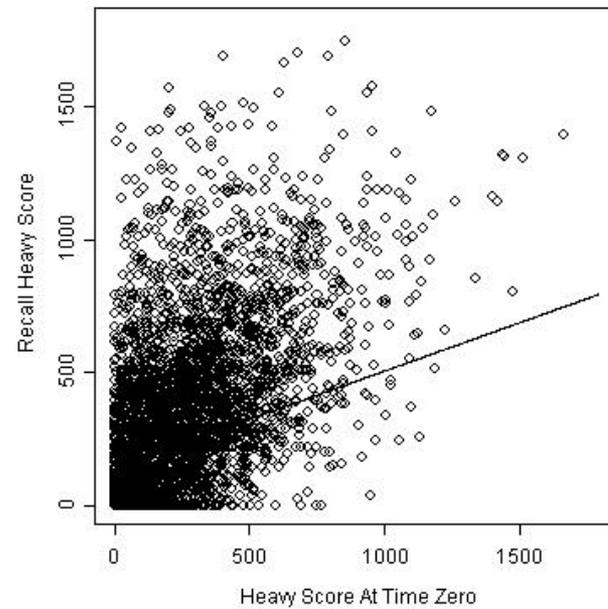
- Population level vs. individual
  - Validated questionnaires
    - Validation may not generalize across groups
    - IPAQ is not valid for interventions
- All sources of activity or only certain ones

# Correlation Scatter Plots

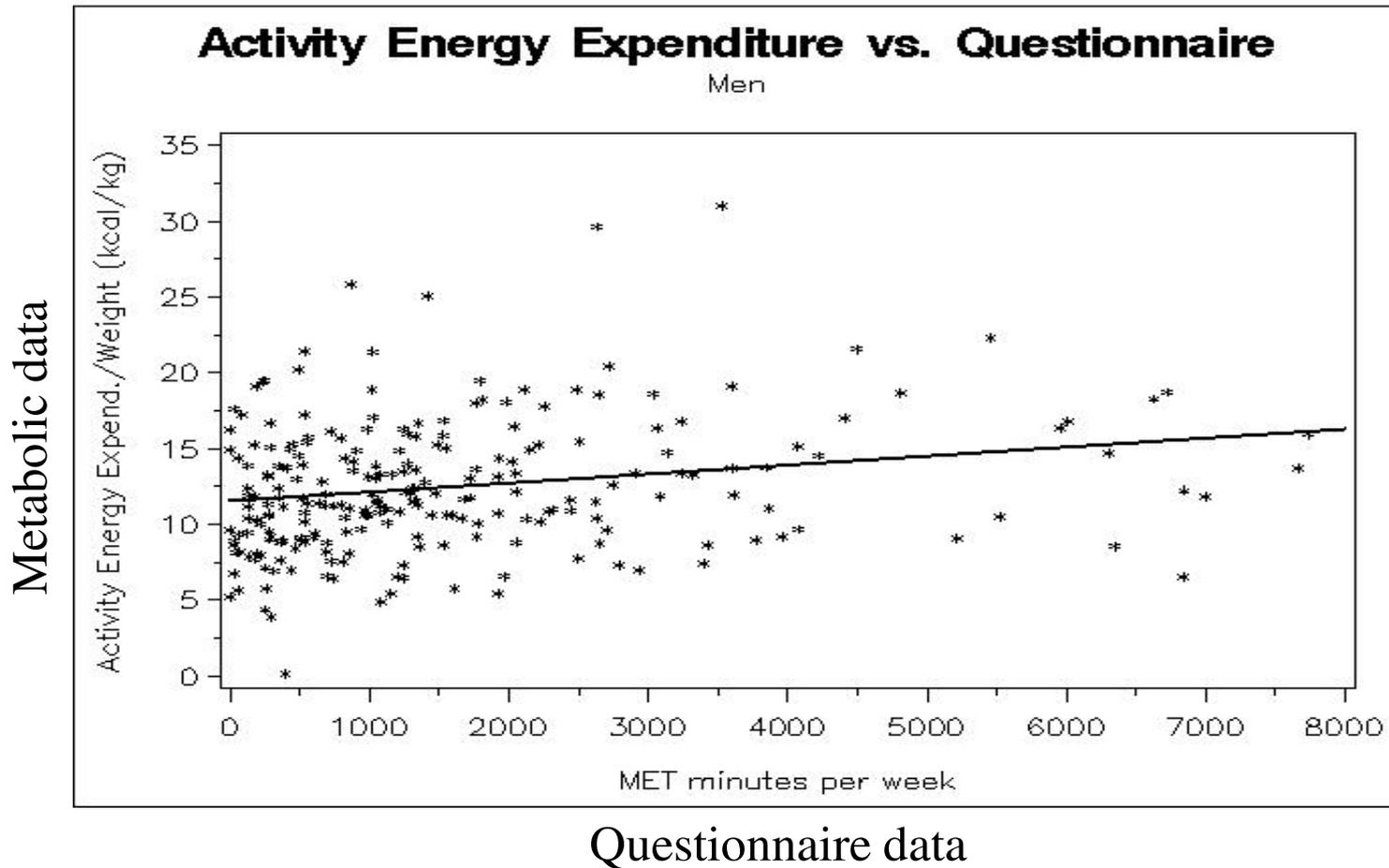
Moderate Activity Scores  
Spearman Correlation = .29



