# Supplementary material to

# HUMAN-BASED DYNAMICS OF MENTAL WORKLOAD IN COMPLICATED SYSTEMS

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| Reference                        | Reference<br>type                        | Study<br>design   | Method of data collection  | Instru-<br>ment                                    | Field   | Set-<br>ting                              | Analytical<br>method  | Variables and key results  | Qual-<br>ity rat-<br>ing |
|----------------------------------|--|---|--|--|---|---|---|--|--------------------------|
| Luque-<br>Casado et<br>al., 2016 | Biological<br>Psychology                 | Experi-<br>ment:<br>measure<br>develop-<br>ment   | Twenty-four<br>males under-<br>graduate stu-<br>dents  | Heart rate<br>variability<br>(HRV) and<br>NASA-TLX | Execution condi-<br>tion including the<br>psychomotor vig-<br>ilance task, a<br>working memory<br>task and a dura-<br>tion discrimina-<br>tion task | Com-<br>puter-<br>ized<br>simu-<br>lation | ANOVA and correlation   | HRV varied as a func-<br>tion of task demands.<br>A significant decre-<br>ment in HRV as a<br>function of time-on-<br>task. The NASA-TLX<br>varied as a function of<br>cognitive workload. | Good                     |
| Fallahi et<br>al., 2016          | Applied<br>Ergonomics                    | Experi-<br>ment and<br>a cross-<br>sectional<br>study: oc-<br>cupa-<br>tional<br>health | Physiological<br>signals (ECG,<br>EMG) were rec-<br>orded and the<br>NASA-Task<br>Load Index<br>(TLX) was ad-<br>ministered for<br>16 operators. | NASA-<br>TLX, ECG<br>and EMG                       | Traffic density<br>monitoring   | Real                                      | ANOVA,<br>Bonferroni<br>multiple<br>comparison,<br>Greenhouse-<br>Geisser cor-<br>rection | The findings indicated<br>that increasing traffic<br>congestion had a sig-<br>nificant effect on HR,<br>RMSSD, SDNN,<br>LF/HF ratio, and EMG<br>amplitude.                                 | Good                     |
| Charbonnier<br>et al., 2016      | Expert Sys-<br>tems with<br>Applications | Experi-<br>ment:<br>measure<br>develop-<br>ment   | 15 subjects per-<br>formed a tedi-<br>ous but mentally<br>demanding task<br>on a computer<br>during 90 min.                                      | Karolinska<br>Sleepiness<br>Scale and<br>EEG, EOG  | Memory tasks  | Com-<br>puter-<br>ized<br>simu-<br>lation | Signal analy-<br>sis: time–fre-<br>quency anal-<br>ysis                                   | The index based on<br>the alpha band is well<br>correlated with an ocu-<br>lar index that<br>measures external<br>signs of mental fatigue<br>over long periods of<br>time.                 | Good                     |

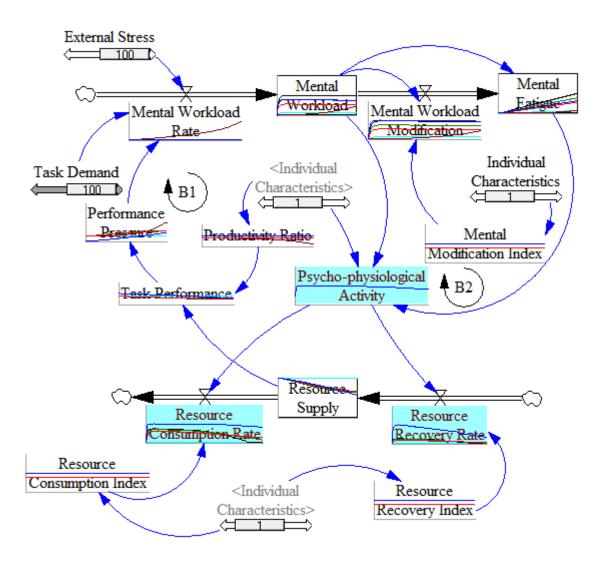
### Supplementary Table 1: A sample table of characteristics of included studies

| Factor                      | Sub-factor (evidence)                              | Number of citations |
|-----------------------------|--|---------------------|
| Task demand and job         | Task complexity                                    | 15                  |
| characteristics             | Task difficulty                                    | 9                   |
|                             | Time constraint                                    | 7                   |
|                             | Speed  | 2                   |
|                             | Shift work   | 2                   |
|                             | Multitasking                                       | 1                   |
|                             | New technology                                     | 1                   |
| External and environmental  | Heat stress  | 6                   |
| stress                      | Noise  | 4                   |
|                             | Air quality  | 1                   |
|                             | Lighting   | 1                   |
|                             | Hygienic conditions                                | 1                   |
| Individual capabilities and | Mental and subjective capacity                     | 196                 |
| characteristics             | Autonomic sympathetic and parasympathetic response | 156                 |
|                             | Cardiovascular capacity                            | 140                 |
|                             | Mental response (brain activity)                   | 127                 |
|                             | Cognitive ability and psychomotor performance      | 66                  |
|                             | Mental health, feeling and disorder                | 27                  |
|                             | Demographic characteristics                        | 6                   |

### Supplementary Table 2: The main and sub-factors (evidences) of mental workload, along with cited studies

| Supplementary Table 3: Equation of some variables with | n inputs and initial value |
|--|----------------------------|
|--|----------------------------|

| <b>Mental Workload (Level)</b> = INTEG (Mental Workload Rate-Mental Workload Modifica-   |
|--|
| tion, 0)   |
| Mental Fatigue (Level) = INTEG (Mental Workload-Mental Workload Modification, 0)   |
| <b>Resource Supply (Level)</b> = INTEG (Resource Recovery Rate-Resource Consumption Rate, 100)   |
| <b>Psycho-physiological Response (Auxiliary)</b> = WITH LOOKUP (Mental Workload*In-  |
| dividual Characteristics) ([(0,0)-(200,180)], (0,65), (27.5229, 93.1579), (110.092,  |
| 131.842), (195.719, 142.105), (199.388, 143.684))  |
| Performance Pressure (Auxiliary) = ABS (100-Task Performance)  |
| Task Performance (Auxiliary) = (Resource Supply*Productivity Ratio)  |
| Mental Workload Rate (Auxiliary) = ABS (Task Demand*2*((External Stress + Perfor-  |
| mance Pressure + Time Constraint)/300))  |
| <b>Mental Workload Modification (Auxiliary)</b> = (Mental Workload*Mental Workload<br>Modification Index)  |
| Individual Characteristics (Constant) = 1  |
| <b>Resource Recovery Rate (Auxiliary)</b> = WITH LOOKUP (Psycho-physiological Response*Resource Recovery Index) ([(0,0)-(180,1)], (65,0), (93.0275, 0.109649), (103.486, 0.153509), (108.44, 0.179825), (113.945, 0.214912), (129.908, 0.337719), (153.578, 0.872807), (160.183, 0.929825), (172.844, 0.960526), (179.45, 0.960526)) |
| <b>Resource Consumption Rate (Auxiliary)</b> = WITH LOOKUP (Psycho-physiological   |
| Response*Resource Consumption Index) ([(0,0)-(180,1)], (65,0), (75.9633, 0.254386),  |
| (89.1743, 0.508772), (112.844, 0.754386), (137.064, 0.903509), (162.385, 0.973684), (179.45, 0.986842))  |



**Supplementary Figure 1:** Vensim software runs under different conditions on various variables in the human-based archetype of mental workload

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