

SUPPLEMENTARY MATERIAL

An interactive tool to personalise 24-hour activity, sitting and sleep prescription for optimal health outcomes. Maddison L Mellow¹, Tyman E Stanford¹, Timothy Olds¹, Aaron Miatke¹, & Ashleigh E Smith^{1†}, Dorothea Dumuid^{1†*}.

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Supplementary File 1

Summary of inclusion and exclusion criteria

UK Biobank code and URL link	Description of variable	Rules for inclusion
f.864.0.0 (864)		Response was <u>not</u> -2 ("unable to walk")
f.864.1.0 (864)	Number of days/week walked 10+ minutes	
f.864.2.0 (864)		
f.864.3.0 (864)		
f.90015.0.0 (90015)	Valid wear time (indicator of accelerometry data quality)	valid_wear=1 (yes)
f.90002.0.0 (90002)	Data problem indicator	Data_prob_ind=NA (no problems indicated)
f.20242.0.0 (20242)	Fluid intelligence completion status	≥4 cognitive tests completed
f.20244.0.0 (20244)	Pairs matching completion status	
f.20245.0.0 (20245)	Symbol digit substitution completion status	*note: based on completion status variables=1 (yes), and date/time numeric memory test completed ≠ NA.
f.20246.0.0 (20246)	Trail making completion status	
f.20138.0.0 (20138)	When numeric memory test completed	
f.53.0.0 (53)	Date of attending assessment centre	At least one date ≠ NA (i.e., participant has attended at least one assessment centre visit)
f.53.1.0 (53)		
f.53.2.0 (53)		
f.53.3.0 (53)		
f.90010.0.0 (90010)	Start time of accelerometer wear	
(130836)	Date F00 (dementia in Alzheimer's disease) first reported	Date of diagnosis occurred later than: 1. Date of attending assessment centre (53) 2. Start of accelerometer wear time (90010) 3. When numeric memory test completed (20138)
(130838)	Date F01 (vascular dementia) first reported	
(130840)	Date F02 (dementia in other diseases classified elsewhere) first reported	

UK Biobank code and URL link	Description of variable	Rules for inclusion
(130842)	Date F03 (unspecified dementia) first reported	4. When pairs matching test completed (20134) 5. When fluid intelligence test completed (20135) 6. When trail making test completed (20136) 7. When symbol digit substitution test completed (20137)
(130844)	Date F04 (organic amnesic syndrome, not induced by alcohol and other psychoactive substances) first reported	
(130846)	Date F05 (delirium, not induced by alcohol and other psychoactive substances) first reported	
(131012)	Date G10 (Huntington's disease) first reported	
(131014)	Date G11 (hereditary ataxia) first reported	
(131016)	Date G12 (spinal muscular atrophy and related syndromes) first reported	
(131018)	Date G13 (systemic atrophies primarily affecting central nervous system in diseases classified elsewhere) first reported	
(131022)	Date G20 (Parkinson's disease) first reported	
(131024)	Date G21 (secondary parkinsonism) first reported	
(131026)	Date G22 (parkinsonism in diseases classified elsewhere) first reported	
(131036)	Date G30 (Alzheimer's disease) first reported	
(131038)	Date G31 (other degenerating diseases of the nervous system, not classified elsewhere) first reported	
(131042)	Date G35 (multiple sclerosis) first reported	
(131044)	Date G36 (other acute disseminated demyelination) first reported	
(131046)	Date G37 (other demyelinating diseases of the central nervous system) first reported	
(131212)	Date H54 (blindness and low vision) first reported	

Supplementary File 2

Summary of original and re-classified variables included in final analyses

UK Biobank code and URL link	Variable/risk factor	Description of measure	Original levels and/or format	Restructured variable*	Notes
f.eid	ID	ID code	<i>Numeric</i>	<i>Numeric</i>	
f.31.0.0 (31)	Sex	Sex	Male	Male	
f.34.0.0 (34)			Female	Female	
f.52.0.0 (52)	Age	Year of birth	YYYY		All birthdates assumed to be on the 15 th day of the month. Age was defined as the years between the approximated birth date, and the date of cognitive testing.
		Month of birth	MM	Approximate age at cognitive testing	
f.53.0.0 (53)	Date of attending assessment centre	Date of attending assessment centre	YYYY-MM-DD	YYYY-MM-DD	
f.53.1.0 (53)					
f.53.2.0 (53)					
f.53.3.0 (53)					
f.1558.0.0 (1558)	Alcohol consumption	“About how often do you drink alcohol?”	Daily or almost daily		
f.1558.1.0 (1558)			Three to four times a week	“Often/very often”	
f.1558.2.0 (1558)			Once or twice a week		
f.1558.3.0 (1558)			One to three times a month	“Sometimes/never”	
			Special occasions only		
			Never		

