

9 Mars 2022

# MESURER ET DÉTECTER LES EFFETS SECONDAIRES DE LA RÉALITÉ VIRTUELLE AU TRAVAIL : INFINITY CAS APPLIQUÉ AVEC LES FORCES DE POLICE



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ama Diallo



Weifei Xie



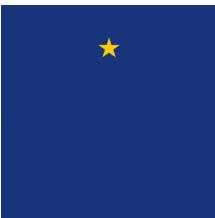
AfIA  
Association française  
pour l'Intelligence Artificielle

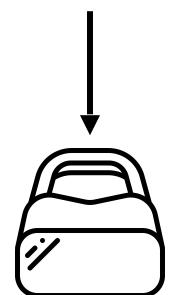


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under grant agreement No 883293



Research and Innovation Action (RIA)





- Recueillir et traiter des données provenant de diverses sources
- Création de graphiques et visualisation de données (par exemple, cartes, tracés)
- Explorer et analyser visuellement des données
- Visualisation de plusieurs médias (textes, images, vidéos)
- Saisir du texte et éditer des documents
- Conduite de réunions (briefings, présentations de données...)
- Collaborer avec d'autres utilisateurs en VR (et vues d'objets)
- Se déplacer dans l'environnement virtuel ou dans divers graphiques
- Prendre des décisions partagées pour des enquêtes en cours (réunions)



Manque de travaux expérimentaux, pas d'études sur le moyen et long terme, se concentre sur le grand public.

Anses (2021)



*Les dispositifs de RV et de RA peuvent également être une source de **risques** en raison de la distraction, de la surcharge d'informations, de la désorientation, du cybersickness et de la fatigue visuelle.*

Digitalisation and Occupational Safety and Health (2019)

# RÉALITÉ VIRTUELLE ET SYSTÈME HUMAIN



Les travailleurs des forces de police utilisant la VR s'exposent aux risques d'effets secondaires



Essayer de garantir performances tâches, la santé et la sécurité à l'usage de la VR

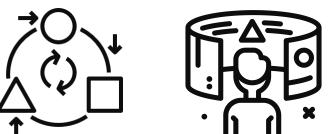
## Notre rôle en bref



Mesurer / détecter et mieux documenter effets secondaires de la réalité virtuelle



Abaïsser les effets secondaires

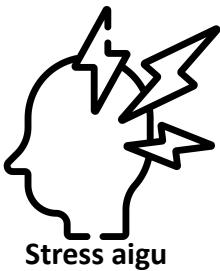
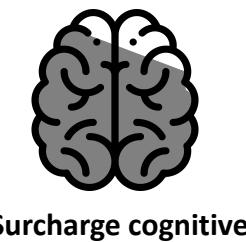


Adapter les contenus/interfaces selon état et profil utilisateur

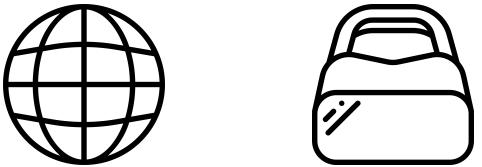
## Focus sur 5 Effets secondaires de la VR

VRISE = Virtual Reality Induced Symptoms and Effects

Cobb *et al.* (1999) ; Grassini and Laumann (2021) ; Chen *et al.* (2021)



80 % présentent des effets secondaires Stanney *et al.* (2021)



## CONFLITS SENSORI-MOTEURS (fatigue visuelle, cybersickness)



O'Regan and Noë, 2001; Fuchs, 2018; Brun *et al.*, 2018; Reason 1978; Watt, 1983 Davis *et al.*, 2014; Lawson, 2014; Rebenitsch & Owen, 2016; Nesbitt & Nalivaiko, 2018; Descheneaux *et al.*, 2020; Stanney *et al.*, 2020; Chang *et al.*, 2020

inadéquation entre la rétroaction sensorielle prévue et réelle, produisant à la fois des perturbations sensorielles et motrices



**Pas de consensus théorique sur les effets secondaires de la VR en général**

Cybersickness incline à **adaptation** ou **désensibilisation**  
aux conflits sensori-moteurs

Gavgani *et al.*, 2017; Stanney *et al.*, 2020

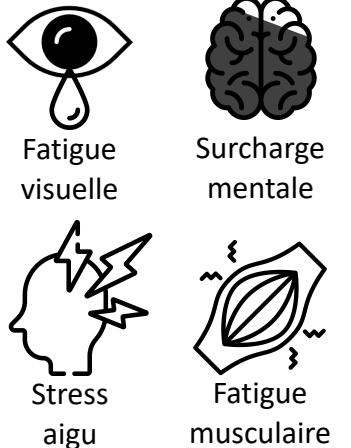
Donc  
une exposition répétée pourrait  
**réduire les symptômes** de cybersickness

Mais

cela peut impliquer une **mauvaise adaptation au monde réel**

Gallagher & Ferrè, 2018

?



