

# Towards the conceptualization of daily dynamics in state workaholism

## Evidence from 2 ESM studies

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*16th Conference*

*European Academy of Occupational Health Psychology*

*Granada, June 5-7 2024*

*Symposium: Dynamic Perspectives on Occupational Health Research*

# Background

Whlsm = Dysfunctional form of heavy work investment (*work addiction*):

→ **Working compulsively**

→ **working excessively**

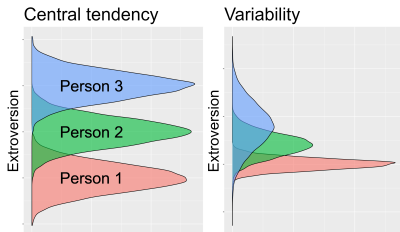


Mostly considered as a **stable trait** to be assessed with retrospective measures, e.g., Dutch Work Addiction Scale (DUWAS) (Schaufeli et al 2009)

**BUT** poorly explained by personality / linked to working conditions like overwork climate (Clark et al 2016; Mazzetti et al 2016)

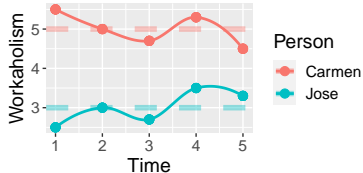
+ **Whole Trait Theory** (Fleeson, 2017)

Traits = distributions of **personality states**



**State workaholism** = Daily level of compulsive overwork compared to one's usual level ~ **Work craving episodes**

# States of work addiction?!



## Reviewer #1:

*“While I acknowledge the potential for day-to-day variations [...] I find it challenging to align them with the concept of addiction, which typically implies a prolonged temporal aspect”*

- **Personality research:** Trait levels as distributions of state levels (*baseline + variability*)
- **Clinical research:** Daily fluctuations of symptoms in clinical vs. nonclinical samples
  - OCD: *“Today I worried about germs”*
- **Behav.addiction research:** Daily fluctuations of addictive behaviors in addicts vs. nonaddicts
  - AUD: *“Drinking vs. nondrinking days”*
  - PSU: *“Today I played more and more with my smartph”*
  - GD: *“Difficult to turn down a gamble right now”*
- **Drug addiction research:** *“Psychosocial factors driving goal-directed drug seeking above [or below] already elevated **baselines**”* (Hoogarth, 2020)

# Research questions & hypotheses

- Can we talk about **‘state Whlsm’**?  
H1: Whlsm symptoms fluctuate over time
- Which are the **short-term consequences** of Whlsm?  
H2: Whlsm acts as a stressor (reactivity and prolonged activation, e.g., blood pressure, exhaustion, sleep quality)
- Which are the **proximal triggers** of Whlsm?  
H3: Internal (e.g., mood, perfectionistic concerns) & external drivers (e.g., unfinished tasks, supervisor Whlsm)

# Participants & procedures

## Study 1

1084 obs. from 135 full-time office workers

69% women, aged  $41 \pm 12.7$  years

$41.5 \pm 9.9$  weekly work hours.

Design: 2-week ambulatory assessment protocol ( $3 \times 10$ ) (see [osf.io/h9zvq](https://osf.io/h9zvq))

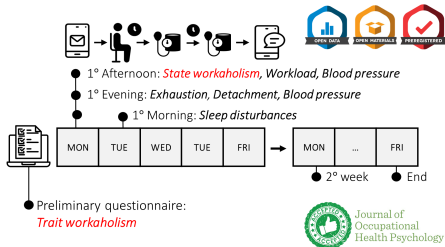
## Study 2

874 obs. from 93 young knowledge workers

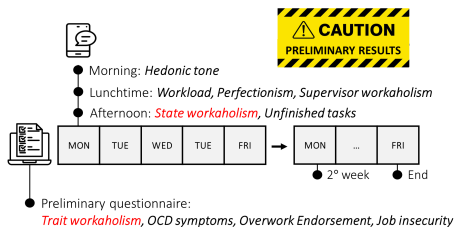
55% women, aged  $27.4 \pm 3.2$  years

$39.5 \pm 9.3$  weekly work hours.