UK Biobank code and URL link	Variable/risk factor	Description of measure	Original levels and/or format	Restructured variable*	Notes	
			Prefer not to answer	“Unknown”		
f.21001.0.0 (21001)	Obesity	BMI value derived from height and weight measured during initial assessment centre visit	Numeric	Overweight	BMI>25	
f.21001.1.0 (21001)						
f.21001.2.0 (21001)				Not overweight	BMI≤25	
f.21001.3.0 (21001)						
f.2020.0.0 (2020)	Social isolation	“Do you often feel lonely?”	Yes	Yes		
f.2020.1.0 (2020)			No	No		
f.2020.2.0 (2020)			Do not know	“Unknown”		
f.2020.3.0 (2020)			Prefer not to answer			
f.2247.0.0 (2247)	Hearing loss	“Do you have any difficulty with your hearing?”	I am completely deaf	“Yes”		
f.2247.1.0 (2247)			Yes			
f.2247.2.0 (2247)			No	No		
f.2247.3.0 (2247)			Do not know	“Unknown”		
	Prefer not to answer					
f.6150.0.0 (6150)	Hypertension	“Has a doctor ever told you that you have had any of the following conditions?”	Yes	Yes	Hypertension was one of six possible conditions that could be indicated as ‘yes’, ‘no’, or ‘unknown’.	
f.6150.0.1 (6150)			No	No		
f.6150.0.2 (6150)			Unknown	Unknown		
f.6150.0.3 (6150)						
f.4596.0.0 (4598)	Depression	“Looking back over your life, have you ever had a time when you were feeling depressed or down for at least a whole week?”	Yes	Yes		
			No	No		
			Do not know	“Unknown”		
			Prefer not to answer			
f.2443.0.0 (2443)	Diabetes	“Has a doctor ever told you that you have diabetes?”	Yes	Yes		
			No	No		
			Do not know	“Unknown”		
			Prefer not to answer			

UK Biobank code and URL link	Variable/risk factor	Description of measure	Original levels and/or format	Restructured variable*	Notes
f.6138.0.0 (6138)	Education/qualifications	“Which of the following qualifications do you have? (You can select more than one)”	A levels/ AS levels or equivalent	“High school”	Restructured variable “ <i>highest qualification</i> ” ranked the reported qualifications (across all available assessment centre datapoints) from highest to lowest, resulting in only one category per ID number.
f.6138.0.1 (6138)			O levels/ GCSEs or equivalent		
f.6138.0.2 (6138)			CSEs or equivalent		
f.6138.0.3 (6138)			NVQ or HND or HNC or equivalent	“Certificate III/Diploma”	
f.6138.0.4 (6138)			Other professional qualifications e.g., nursing, teaching		
f.6138.0.5 (6138)			College or university degree	“College/University”	
f.6138.1.0 (6138)			None of the above		
f.6138.1.1 (6138)			Prefer not to answer	“Unknown”	
f.6138.1.2 (6138)					
f.6138.1.3 (6138)					
f.6138.1.4 (6138)					
f.6138.1.5 (6138)					
f.6138.2.0 (6138)					
f.6138.2.1 (6138)					
f.6138.2.2 (6138)					
f.6138.2.3 (6138)					
f.6138.2.4 (6138)					
f.6138.2.5 (6138)					
f.6138.3.0 (6138)				Original education levels were mapped to Australian equivalents, as the final Shiny application was used by Australian participants.	
f.6138.3.1 (6138)					
f.6138.3.2 (6138)					
f.6138.3.3 (6138)					
f.6138.3.4 (6138)					
f.6138.3.5 (6138)					
f.20116.0.0 (20116)	Smoking status	Combination of two questions: “Do you smoke tobacco now?” and “In the past, how often have you smoked tobacco?”	Current	Current	
f.20116.1.0 (20116)			Previous	Previous	
f.20116.2.0 (20116)			Never	Never	
f.20116.3.0 (20116)			Prefer not to answer	“Unknown”	
f.21000.0.0 (21000)	Ethnic background	“What is your ethnic group?”	White Mixed	White Non-White	The top-level response for this