## FACTEURS INFLUENÇANT LA RÉUSSITE AU TRAVAIL





**En l'état : information dispersée, floue, pas appliquée au travail**

Synthèse de la littérature sur 5 VRISE au travail

Identification facteurs influençant VRISE

Identification risques particuliers travail / analystes

Désambiguation entre VRISE

Identification de liens entre états

Agenda de recherche

# FACTEURS INFLUENÇANT LA VRISE AU TRAVAIL



## 50 facteurs influençant le cybersickness d'après

Rebenitsch and Owen, 2021

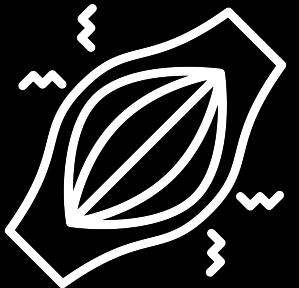
<b>Demographics</b>	<b>Hardware</b>	<b>Software</b>
<b>Experience</b>	<b>screen</b>	<b>Movement</b>
Experience with real-world task	Resolution/Blur	Rate of linear rotational acceleration
Experiences with simulator (habituation)	Horizontal and vertical field of view	Self-movement speed and rotation
Video game play	Weight of the display	Vection
Duration	Display type	Altitude above terrain
	Lag variance	Degree of control
<b>Physical attributes</b>	<b>Tracking</b>	<b>Appearance</b>
Eye dominance	Method of movement	Screen luminance
Stereoscopic visual ability	Calibration	Color
Postural stability	Position tracking error	Contrast
History of headaches/migraines	Tracking method	Scene content or scene complexity
BMI	Head movements	Global visual flow
		Orientation cues
<b>Demographics</b>	<b>Rendering</b>	<b>Stabilizing information</b>
Age	Stereoscopic rendering	Focus areas
Gender	Inter-pupillary distance	Ratio of virtual to real world
Ethnicity	Screen distance to the eye	Independent visual backgrounds
Vision correction	Update rate	Siting versus standing
History of motion sickness		
<b>Mental attributes</b>	<b>Non-visual feedback</b>	
Concentration level	Type of haptic feedback	
Mental rotation ability	Ambient temperature	
Perceptual style	Olfactory feedback	
	Audio feedback	

# FACTEURS INFLUENÇANT LA FATIGUE VISUELLE EN VR

14 facteurs influençant la fatigue visuelle en VR selon nos ajouts à Bando *et al.* 2012

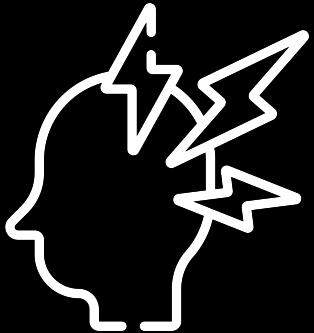


Demographics	Hardware	Software
Age Stereoscopic visual ability (stereo-blindness)	Vergence-accommodation conflict Optical misalignment (between HMD lenses and eyes) Geometrical distortion Luminance Blue light	Duration of display use Binocular disparity (possible and comfortable fusion) Motion parallax Texture gradients Occlusion Blur Colors



## 15 facteurs influençant la fatigue musculaire en VR

Demographic	Hardware	Software
Age Body mass index	HMD Weight Belts (attaching HMD to head) Interaction devices Position tracking error HMD Resolution	Duration of immersion Object angle location Gesture amplitude Tasks repetition Head rotations required General posture and body rotation Sitting or standing Body parts representation and feedback (avatar)



## 16 facteurs influençant la fatigue musculaire en VR au travail

Demographics	Hardware	Software
Age	Techno-stress	Techno-overload
Gender	Apparatus malfunctions	Noise
Experience with a real-world task		Public speaking
Experiences with a simulator (habituation)		Task difficulty
History of headaches/migraines		Time pressure
Body mass index		Exposure to distressing material
Personality traits		
Anxiety and stress prior to VR use		

# FACTEURS INFLUENÇANT VRISE AU TRAVAIL



Locomotion + durée immersion



Affichage de stéréoscopie + durée immersion



Difficulté tâche en VR + Pression temporelle



Techno-stress, bruits, type médias, tâches et prise de parole

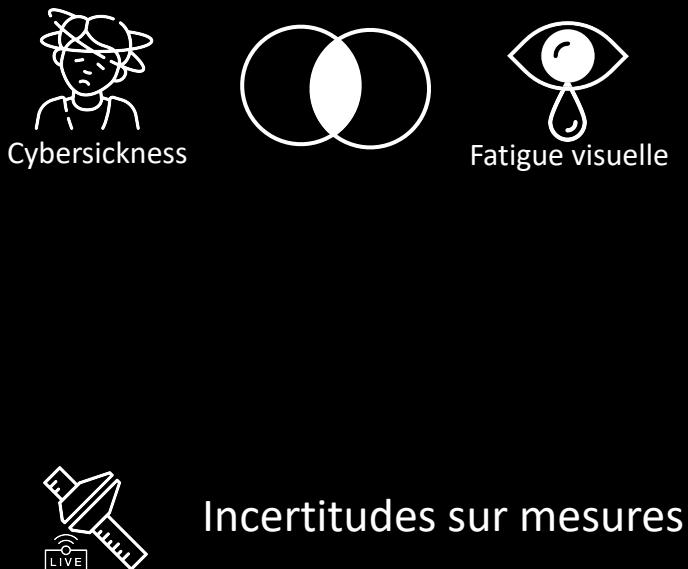


Poids du casque, gestes pour interaction

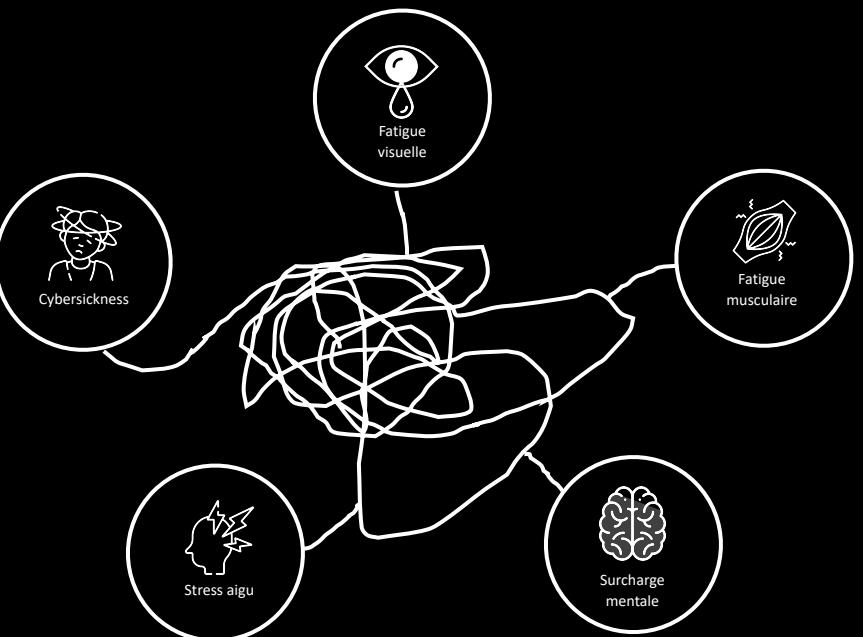
**GUIDELINES**

# FACTEURS INFLUENÇANT VRISE AU TRAVAIL

Intersection mais différents



Complexes, entrelacés



## Publications en cours

[Q1 Human Computer Interaction](#)