Heavy Activity Scores  
Spearman Correlation = .50



# Questions vs. Metabolic Expenditure



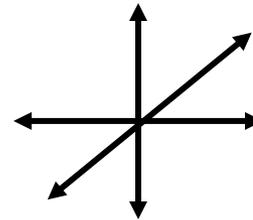
OPEN data, ages 40-69 y

# The Answer to Our Problems?

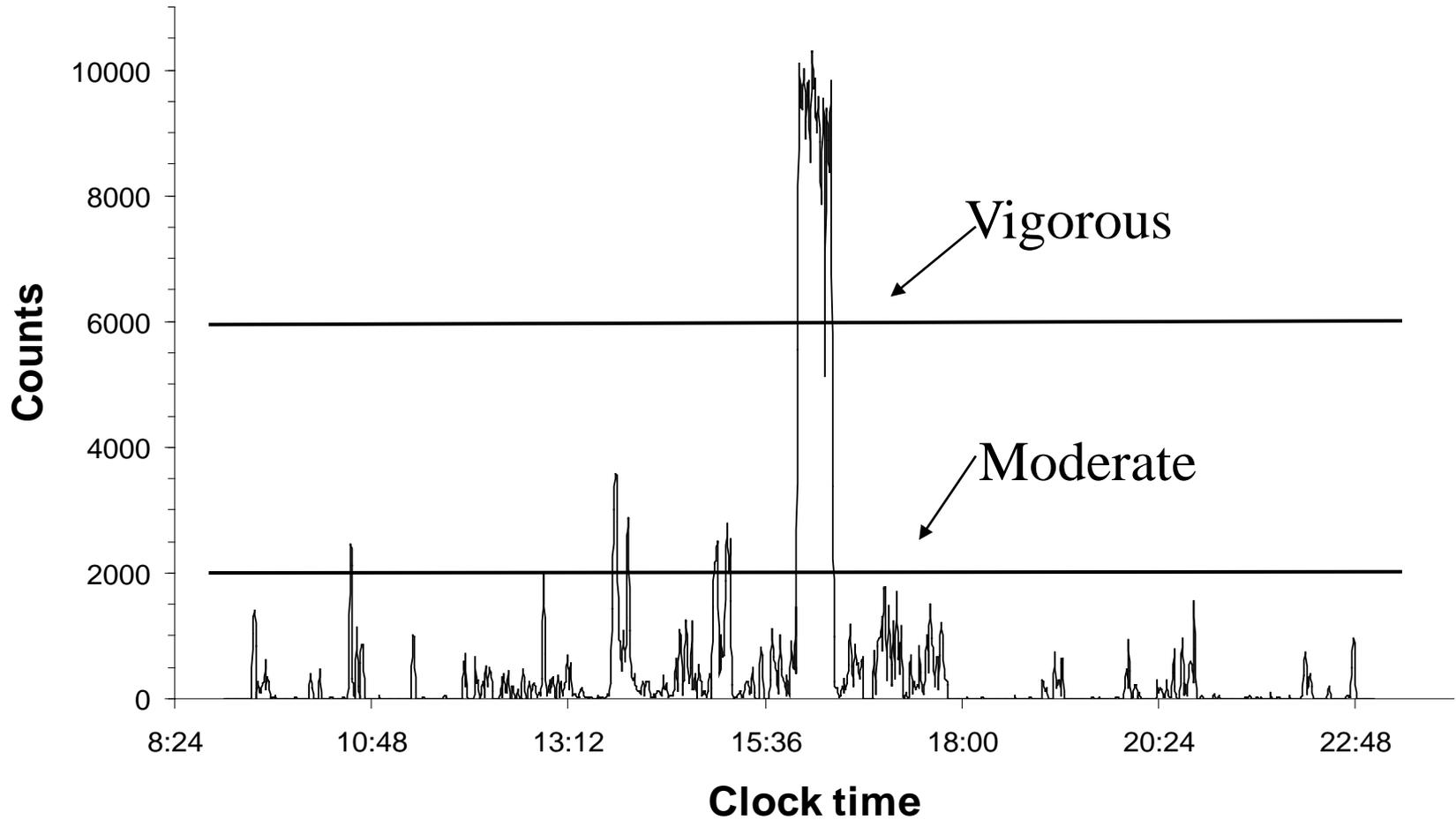


# How Accelerometers Work

- Measures body movement in terms of acceleration
  - related to intensity of physical activity
  - measured in 1 to 3 orthogonal planes
    - anterior-posterior
    - medial-lateral
    - vertical (Actigraph)
  - Data summed over epochs (1 min) and stored as “counts” for later download



# Activity counts



# Benefits of Accelerometers

- Remove cognitive aspect of data collection
- Can monitor multiple days with low burden
- Captures “real-time” intensity, duration, and can derive frequency of bouts
- Non-reactive measurement possible

# Accelerometer Limitations

- Primarily measures locomotor activity
  - misses upper body movement with usual placement
  - cannot distinguish load-carrying vs. not
  - not total activity or energy expenditure
- But walking/running is a primary source of activity
- Does not provide context of activity

# NHANES Physical Activity Questionnaire

- Administered in household interview
- Past 30 days reference period
  - Report times per day, week as desired
- Contexts:
  - Transportation
  - Household tasks
  - Recreational exercise, sports, active hobbies
    - Vigorous and moderate intensity separately
    - Frequency & duration for specific activities engaged for 10+ min

# PA Monitors in NHANES

- Ages 6 y +
  - Wheelchair-bound/non-ambulatory excluded
- Ask for 7 d of wear while awake
  - Take off for water activities (swim, bathe)
- Mail back monitor
- Component response rate ~90%



# National Adherence to Recommendation

## Questionnaire data

- BRFSS 2000: 24%, 2003 ~45%
- NHIS 2000: 31%, 2005: 30%
- NHANES 2003-2004 ~51% (150 min/wk)