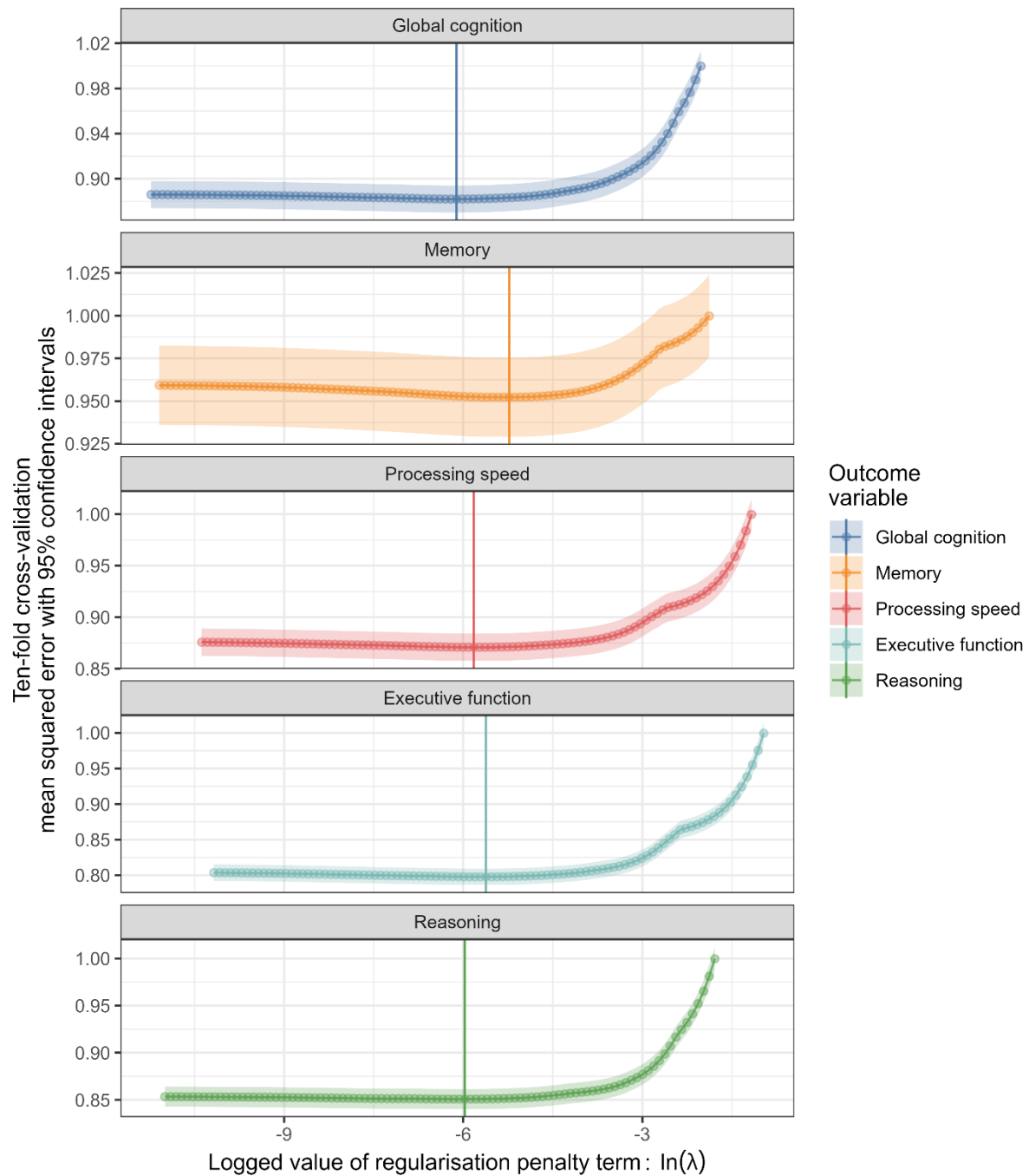
UK Biobank code and URL link	Variable/risk factor	Description of measure	Original levels and/or format	Restructured variable*	Notes
			<div>Asian or Asian British</div> <div>Black or Black British</div> <div>Chinese</div> <div>Other ethnic group</div> <div>Do not know</div>		<div>variable was used to classify ethnic background.</div> <div>Due to extreme skewness in ethnicity variable, the default level 'White' was used in all modelling. The question was not asked in the final app due to misalignment with Australian contexts.</div>
f.20132.0.0 (20132)	Memory	Pairs Matching: number of incorrect matches in round	Numeric	Numeric (age- and sex-standardised z-score)	
f.20240.0.0 (20240)		Numeric Memory: maximum digits remembered correctly	Numeric		
f.20156.0.0 (20156)	Processing Speed	Trail Making: duration to complete Trails A (numeric path)	Numeric	Numeric (age- and sex-standardised z-score)	
f.20159.0.0 (20159)		Symbol Digit Substitution: number of symbol digit matches made correctly	Numeric		
f.20157.0.0 (20157)	Executive Function	Trail Making: duration to complete Trails B (alphanumeric path)	Numeric	Numeric	