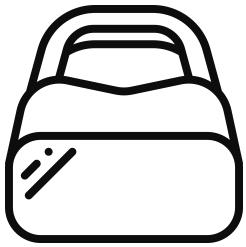
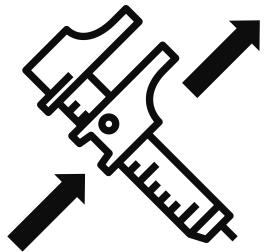


Five year impact factor  
5.521 (2020)

Souchet, A., Lourdeaux, D., Pagani, A., Rebenitsch, L. (**Soumis**). *A narrative review of immersive virtual reality's ergonomics and risks at the workplace: Cybersickness, Visual fatigue, Muscular fatigue, Acute stress, and Mental overload.* [Virtual Reality](#).

Souchet, A., Lourdeaux D., Burkhardt J.M., Hancock P. A. (**Soumis**). *Design guidelines for limiting and eliminating Virtual Reality Induced Symptoms and Effects (VRISE) at Work: A comprehensive, factor-oriented assessment.* [Virtual Reality](#).

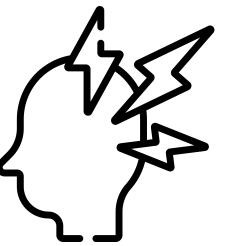
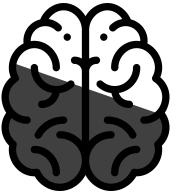
## DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING



**Mesurer / détecter et mieux documenter effets secondaires de la réalité virtuelle**

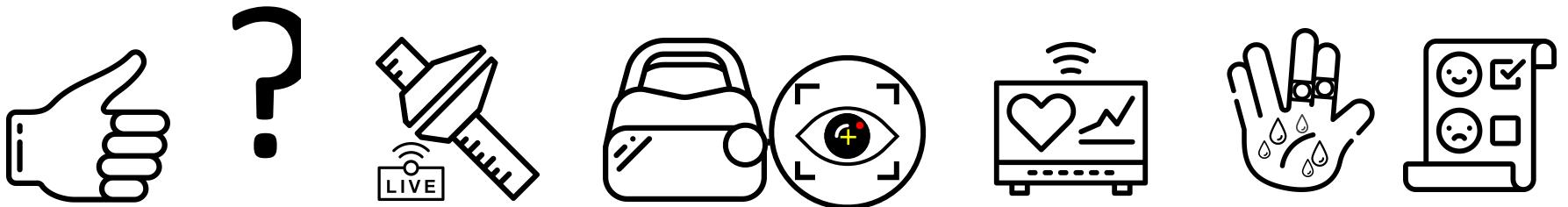
# DÉTECTOR LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

Mesurer live fatigue visuelle, charge mentale et stress



# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

Déetecter et Différencier Etats avec eye tracking, ECG, EDA



# DÉTECTOR LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

yellow blue green blue  
yellow red blue red  
green red yellow yellow  
blue yellow yellow green  
blue green green red  
blue red blue yellow

Pourquoi Stroop ?

Fonctions exécutives (cognition)

Attention sélective / Inhibition

Simplification expérimentale de conditions écologiques

Interactions Homme-Machine pour induire  
charge mentale, stress et fatigue visuelle en VR

4 conditions : control, dual task, stressfull, stereoscopy

# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

Stimuli Stoop, à vous de jouer !



# DÉTECTOR LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

25 congruent words + 25 incongruent words | Subjects answer orally

Conditions coexpérimentales



1 Control

Stroop task

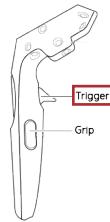
yellow	blue	green	blue
yellow	red	blue	red
green	red	yellow	yellow
blue	yellow	yellow	green
blue	green	green	red
blue	red	blue	yellow

2 Dual task

yellow	blue	green	blue
yellow	red	blue	red
green	red	yellow	yellow
blue	yellow	yellow	green
blue	green	green	red
blue	red	blue	yellow

+ 25 times randomly  
IF Red

THEN



3 Stressfull

yellow	blue	green	blue
yellow	red	blue	red
green	red	yellow	yellow
blue	yellow	yellow	green
blue	green	green	red
blue	red	blue	yellow

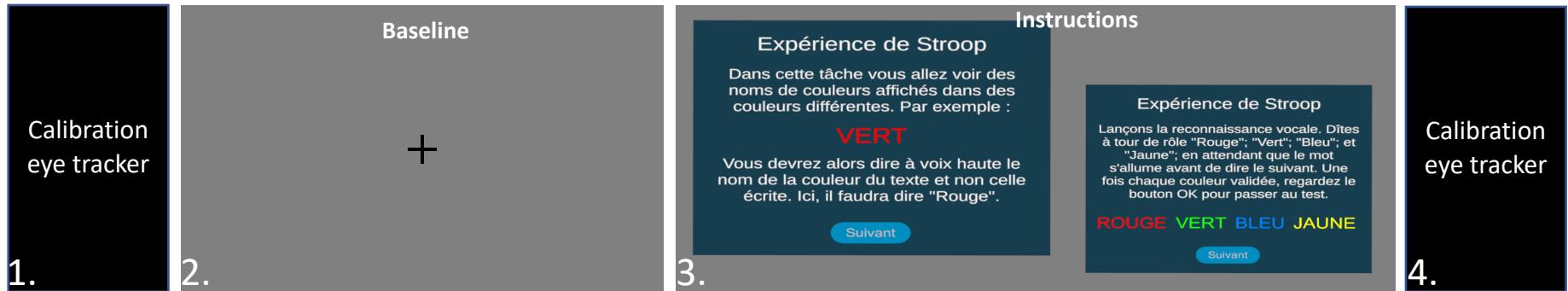
+ Alarm   
25 times randomly in time  
+ random duration  
< 80 dB