## NHANES Accelerometer data

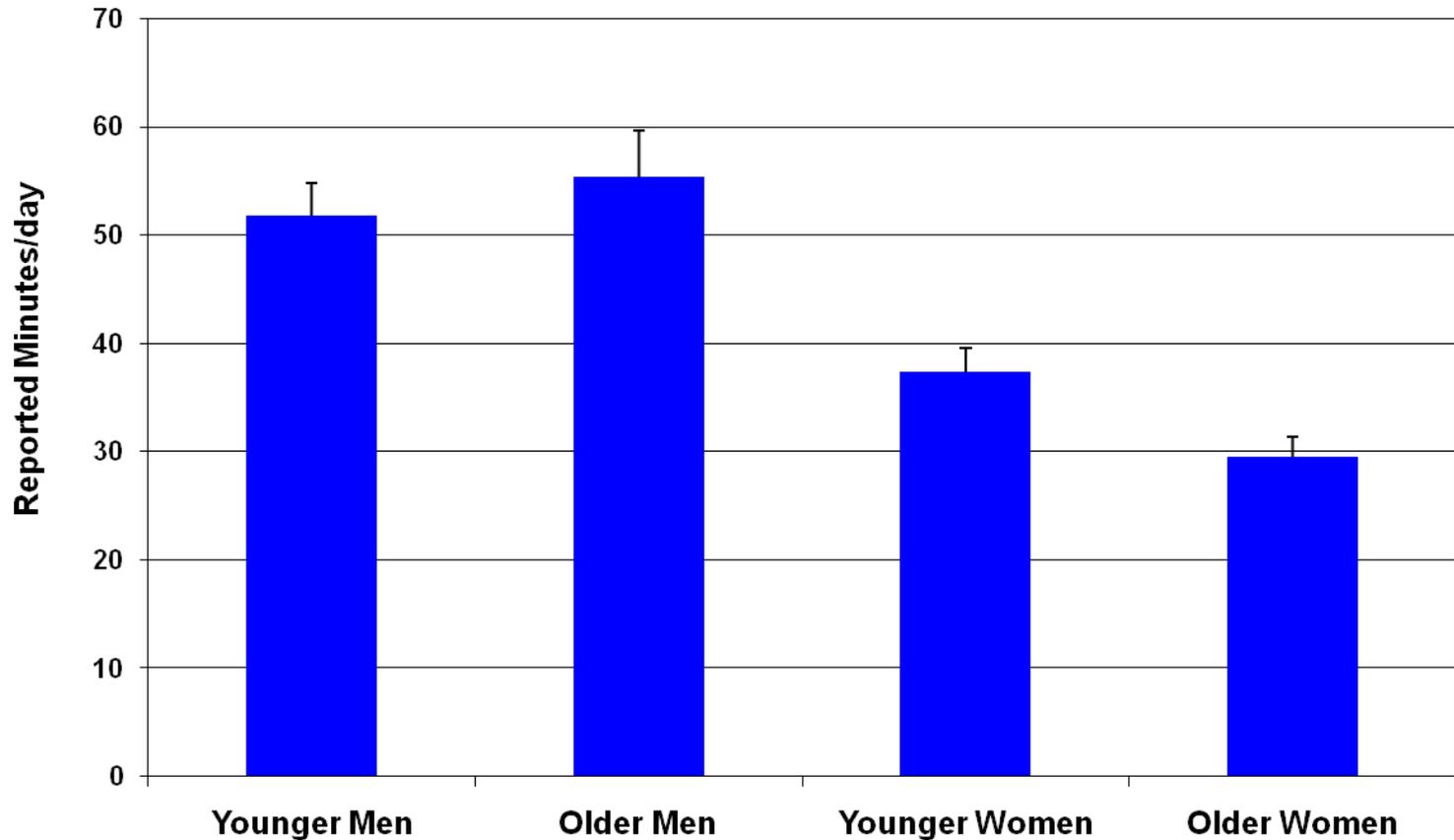
Age	Total	Males	Females
20-59	3.5%	3.8%	3.2%
60+	2.4%	2.5%	2.3%

Empirical Bayes estimate for 5 of 7 days using every valid day  
Troiano et al., 2008 MSSE

# Within-Person Comparisons

- 6093 adults (ages 20 y +) with questionnaire data and accelerometer wear for 4-7 days
- Questionnaire (Q)
  - Summed all minutes reported as moderate or greater intensity
- Accelerometer (A)
  - Summed moderate intensity or greater minutes in “bouts”
- Categorized by zero, non-zero minutes from Q and A
  - Calculated minutes of moderate or greater intensity PA within each category
  - Estimated correlation and attenuation for categories that were non-zero on both measures
  - Divided non-zero groups into quintiles for classification agreement

# Many Minutes Are Reported with Zero Measured Bouts



Percent with no measured bouts

**39.2%**

**66.2%**

**52.8%**

**74.1%**

# Correlation and Attenuation

- Calculated when measured and reported were both non-zero
  - Correlations are quite low, suggesting poor agreement between measures
  - Attenuation factors are similar to correlations in magnitude, suggesting that RR based on self-report may be significantly attenuated