UK Biobank code and URL link	Variable/risk factor	Description of measure	Original levels and/or format	Restructured variable*	Notes
f.20191.0.0 (20191)	Reasoning	Fluid Intelligence: fluid intelligence score global	<i>Numeric</i>	<i>Numeric</i>	
-	Global cognitive function	*mean of Memory, Processing Speed, Executive Function and Reasoning z-scores/scores	<i>Numeric</i>	<i>Numeric</i>	
f.90010.0.0 (90010)	Start time of accelerometer wear	Start time of accelerometer wear			

Note. The original UK biobank variables, their levels and format, compared to the restructured variable. Where necessary, variables were re-structured to align with Australian classifications. BMI=body mass index.

Supplementary File 3

Lambda value derived from 10-fold cross-validation

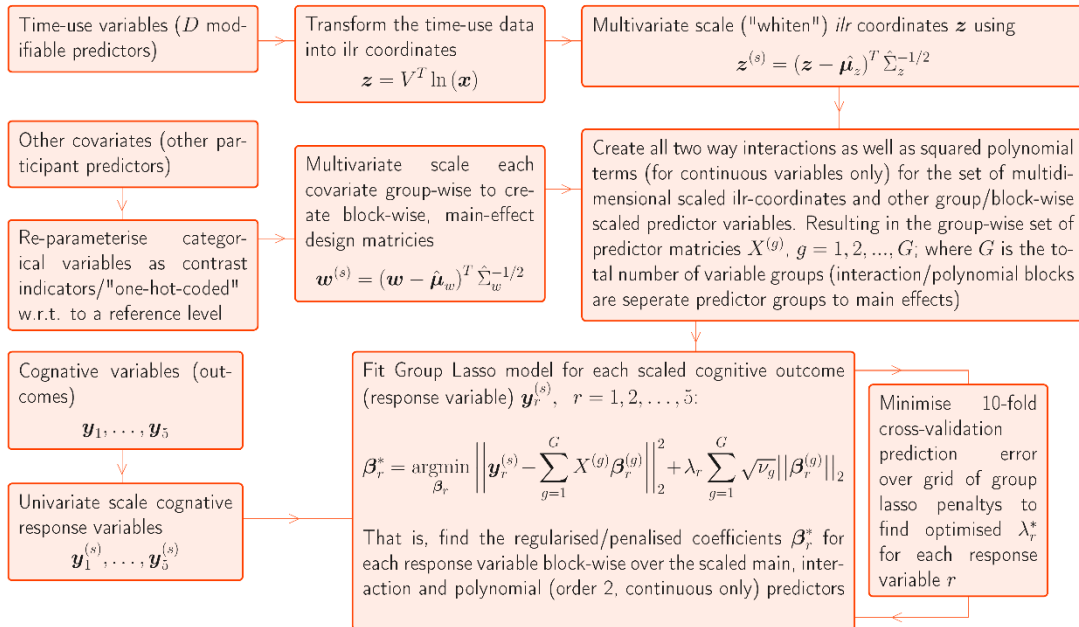


Note. Empirically derived penalty values applied to the group LASSO shrinkage procedure for each cognitive outcome (listed in header). The logged value of the regularisation penalty term ($\ln(\lambda)$) is displayed (x-axis, with lambda value indicated by vertical coloured line) against the mean squared error (MSE, y-axis).