4 Stereoscopy

yellow	blue	grey	yellow	blue	green	blue	green	blue	
yellow	red	blue	yellow	red	blue	blue	red	blue	red
green	red	yellow	green	red	yellow	yellow	yellow	yellow	yellow
blue	yellow	yellow	blue	yellow	yellow	green	yellow	yellow	green
blue	green	green	blue	green	green	red	green	green	red
blue	red	blue	blue	yellow	blue	blue	yellow	blue	yellow

# DÉTECTOR LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

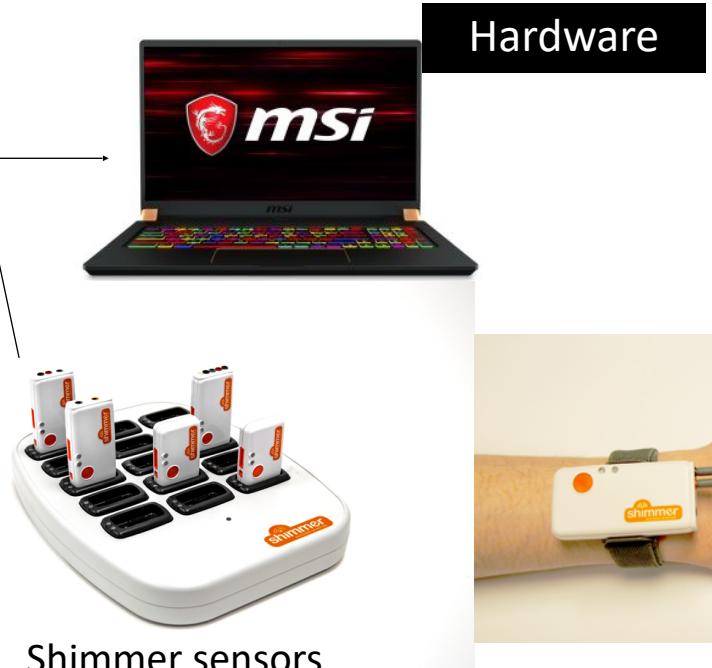
Text to Speech & interaction contrôleur + voix



# DÉTECTOR LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING



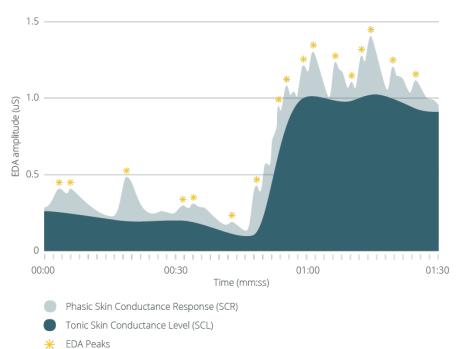
HTC Vive Pro Eye (tracker)



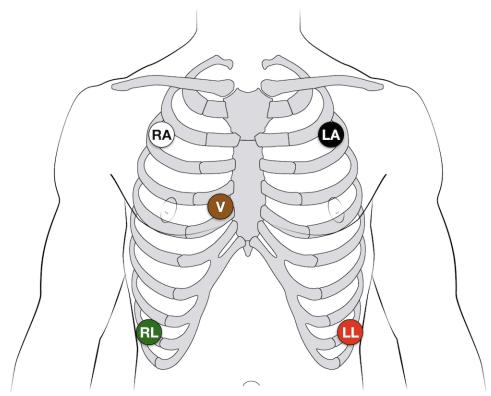
Hardware



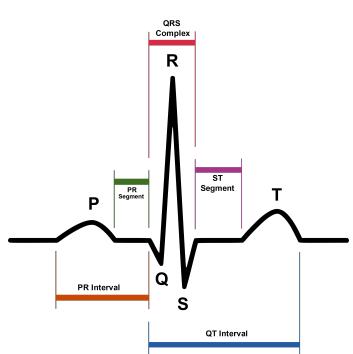
EDA



TimeStamp OS

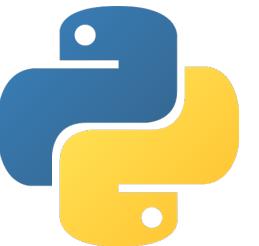
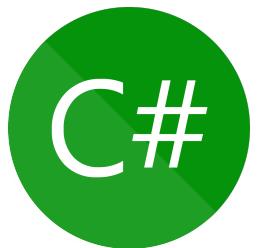