Design: 2-week daily diary protocol ( $4 \times 10$ )



Response rate =  $81.1 \pm 19.2\%$



Response rate =  $84.4 \pm 23.1\%$

# Measures

Variable	Study	Level	Measure
State Whlsm (1-7)	1-2	State	6 items from DUWAS (Schaufeli et al 2009)
Workload (1-7)	1-2	State	3-item TDS (Menghini et al 2023)
Detachment (1-7)	1	State	3 items from REQ (Sonnentag 2007)
Exhaustion (1-7)	1	State	3 items from CBI (Kristensen et al 2005)
Sleep (1-7)	1	State	4 items from MSQ (Natale et al 2014)
Blood pressure (mmHg)	1	State	Pic Solution SmartRAPID (Pikdare, Italy)
Hedonic tone (1-7)	2	State	3-item MDMQ (Menghini et al 2023)
Perf. concerns (1-7)	2	State	3 items from SAPS (Rice et al 2014)
Unf. tasks <i>i</i> - 1 (1-7)	2	State	4 items from UTS (Syrek et al 2017)
Supervisor overwork (1-7)	1-2	State	3 items from DUWAS (Schaufeli et al 2009)
Trait Whlsm (1-4)	2	Trait	10-item DUWAS (Schaufeli et al 2009)
OCD symptoms (0-4)	2	Trait	6 items from OCI (Foa et al 2002)
Overwork climate (1-5)	2	Trait	7 items from OCS (Mazzetti et al 2014)
Job insecurity (1-5)	2	Trait	4 items from De Witte (2000)

# Data analysis

- Multilevel confirmatory factor analysis (MCFA) <sub>1</sub>  
→ Configural cluster construct requiring equivalent factor loadings across levels = **cross-level isomorphism**  
(Kim et al 2016; Stapleton et al 2016; Jack & Jorgensen 2017)
- ICC & Level-specific reliability (McDonalds'  $\omega$ )  
(Geldhof et al 2014)
- Correlation analysis  
→ Homology across levels  
(Chen et al. 2005)
- Multilevel regression  
→ Level-specific consequences and antecedents

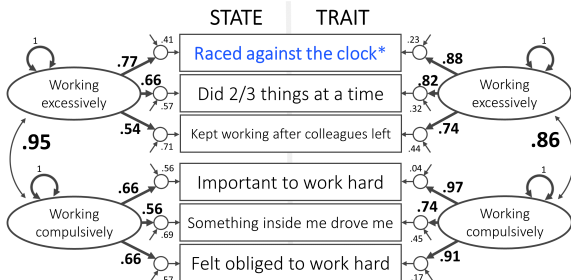
# MCFA S1: Partial cross-level isomorphism?

	RMSEA	CFI	SRMR <sub>w</sub>	SRMR <sub>b</sub>	BIC <sub>w</sub>
1F conf	.063	.962	.029	.053	0
1F metr	.062	.953	.031	.064	0
2F conf	.054	.975	.027	.042	0
2F metr	.055	.967	.029	.074	.33
2F metr.part	<b>.053</b>	<b>.971</b>	<b>.028</b>	<b>.055</b>	<b>.66</b>

$N_W = 914$ ,  $N_B = 135$

Best fit for 2-factor model  
with **partial metric**  
**invariance** (not for item \*)

Overlapping with workload?  
Doesn't seem so.



	WE	WC	Total
ICC	.69	.65	.61
$\omega_B$	.83	.93	.94
$\omega_W$	.66	.7	.81



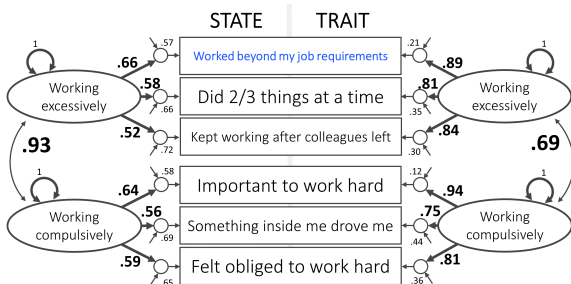
# MCFA S2: Full cross-level isomorphism

	RMSEA	CFI	SRMR <sub>w</sub>	SRMR <sub>b</sub>	BIC <sub>w</sub>
1F conf	.07	.934	.033	.091	0
1F metr	.059	.941	.034	.094	0
2F conf	.04	.981	.031	.05	0
2F metr	<b>.035</b>	<b>.981</b>	<b>.034</b>	<b>.044</b>	<b>.87</b>
2F metr.part	.035	.983	.033	.043	.13