Supplementary File 4

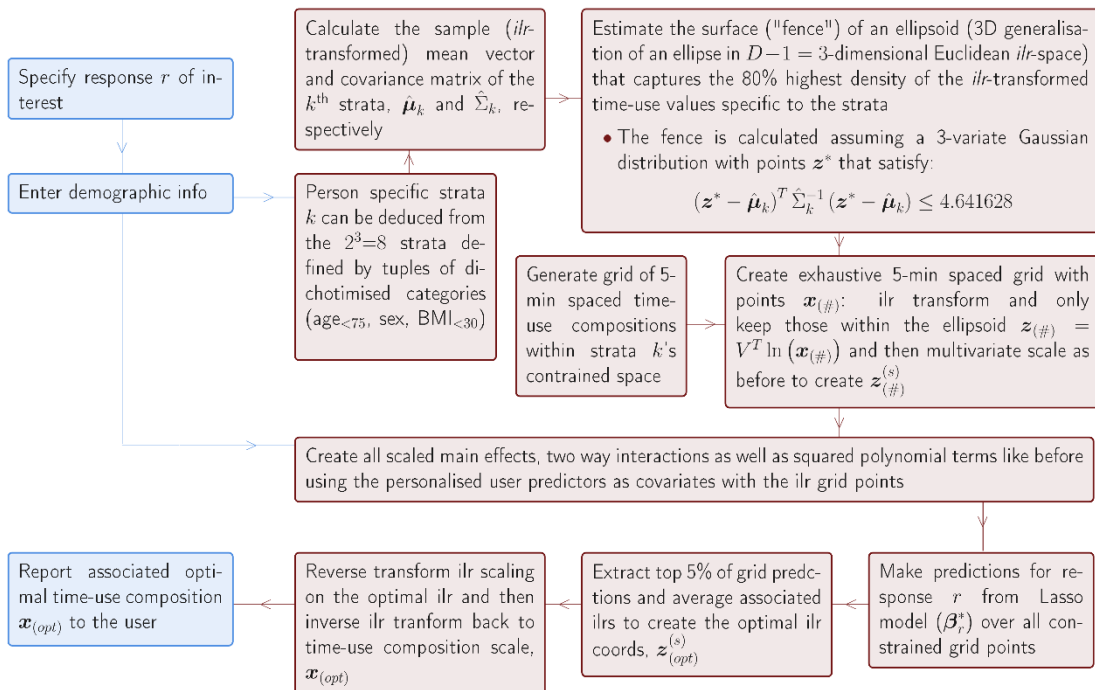
Workflow underpinning the R Shiny 'ideal day' app.

Model building



User side

Personalised optimisation



Supplementary File 5

Demographic characteristics across strata

Characteristic	Level	Overall sample	Strata classification							
			Females, <65, wo/ obesity	Females, <65, w/obesity	Females, ≥65, wo/ obesity	Females, ≥65, w/obesity	Males, <65, wo/ obesity	Males, <65, w/obesity	Males, ≥65, wo/ obesity	Males, ≥65, w/obesity
<i>N</i>		53,057	15,303	3,259	9,465	2,064	9,610	2,451	8,809	2,096
Age (years)		62 (8)	57 (5)	57 (5)	69 (3)	69 (3)	57 (5)	57 (5)	70 (3)	70 (3)
Sex (%)	Female	30,091 (57%)	15,303 (100%)	3,259 (100%)	9,465 (100%)	2,064 (100%)	-	-	-	-
	Male	22,966 (43%)	-	-	-	-	9,610 (100%)	2,451 (100%)	8,809 (100%)	2,096 (100%)
24-hr time-use composition	Sleep	542.7	542.3	542.2	543.8	542.3	533.4	528.7	546.6	551.2
	SB	576.9	549.4	595.7	549.4	603.1	595.5	632.2	588.0	630.8
	LPA	291.2	318.1	287.0	322.6	283.0	267.3	251.8	267.9	237.8
	MVPA	29.2	30.1	15.0	24.3	11.6	43.7	27.3	37.4	20.2
BMI		26.6 (4.5)	24.2 (2.8)	34.5 (4.1)	24.7 (2.7)	33.8 (3.7)	25.5 (2.5)	33.4 (3.4)	25.8 (2.4)	33.0 (3.0)
Highest qualification	High school	10,637 (20%)	3,234 (21%)	799 (25%)	2,332 (25%)	532 (26%)	1,552 (16%)	472 (19%)	1,336 (15%)	380 (18%)