	Men		Women	
	20-59 y	60+ y	20-59 y	60+ y
Correlation	0.17	0.13	0.31	0.23
Attenuation	0.14	0.14	0.27	0.25

# Category Agreement: Men Ages 20-59 y

<i>Accel. Categ</i>	<i>Category Based on Self-Report</i>						<b>Total</b>
	<b>0</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	
<b>0</b>	<b>4.89</b>	9.43	7.70	5.11	6.64	5.42	39.20
<b>1</b>	1.60	<b>1.95</b>	2.51	2.32	1.98	1.75	12.12
<b>2</b>	1.43	2.03	<b>1.96</b>	2.59	1.58	2.51	12.09
<b>3</b>	0.94	2.03	2.31	<b>2.10</b>	2.65	2.21	12.23
<b>4</b>	0.58	1.44	2.07	2.97	<b>2.58</b>	2.47	12.11
<b>5</b>	0.76	0.89	1.57	2.49	2.92	<b>3.62</b>	12.25
<b>Total</b>	10.22	17.77	18.12	17.58	18.35	17.98	100.0

Values are weighted percent within each cell

# Category Agreement: Men Ages 20-59 y

<i>Accel. Categ</i>	<i>Category Based on Self-Report</i>						<b>Total</b>
	0	1	2	3	4	5	
0	4.89	9.43	7.70	5.11	6.64	5.42	39.20
1	1.60	1.95	2.51	2.32	1.98	1.75	12.12
2	1.43	2.03	1.96	2.59	1.58	2.51	12.09
3	0.94	2.03	2.31	2.10	2.65	2.21	12.23
4	0.58	1.44	2.07	2.97	2.58	2.47	12.11
5	0.76	0.89	1.57	2.49	2.92	3.62	12.25
<b>Total</b>	10.22	17.77	18.12	17.58	18.35	17.98	100.0

17.1 % agree

Values are weighted percent within each cell

# Category Agreement: Men Ages 20-59 y

<i>Accel. Categ</i>	<i>Category Based on Self-Report</i>						<b>Total</b>
	0	1	2	3	4	5	
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1	1.60	1.95	2.51	2.32	1.98	1.75	12.12
2	1.43	2.03	1.96	2.59	1.58	2.51	12.09
3	0.94	2.03	2.31	2.10	2.65	2.21	12.23
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<b>Total</b>	10.22	17.77	18.12	17.58	18.35	17.98	100.0

48.6 % agree  
+/- 1 category

Values are weighted percent within each cell

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Note distribution across accelerometer categories for low active individuals

Values are weighted percent within each cell

# Racial-Ethnic Differences

- Overestimate of activity time was smallest for Mexican-Americans
  - Mean differences of 19-36 minutes/day
- Differences were greatest for Non-Hispanic Whites
  - Mean differences of 53-68 minutes/day
- Categorical agreement was poor for all groups
  - M-A 19.8% agree, 48.3% +/- 1 category
  - NH-W 17.2% agree, 48.5% +/-1 category
  - NH-B 17.0% agree, 45.6% +/- 1 category

# Conclusions

- If believe objective data (accelerometer) provide a “truer” measure of moderate or greater intensity physical activity, then:
- Self-reports provide poor estimates of minutes of physical activity
- Substantial misclassification can occur when categories are based on self-report
- Observed relationships between self-reported activity and outcomes may be related to something more than “physical activity”

**“When we measure, we know better.”**

**NCHS NHANES slogan**

Questions?