$N_W = 620, N_B = 93$

Replaced item #1 with an  
item from MWS-behavioral  
(Clark et al 2020)

Best fit for 2-factor model  
with metric invariance



	WE	WC	Total
ICC	.56	.65	.54
$\omega_b$	.87	.89	.93
$\omega_w$	.6	.63	.76

# Pearson correlations S1

Person-mean-centered diary measure (state),  $N = 747$

	0.7	0.22	-0.08	0.12	0.11	0.04
Workaholism Retrospective	Workload	Emotional exhaustion	Psychological detachment	Sleep disturbances	Systolic BP Afternoon	Systolic BP Evening

Person-mean aggregates of diary measure (trait),  $N = 135$

0.69	0.81	0.57	-0.21	0.4	0.09	0.03
Workaholism Retrospective	Workload	Emotional exhaustion	Psychological detachment	Sleep disturbances	Systolic BP Afternoon	Systolic BP Evening

Retrospective DUWAS measure (“gold standard”, trait),  $N = 135$

0.69	0.51	0.35	-0.38	0.25	-0.02	-0.04
Mean of state workaholism	Workload	Emotional exhaustion	Psychological detachment	Sleep disturbances	Systolic BP Afternoon	Systolic BP Evening

- 😊 Similar (proportional?) correlations across levels → **homology**
- 😊 Consistency with the retrospective DUWAS → **convergent validity**
- 😞 Strong correlations with workload → **lack of discriminant validity?**

# Pearson correlations S2

Person-mean-centered diary measure (state),  $N = 316$

	0.42	-0.05	0.09	0.16	0			
Workaholism Retrospective	Workload	Morning mood	Perfect. concerns	Supervisor overworkm	Unfinished tasks i - 1	OCD symptoms	Overwork endorsement	Job insecurity

Person-mean aggregates of diary measure (trait),  $N = 93$

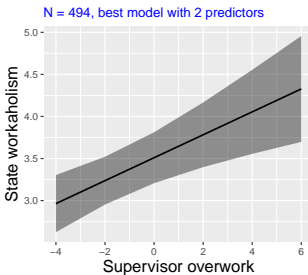
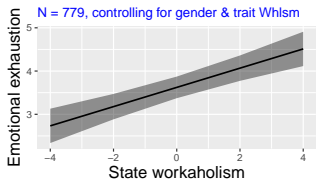
0.41	0.6	-0.13	0.26	0.34	0.24	0.07	0.25	0.11
Workaholism Retrospective	Workload	Morning mood	Perfect. concerns	Supervisor overwork	Unfinished tasks	OCD symptoms	Overwork endorsement	Job insecurity

Retrospective DUWAS measure (“gold standard”, trait),  $N = 93$

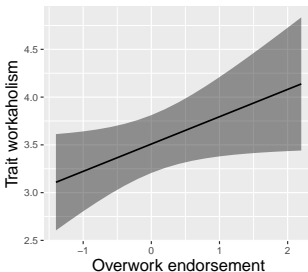
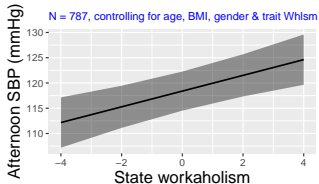
0.41	0.19	-0.29	0.33	0.05	0.29	0.34	0.34	0.16
Mean of state workaholism	Workload	Morning mood	Perfect. concerns	Supervisor overwork	Unfinished tasks	OCD symptoms	Overwork endorsement	Job insecurity

- 😊 Similar (proportional?) correlations across levels
- 😊 Moderate consistency with the retrospective DUWAS except for **supervisor overwork**
- 😊 **Moderate correlations with workload**