Characteristic	Level	Overall sample	Strata classification							
			Females, <65, wo/ obesity	Females, <65, w/obesity	Females, ≥65, wo/ obesity	Females, ≥65, w/obesity	Males, <65, wo/ obesity	Males, <65, w/obesity	Males, ≥65, wo/ obesity	Males, ≥65, w/obesity
	Certificate III or Diploma	5,805 (11%)	1,499 (9.8%)	424 (13%)	549 (5.8%)	176 (8.5%)	1,298 (14%)	404 (16%)	1,138 (13%)	317 (15%)
	College/University	24,742 (47%)	7,918 (52%)	1,336 (41%)	3,820 (40%)	638 (31%)	5,232 (54%)	1,012 (41%)	4,081 (46%)	705 (34%)
	Other professional qualification	8,092 (15%)	2,148 (14%)	520 (16%)	1,712 (18%)	401 (19%)	1,208 (13%)	420 (17%)	1,317 (15%)	366 (17%)
	<i>Unknown</i>	3,781 (7.1%)	504 (3.3%)	180 (5.5%)	1,052 (11%)	317 (15%)	320 (3.3%)	143 (5.8%)	937 (11%)	328 (16%)
Depression	Yes	10,734 (20%)	3,470 (23%)	840 (26%)	1,977 (21%)	465 (23%)	1,658 (17%)	511 (21%)	1,422 (16%)	391 (19%)
	No	9,141 (17%)	2,302 (15%)	400 (12%)	1,544 (16%)	338 (16%)	1,863 (19%)	443 (18%)	1,798 (20%)	453 (22%)
	<i>Unknown</i>	33,182 (63%)	9,531 (62%)	2,019 (62%)	5,944 (63%)	1,261 (61%)	6,089 (63%)	1,497 (61%)	5,589 (63%)	1,252 (60%)
Diabetes	Yes	1,665 (3.2%)	157 (1.0%)	181 (5.6%)	160 (1.7%)	143 (6.9%)	166 (1.7%)	207 (8.4%)	357 (4.1%)	294 (14%)
	No	51,295 (97%)	15,120 (99%)	3,071 (94%)	9,290 (98%)	1,915 (93%)	9,429 (98%)	2,233 (91%)	8,438 (96%)	1,799 (86%)
	<i>Unknown</i>	97 (0.2%)	26 (0.2%)	7 (0.2%)	15 (0.2%)	6 (0.3%)	15 (0.2%)	11 (0.4%)	14 (0.2%)	3 (0.1%)