# Minutes (SEM) of Physical Activity by Zero/Non-zero Category from Q & A

Agreement condition	Men				Women			
	20-59 y		60+ y		20-59 y		60+ y	
	A	Q	A	Q	A	Q	A	Q
A=0, Q>0	<b>A=0</b>	<b>59.2</b> (3.39)	<b>A=0</b>	<b>67.3</b> (5.15)	<b>A=0</b>	<b>44.1</b> (2.60)	<b>A=0</b>	<b>44.1</b> (2.91)
A>0, Q=0	<b>11.8</b> (1.03)	<b>Q=0</b>	<b>7.4</b> (1.77)	<b>Q=0</b>	<b>10.3</b> (1.82)	<b>Q=0</b>	<b>8.5</b> (2.62)	<b>Q=0</b>
A>0, Q>0	<b>14.6</b> (0.64)	<b>75.2</b> (4.30)	<b>14.90</b> (1.28)	<b>86.5</b> (6.00)	<b>13.2</b> (0.59)	<b>67.6</b> (4.23)	<b>14.4</b> (1.05)	<b>72.0</b> (6.35)

# Minutes (SEM) of Physical Activity by Zero/Non-zero Category from Q & A

Agreement condition	Men				Women			
	20-59 y		60+ y		20-59 y		60+ y	
	A	Q	A	Q	A	Q	A	Q
A=0, Q>0	A=0	59.2 (3.39)	A=0	67.3 (5.15)	A=0	44.1 (2.60)	A=0	44.1 (2.91)
A>0, Q=0	11.8 (1.03)	Q=0	7.4 (1.77)	Q=0	10.3 (1.82)	Q=0	8.5 (2.62)	Q=0
A>0, Q>0	14.6 (0.64)	75.2 (4.30)	14.90 (1.28)	86.5 (6.00)	13.2 (0.59)	67.6 (4.23)	14.4 (1.05)	72.0 (6.35)

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# Category Agreement: Women, 20-59 y

<i>Accel. Categ</i>	<i>Category Based on Self-Report</i>						<b>Total</b>
	<b>0</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	
<b>0</b>	7.77	11.51	9.07	9.83	6.80	6.43	51.42
<b>1</b>	0.91	<b>2.54</b>	1.23	1.95	1.14	1.65	9.42
<b>2</b>	0.77	1.20	<b>2.72</b>	1.51	2.11	1.44	9.76
<b>3</b>	0.42	1.22	1.88	<b>1.52</b>	2.78	2.11	9.94
<b>4</b>	0.67	0.89	0.78	2.35	<b>2.38</b>	2.60	9.67
<b>5</b>	0.32	0.31	1.07	1.63	2.74	<b>3.73</b>	9.80
<b>Total</b>	10.87	17.67	16.74	18.81	17.96	17.95	100.0

Values are weighted percent within each cell

# Agreement: Men Ages 60+ y

<i>Accel. Categ</i>	<i>Category Based on Self-Report</i>						<b>Total</b>
	<b>0</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	
<b>0</b>	<i>12.77</i>	12.07	12.40	8.12	10.34	9.69	65.38
<b>1</b>	0.77	<i>0.35</i>	1.05	1.71	2.09	0.77	6.74
<b>2</b>	0.53	0.59	<i>1.62</i>	1.43	1.29	1.44	6.90
<b>3</b>	0.53	1.29	0.89	<i>1.05</i>	1.28	1.89	6.92
<b>4</b>	0.57	0.98	1.69	0.86	<i>1.46</i>	1.53	7.11
<b>5</b>	0.35	0.23	0.55	1.64	2.43	<i>1.75</i>	6.95
<b>Total</b>	15.51	15.52	18.20	14.81	18.88	17.07	100.0