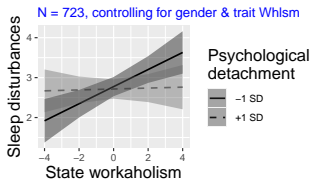
# Multilevel modeling: Consequences & antecedents



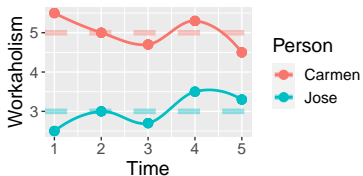
e.g., “This morning my supervisor stayed busy and kept many irons in the fire”



e.g., “Management encourages overtime work”



# Towards the conceptualization of daily dynamics in state workaholism



- Cross-level invariance
- Cross-level homology
- Reactivity & prolonged activation
- Management & supervision

- Can we talk about 'state Whlsm'?

H1: Substantial & meaningful **fluctuations** around baselines

- Which are the short-term consequences of Whlsm?

H2: Pathogenetically similar to job demands (**allostatic load**)

- Which are the proximal triggers of Whlsm?

H3: Distal & proximal **social triggers**

## Implications



### On the practical side

- Whlsm contributes to the **costs** of work stress (*overwork disorders*)
- Primary prevention: **managerial training**
- Secondary prevention: **psychological detachment**



### On the theoretical side

- *How quickly do these fluctuations occur? How large are them? How quickly do employees return to their baseline level?* (thx Reviewer #1)
- Whlsm vs. workload (and anticipated workload)

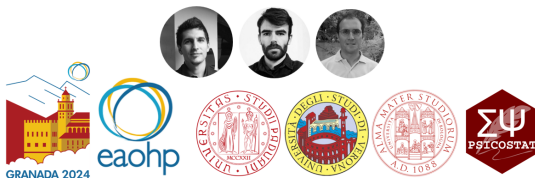
# Thank you!

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R code available from <https://luca-menghini.github.io/presentations>

## State workaholism scale

Italian	English	Dim
1. Mi è sembrato di essere di fretta e in corsa contro il tempo (S1) / Oggi ho lavorato più di quanto richiesto dal mio lavoro (S2)	1. I have seemed to be in in a hurry and racing against the clock (S1) / Today I worked beyond my job requirements (S2)	WE
2. È stato importante per me continuare a lavorare intensamente, anche quando ho dovuto fare cose che non mi piacevano	2. It was important to me to work hard even when I wasn't enjoying what I was doing	WC
3. Mi sono ritrovata a fare 2/3 cose contemporaneamente (es. consumare il pranzo, scrivere un promemoria e stare al telefono)	3. I have found myself doing two or three things at one time such as eating lunch and writing a memo, while taking on the telephone	WE
4. Ho sentito qualcosa dentro di me che mi spingeva a lavorare intensamente	4. I have felt something inside me that has driven me to work hard	WC
5. Ho continuato a lavorare dopo che i miei colleghi avevano smesso	5. I have found myselfcontinuing to work after my co-workers had called it quits	WE
6. Mi sono sentita obbligata a lavorare intensamente, anche se non era piacevole	6. I have felt obliged to work hard, even when it was not enjoyable	



# MCFA Whlsm vs. External job demands

Study 1

	RMSEA	CFI	SRMR <sub>w</sub>	SRMR <sub>b</sub>	BIC <sub>w</sub>
1F (WC/WE/WL)	.093	.901	.057	.08	0
2F (WC + WE/WL)	.081	.928	.054	.074	0
3F (WC + WE + WL)	<b>.059</b>	<b>.967</b>	<b>.033</b>	<b>.066</b>	<b>1</b>

Study 2

	RMSEA	CFI	SRMR <sub>w</sub>	SRMR <sub>b</sub>	BIC <sub>w</sub>
1F (WC/WE/WL)	.122	.764	.128	.12	0
2F (WC + WE/WL)	.105	.831	.125	.093	0
3F (WC + WE + WL)	<b>.057</b>	<b>.957</b>	<b>.048</b>	<b>.058</b>	<b>1</b>

WC = working compulsively, WE = working excessively, WL = workload items