ECG

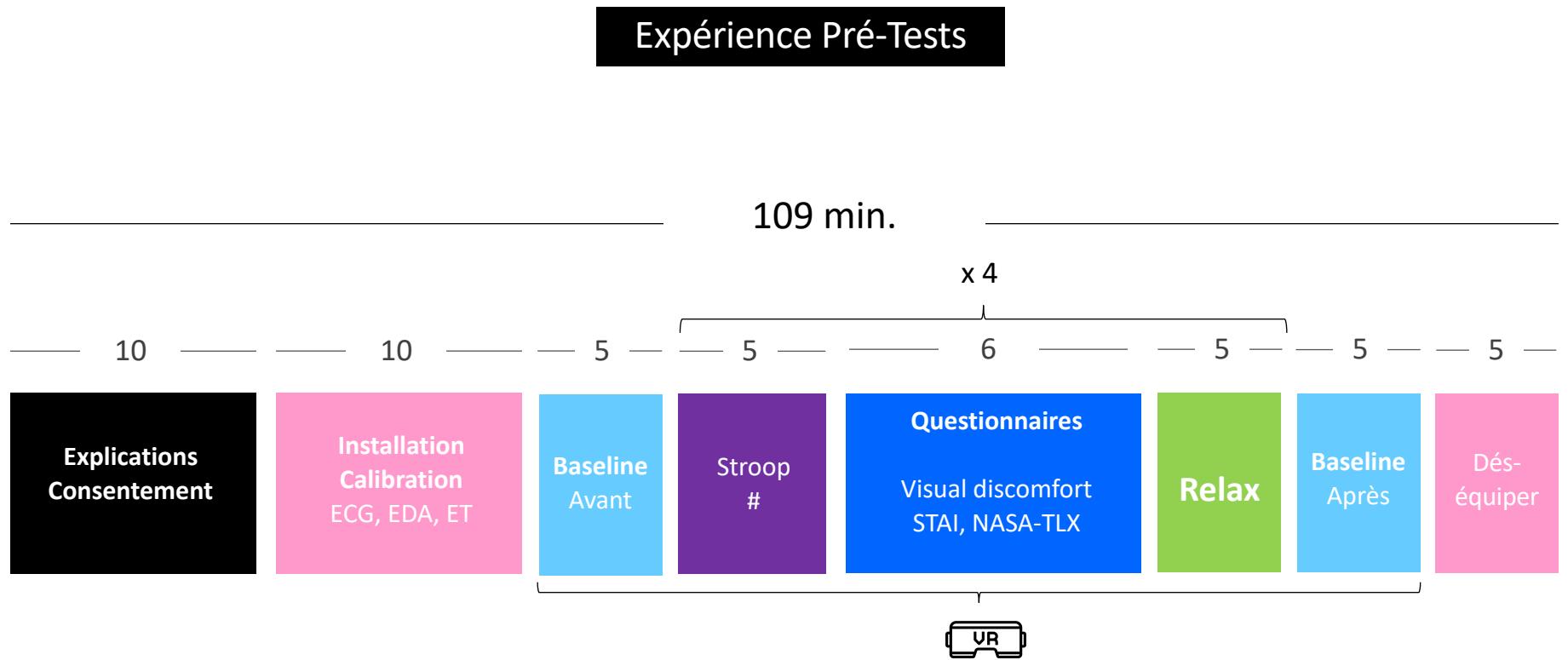


# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

## Software



# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING



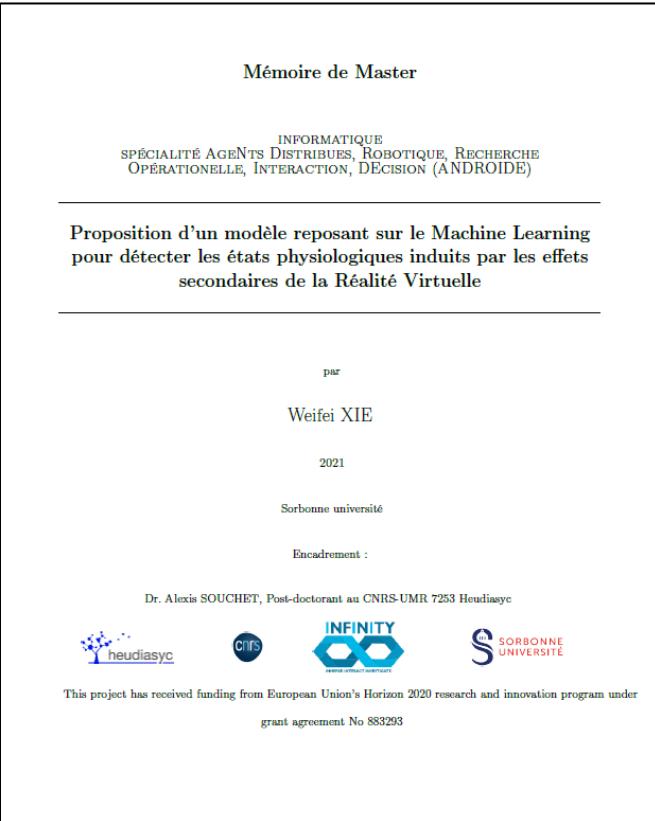
# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING



**Weifei XIE**

Master ANDROIDE de Paris 6

Développement Pipe traitement  
data + Pré-tests



Soutenance 04/10/2021

# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

## Participants

6

SUJETS

entre 22 et 31 ans

M= 24.16 ± 4.12

1 femme

5 hommes

Tous connaissaient l'environnement virtuel

## Traitement signaux physiologiques

Etape	ECG	EDA	Eye tracking
Filtrage signaux	Filtre passe-bas de 50 Hz. DWT (discrete wavelet transform) sera appliquée pour reproduire la procédure de <a href="#">Maldonado et al. (2020)</a> Bibliothèques et algorithmes : neurokit, pyphisi de <a href="#">Bizzego et al. (2019)</a>	Filtre passe-bas basé sur <a href="#">Liu and Du (2018)</a> de 1 Hz. Algorithme de déconvolution pour diviser le signal en deux parties tonique (basse fréquence) et phasique (haute fréquence)	Classification IVT (Velocity-Threshold Identification fixation classification) comble les données manquantes et écarte les mouvements impossibles. Classement en trois types de mouvements (saccade, fixation, clignement) avec l'algorithme de <a href="#">Lin et al. (2019)</a>
Extraction des features		<b>neurokit2</b>	
Normalisation		Z-score and min max normalization	<a href="#">Makowski et al. (2021)</a>
Sélection des features		k-cross-validation et tests statistiques ANOVA, MANCOVA	

<https://github.com/neuropsychology/NeuroKit>

## Hypothèses de travail

**H1** Les informations physiologiques permettent de prédire les effets secondaires de VR

**H2** Les informations physiologiques permettent de distinguer charge mentale et stress

**H3** Les informations physiologiques permettent de distinguer cybersickness et stress

**H4** Les informations physiologiques permettent de distinguer cybersickness et charge mentale

**H5** Différentes variations des features des signaux physiologiques (Eye tracker, ECG, EDA) permettent de détecter les effets secondaires de la VR

**H6** La technique SVM permet d'atteindre le meilleur niveau de détection des effets secondaires de la VR comparés à d'autres