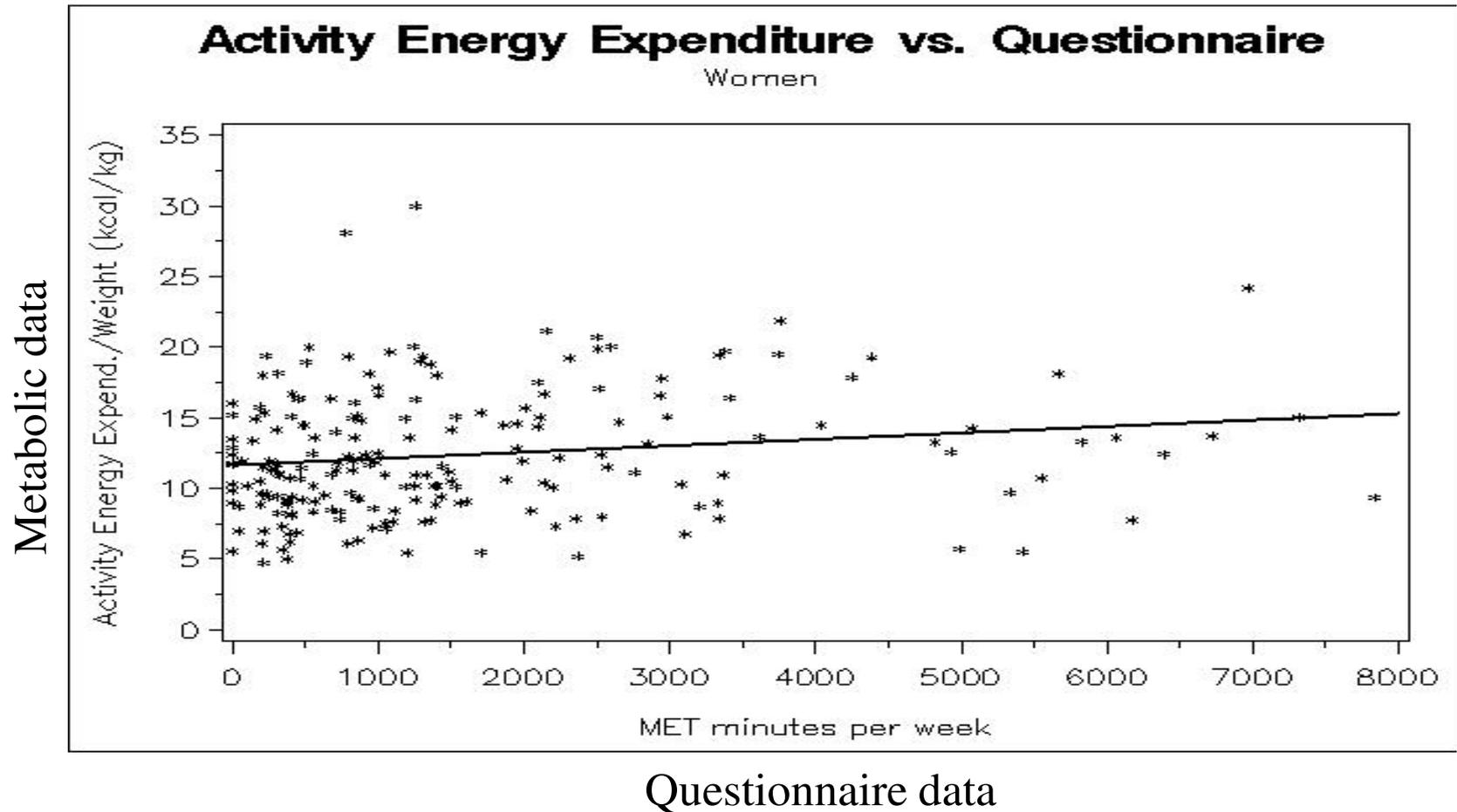
Values are weighted percent within each cell

# Agreement: Women Ages 60+ y

<i>Accel. Categ</i>	<i>Category Based on Self-Report</i>						<b>Total</b>
	<b>0</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	
<b>0</b>	<b>24.41</b>	13.26	10.64	9.94	7.76	7.28	73.30
<b>1</b>	0.42	<b>0.87</b>	1.17	0.77	1.16	0.81	5.20
<b>2</b>	0.32	0.32	<b>1.60</b>	0.63	1.24	1.27	5.40
<b>3</b>	0.13	0.10	0.86	<b>1.35</b>	1.02	1.95	5.42
<b>4</b>	0.04	0.16	0.34	0.64	<b>2.31</b>	1.58	5.07
<b>5</b>	0.02	0.00	0.35	1.71	1.40	<b>2.14</b>	5.62
<b>Total</b>	25.35	14.72	14.96	15.04	14.89	15.03	100.0

Values are weighted percent within each cell

# Questions vs. Metabolic Expenditure



OPEN data, ages 40-69 y