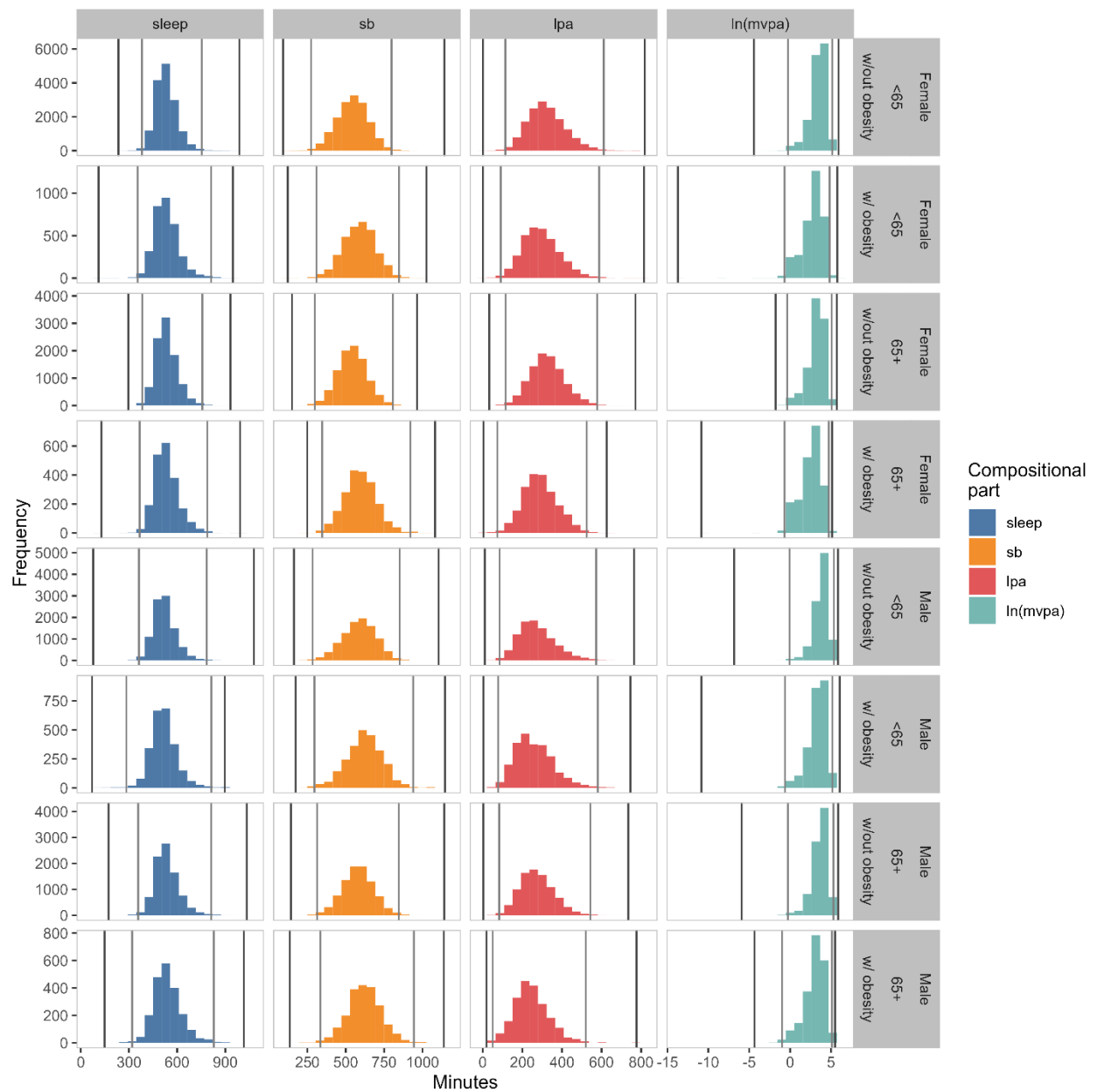
			Strata classification							
Characteristic	Level	Overall sample	Females, <65, wo/ obesity	Females, <65, w/obesity	Females, ≥65, wo/ obesity	Females, ≥65, w/obesity	Males, <65, wo/ obesity	Males, <65, w/obesity	Males, ≥65, wo/ obesity	Males, ≥65, w/obesity
Hearing difficulty	Yes	12,713 (24%)	2,492 (16%)	667 (20%)	2,287 (24%)	557 (27%)	2,157 (22%)	641 (26%)	3,143 (36%)	769 (37%)
	No	38,221 (72%)	12,138 (79%)	2,401 (74%)	6,744 (71%)	1,412 (68%)	7,152 (74%)	1,731 (71%)	5,379 (61%)	1,264 (60%)
	<i>Unknown</i>	2,123 (4.0%)	673 (4.4%)	191 (5.9%)	434 (4.6%)	95 (4.6%)	301 (3.1%)	79 (3.2%)	287 (3.3%)	63 (3.0%)
Hypertension	Yes	12,595 (24%)	1,723 (11%)	949 (29%)	2,319 (25%)	924 (45%)	1,558 (16%)	948 (39%)	2,963 (34%)	1,211 (58%)
	No	40,390 (76%)	13,561 (89%)	2,304 (71%)	7,130 (75%)	1,135 (55%)	8,040 (84%)	1,501 (61%)	5,836 (66%)	883 (42%)
	<i>Unknown</i>	72 (0.1%)	19 (0.1%)	6 (0.2%)	16 (0.2%)	5 (0.2%)	12 (0.1%)	2 (<0.1%)	10 (0.1%)	2 (<0.1%)
Social isolation	Yes	7,851 (15%)	2,592 (17%)	777 (24%)	1,373 (15%)	376 (18%)	1,283 (13%)	447 (18%)	750 (8.5%)	253 (12%)
	No	44,584 (84%)	12,506 (82%)	2,443 (75%)	7,981 (84%)	1,661 (80%)	8,201 (85%)	1,983 (81%)	7,979 (91%)	1,830 (87%)
	<i>Unknown</i>	622 (1.2%)	205 (1.3%)	39 (1.2%)	111 (1.2%)	27 (1.3%)	126 (1.3%)	21 (0.9%)	80 (0.9%)	13 (0.6%)
Smoking status	Current	3,447 (6.5%)	1,000 (6.5%)	220 (6.8%)	366 (3.9%)	88 (4.3%)	851 (8.9%)	222 (9.1%)	562 (6.4%)	138 (6.6%)