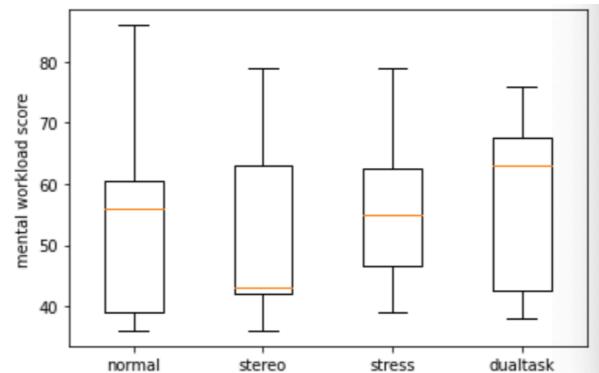
## Résultats Pré-Tests    Etapes

- 1) Division binaire des scores de questionnaires
- 2) Normalisation avec toutes les features physiologiques et les techniques de machine learning pour réaliser une pré-sélection des meilleures techniques ML
- 3) Sélection des features en testant chaque technique ML et leur combinaison
- 4) Réduction du nombre de features nécessaires pour réaliser la détection et son efficacité

# DÉTECTER LES EFFETS SECONDAIRES AVEC CAPTEURS PHYSIOLOGIQUES ET MACHINE LEARNING

## Résultats Pré-Tests Questionnaires

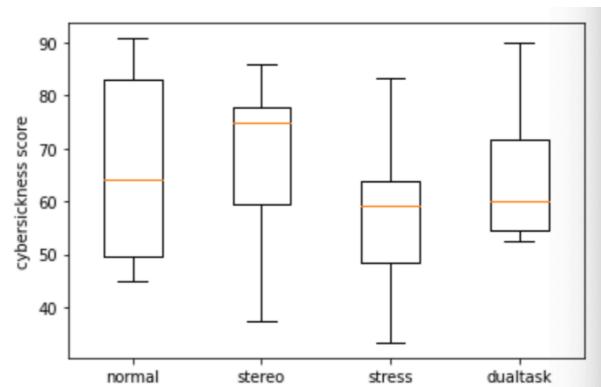
**Scores Nasa-TLX Charge mentale**



### Chi square test

Dual task ≠ Control  $p = 0.002$   
Dual task ≠ Stressful  $p = 6.5 \cdot 10^{-6}$   
Dual task ≠ Stereo  $p = 0.001$

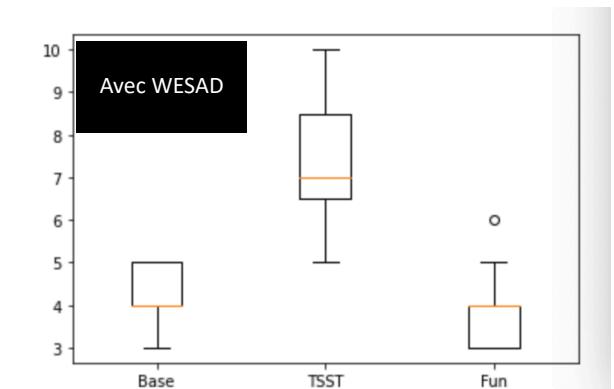
**Scores VRSQ – Cybersickness (fatigue visuelle)**



### Chi square test

Stereo ≠ Control  $p = 6.9 \cdot 10^{-5}$   
Stereo ≠ Stressful  $p = 0.003$   
Stereo ≠ Dual task  $p = 0.0002$

**Scores STAI-6 3 items – Stress**



### ANOVA

TSST ≠ Fun  $p = 4 \cdot 10^{-9}$   
TSST ≠ Base  $p = 7.8 \cdot 10^{-9}$

Résultats Pré-Tests

Division binaire des scores questionnaires

Division binaire scores charge mentale

Dell'Agnola et al. (2020)

Nous avons également appliqué à Fatigue visuelle

### Charge mentale

Faible < score Nasa-TLX 66 > Elevée

### Charge mentale

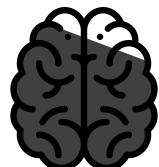
Faible < score VRSQ 76 > Elevée

### Stress (WESAD)

Phillips-Wren and Adya (2020)

Somme des 3 items STAI-6\_2 Je suis tendu(e), STAI-6\_3 Je me sens bouleversé(e),  
STAI-6\_6 Je suis inquiet(e)

Différence significative entre conditions stressée versus non stressée



Surcharge mentale

- 0. écart type du gaze point X (horizontal)
- 1. durée moyenne des saccades guidées visuellement
- 2. amplitude de la réponse de skin conductance
- 3. puissance spectrale de 0.045-025HZ du signal EDA
- 4. la densité de puissance spectrale de la bande haute fréquence, 0,15 à 0,4 Hz de l'ECG toutes les 30 secondes (écart type)
- 5. la moyenne de la durée RR (heart-beat)
- 6. l'écart type de la durée RR
- 7. la médiane de la durée RR

## Features pour détecter



Fatigue visuelle

- 0. la moyenne de la taille de la pupille droite
- 1. la moyenne de la taille des deux pupilles
- 2. la moyen de la distance interpupillaire
- 3. le minimum de la distance interpupillaire
- 4. la distance interpupillaire minimale toutes les 30s (écart type)
- 5. la moyenne du temps de montée de la réponse de skin conductance chaque 30s (écart type)
- 6. l'écart type de la phase phasique (EDA)
- 7. le nombre de réponse de la skin conductance (EDA)
- 8. l'indice triangulaire HRV toutes les 30s (écart type)
- 9. nombre de beat par minute



Stress aigu

- 0. nombre de réponse total dans SCR
- 1. durée RR (moyen)
- 2. pNN20
- 3. pNN50

## Résultats Pré-Tests

ML + Normalisation + Sélection features

### Meilleures performances pour détecter



Surcharge mentale

#### **Support Vector Machine – Linear (SVM-L)**

**+ Normalisation Z-score + Features selection ANOVA**

Accuracy 93 %

Precision 95 %

Recall 91 %



Fatigue visuelle

#### **Quadratic discriminant analysis (QDA)**

**+ Normalisation min-max + Feature selection Random Forest**

Accuracy 91%

Precision 94%

Recall 91%



Stress aigu

#### **Support Vector Machine – Linear (SVM-L)**

**+ Feature selection Pearson, normalisation pas meilleure performance**

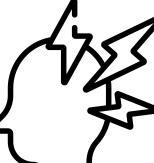
Accuracy 90 %

Precision 92 %

Recall 85 %

Avec WESAD

## Discussion

Effet secondaire	Nos résultats comparés aux précédents travaux
 Surcharge mentale	<p>Ding <i>et al.</i> (2020) ont de meilleures performances : accuracy 94.6 %</p> <p>Li <i>et al.</i> (2020) ont de moins bonnes performances : accuracy 85 %</p> <p>SVM aussi la meilleure technique ML pour détection</p>
 Fatigue visuelle	<p>Islam <i>et al.</i> (2020) ; Porcino <i>et al.</i> (2020) utilisent modèles non interprétables</p> <p>Dennison <i>et al.</i> (2016) ont de moins bonnes performances (accuracy 77.8 en moyenne avec les différentes techniques ML)</p>
 Stress aigu	<p>Phillips-Wren and Adya (2020) difficile de comparer : utilisent fenêtres de 5 sec.</p> <p>Garcia-Agundez <i>et al.</i> (2019) ; Dell'Agnola <i>et al.</i> (2020) 3 classes de stress</p> <p>Classification plus fine que la binaire pour notre expérience</p>

## Résultats Pré-Tests

## Hypothèses de travail

**H1** Les informations physiologiques permettent de prédire les effets secondaires de VR

**Soutenue**

**H2** Les informations physiologiques permettent de distinguer charge mentale et stress

**Non Soutenue**

**H3** Les informations physiologiques permettent de distinguer cybersickness et stress

**Non Soutenue**

**H4** Les informations physiologiques permettent de distinguer cybersickness et charge mentale

**Non Soutenue**

Mais features pour détecter différentes  
(pas testé dans pré-tests)

**Plus des données pour valider cette hypothèse sont nécessaires**

**Partiellement soutenue**

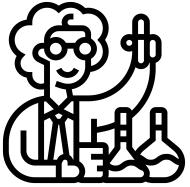
**Soutenue**

que SVM permet d'atteindre le meilleur niveau de détection des effets secondaires de la VR

**Non Soutenue**

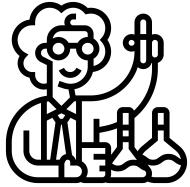
secondaires de la VR comparés à d'autres  
**Fatigue visuelle QDA meilleur**

1

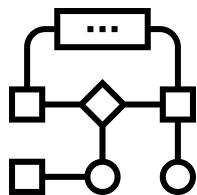


125 sujets  
inter-sujet

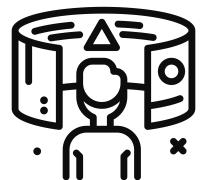
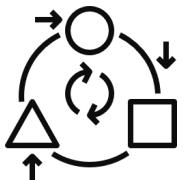
2



30 sujets  
intra-sujet



Création du modèle de détection  
sur ces données (machine learning)



Adapter dynamiquement les contenus / interfaces  
selon état et profil utilisateur  
IA prise de décision, fonctions de croyance

**Environnements virtuels : adaptation du système à l'humain ou de l'humain au système ?**

“*human first, technology second*”

Stone, 2016



M E R C I



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**AfIA**  
Association française  
pour l'Intelligence Artificielle

**GDR** Groupement de recherche  
IG-RV Informatique Géométrique  
et Graphique, Réalités Virtuelles  
et Visualisation

**INFINITY**  
[infinity.sorbonne-univ.fr](http://infinity.sorbonne-univ.fr)

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**Lama Diallo**



**Weifei Xie**

## BIBLIOGRAPHIE

- Abassi, A., Motamedzade, M., Aliaabadi, M., Golimohammadi, R., & Tapak, L. (2020). Combined effects of noise and air temperature on human neurophysiological responses in a simulated indoor environment. *Applied Ergonomics*, 88, 103189. <https://doi.org/10.1016/j.apergo.2020.103189>

Alais, D., & Burton, J. (2019). Cue Combination Within a Bayesian Framework. In A. K. C. Lee, M. T. Wallace, A. E. Coffin, & R. F. Ray (Eds.), *Multisensory Processes : The Auditory Perspective* (p. 9–31). Springer International Publishing. [https://doi.org/10.1007/978-3-030-10465-0\\_2](https://doi.org/10.1007/978-3-030-10465-0_2)

Anses, (2021). *ANSES alertes/s/objets saufantables potentiels liés à l'exposition aux technologies utilisant la réalité augmentée et la réalité virtuelle (avis de l'Anses, Rapports d'expertise collective N° 2017-5A-0076)*. Agence nationale de sécurité sanitaire de l'alimentation, de l'environnement et du travail. <https://www.anses.fr/suivi-podcasts/14888>

Amaldi, B., Cetin, S., Couture, N., Dautin, J.-L., Gouranton, G., & Lourdeau, D. (2018). New Applications. Dans B. Amaldi, P. Gutton, & G. Moreau, *Virtual Reality and Augmented Reality: Myths and Realities*. (S.l.) : Wiley-ISTE.