Characteristic	Level	Overall sample	Strata classification							
			Females, <65, wo/ obesity	Females, <65, w/obesity	Females, ≥65, wo/ obesity	Females, ≥65, w/obesity	Males, <65, wo/ obesity	Males, <65, w/obesity	Males, ≥65, wo/ obesity	Males, ≥65, w/obesity
	Previous	18,960 (36%)	4,529 (30%)	1,090 (33%)	3,483 (37%)	845 (41%)	2,906 (30%)	968 (39%)	3,915 (44%)	1,224 (58%)
	Never	30,532 (58%)	9,743 (64%)	1,944 (60%)	5,589 (59%)	1,127 (55%)	5,837 (61%)	1,256 (51%)	4,312 (49%)	724 (35%)
	<i>Unknown</i>	118 (0.2%)	31 (0.2%)	5 (0.2%)	27 (0.3%)	4 (0.2%)	16 (0.2%)	5 (0.2%)	20 (0.2%)	10 (0.5%)
Alcohol consumption (frequency)	Often/very often	12,415 (23%)	2,750 (18%)	337 (10%)	2,402 (25%)	314 (15%)	2,395 (25%)	519 (21%)	3,042 (35%)	656 (31%)
	Sometimes/never	26,641 (50%)	8,474 (55%)	2,298 (71%)	4,818 (51%)	1,393 (67%)	4,282 (45%)	1,281 (52%)	3,231 (37%)	864 (41%)
	<i>Unknown</i>	14,001 (26%)	4,079 (27%)	624 (19%)	2,245 (24%)	357 (17%)	2,933 (31%)	651 (27%)	2,536 (29%)	576 (27%)
History of traumatic brain injury		106 (0.2%)	24 (0.2%)	3 (<0.1%)	16 (0.2%)	3 (0.1%)	29 (0.3%)	5 (0.2%)	20 (0.2%)	6 (0.3%)
Ethnicity	White	51,577 (97%)	14,765 (96%)	3,123 (96%)	9,320 (98%)	2,024 (98%)	9,276 (97%)	2,357 (96%)	8,658 (98%)	2,054 (98%)
	Non-white	1,480 (2.8%)	538 (3.5%)	136 (4.2%)	145 (1.5%)	40 (1.9%)	334 (3.5%)	94 (3.8%)	151 (1.7%)	42 (2.0%)
Days between accelerometry and cognitive testing		52 (232)	55 (234)	53 (233)	52 (232)	49 (226)	54 (232)	47 (228)	50 (231)	49 (235)

Note. Mean and standard deviation (SD) are presented for continuous variables, and count and proportion (n(%)) are presented for categorical variables for the overall sample and within strata. BMI=body mass index; SB=sedentary behaviour; LPA=light intensity physical activity; MVPA=moderate-to-vigorous intensity physical activity. A positive value for days between accelerometry and cognitive testing indicates that accelerometry measures occurred later than cognitive testing.

Supplementary File 6

Feasible limits of time-use behaviours within strata



Note. Histograms representing distribution of time-use behaviours (header) within each strata (listed on far right). Darker vertical lines within each facet represent the minimum and maximum values of the distribution. Grey vertical lines represent the truncating 0.5% percentile values at the distribution extremes (regarding ellipsoid fencing).