Baker, R., Coonen, P., Howe, E., Williamson, A., & Straker, L. (2018). The Short Term Musculoskeletal and Cognitive Effects of Prolonged Sitting During Office Computer Work. *International Journal of Environmental Research and Public Health*, 15(8), 1678. <https://doi.org/10.3390/ijerph15081678>

Ballouren, J. N., Yee, N., Blascovich, J., Beall, A. C., Lundberg, N., & Jin, M. (2008). The Use of Immersive Virtual Reality in the Learning Sciences: Digital Transformations of Teachers, Students, and Social Context. *Journal of the Learning Sciences*, 17(1), 102–141. doi:10.1080/10508040701793141

Bando, T., Iijima, A., & Yano, S. (2012). Visual fatigue caused by stereoscopic images and the search for the requirement to prevent them: A review. *Displays*, 33(2), 76–83. <https://doi.org/10.1016/j.displa.2011.09.001>

Barreda-Angelès, M., Aleix-Gulluisme, S., & Pereda-Baflo, A. (2020). Users' psychophysiological, vocal, and self-reported responses to the apparent attitude of a virtual audience in stereoscopic 360° video. *Virtual Reality*, 24(2), 289–302. <https://doi.org/10.1007/s10255-019-00400-1>

Bertozzi, A. (2008). *The Physiology and Psychology of Virtual Reality* (1<sup>st</sup> éd.). (S.l.) : Oxford University Press.

Biggs, A. T., Geyer, D. J., Schroeder, V. M., Robinson, F. E., & Bradley, J. L. (2018). *Adapting Virtual Reality and Augmented Reality Systems for Naval Aviation Training* (No. AD1063175). Dayton, Ohio : Naval Medical Research Unit Dayton Wright-Patterson AFB United States.

Bizzecco, A., Battistini, A., Gabrielli, G., Esposto, G., & Furarello, C. (2019). physio: A physiological signal processing library for data science approaches in physiology. *SoftwareX*, 10, 100287. doi:10.1016/j.softx.2019.100287

Brivio, E., Gaudioso, F., Vergine, I., Mirizi, I., Reina, C., Stellar, A., & Galimberti, C. (2018). Preventing Technotress Through Positive Technology. *Frontiers in Psychology*, 9. <https://doi.org/10.3389/fpsyg.2018.02648>

Brun, C., Gagné, M., McCabe, C. S., & Mercier, C. (2018). Motor and sensory disturbances induced by sensorimotor conflicts during passive and active movements in healthy participants. *PLOS ONE*, 13(8), e0203206. <https://doi.org/10.1371/journal.pone.0203206>

Calik, B. B., Yagci, N., Ozturk, M., & Caglar, D. (2020). Effects of risks related to computer use on musculoskeletal pain in office workers. *International Journal of Occupational Safety and Ergonomics*, 0(0), 1–6. <https://doi.org/10.1080/10803548.2020.1765512>

Cai, T., Zhu, H., Xu, J., Wu, S., Li, X., & He, S. (2017). Human cortical neural correlates of visual fatigue during binocular depth perception: An fNIRS study. *PLoS ONE*, 12(2), e0172426. doi:10.1371/journal.pone.0172426

Chang, E., Kim, H. T., & Yoo, B. (2020). Virtual Reality Sickness : A Review of Causes and Measurements. *International Journal of Human-Computer Interaction*, 36(1), 1658–1682. <https://doi.org/10.1080/10447318.2020.1778351>

Chen, S., & Epp, J. (2014). Using Task-Specific Pupil Diameter and Blink Rate to Infer Cognitive Load. *Human-Computer Interaction*, 29(4), 390–413. doi:10.1080/07370242.2014.892428

Chen, Y., Wang, X., & Yu, H. (2021). Human factors/ergonomics evaluation for virtual reality headsets: A review. *CCF Transactions on Persuasive Computing and Interaction*. <https://doi.org/10.1007/s43486-021-00062-6>

Cobb, S. V. G., Nichols, S., Ramsey, A., & Wilson, J. R. (1999). Virtual Reality-Induced Symptoms and Effects (VRISE). *Presenters Teleoperators and Virtual Environments*, 8(2), 169–186. <https://doi.org/10.1163/1057448995061512>

Davis, S., Nesbit, K., & Naikvalko, E. (2014). A Systematic Review of Cyberickness (pp. 1–9). Communication présentée au Proceedings of the 2014 Conference on Interactive Entertainment - IE2014, Newcastle, NSW, Australia. doi:10.1145/2677558.2677780

Daniel, F., & Kapoula, Z. (2019). Induced vergence-accommodation conflict reduces cognitive performance in the Stroop test. *Scientific Reports*, 9(1). doi:10.1038/s41598-018-37778-y

de Dreu, M. J., Schouwenaars, I. T., Rutten, G.-J. M., Ramsey, N. F., & Janma, J. M. (2019). Brain Activity Associated With Expected Task Difficulty. *Frontiers in Human Neuroscience*, 13. <https://doi.org/10.3389/fnhum.2019.00786>

Dell'ignazio, F., Momeni, A., Ariza, A., & Atenza, D. (2020). Cognitive Workload Monitoring in Virtual Reality Based Rescue Missions with Drones. In I. Y. Chen & G. Fragomeni (Eds.), *Virtual, Augmented and Mixed Reality, Design and Interaction* (p. 397-409). Springer International Publishing. [https://doi.org/10.1007/978-3-030-43605-1\\_26](https://doi.org/10.1007/978-3-030-43605-1_26)

Dennison, M. S., Wisti, A. Z., & D'zmarra, M. (2016). Use of physiological signals to predict cybersickness. *Displays*, 44, 42–52. <https://doi.org/10.1016/j.displa.2016.07.002>

Deschenes, C., Renerman-Jones, L., Moss, J., Krum, D., & Hudson, I. (2020). Negative Effects Associated with HMDs in Augmented and Virtual Reality. In J. Y. Chen & G. Fragomeni (Eds.), *Virtual, Augmented and Mixed Reality, Design and Interaction* (p. 410-428). Springer International Publishing. [https://doi.org/10.1007/978-3-030-43605-1\\_27](https://doi.org/10.1007/978-3-030-43605-1_27)

Diaz, G., Cooper, J., Rothkopf, C., & Hayhoe, M. (2013). Saccades to future ball location reveal memory-based prediction in a virtual-reality interception task. *Journal of Vision*, 13(1), 20–20. <https://doi.org/10.1167/13.1.20>

Ding, Y., Cao, D., Duffy, V. G., Wang, Y., & Zhang, X. (2020). Measurement and identification of mental workload during simulated computer tasks with multimodal methods and machine learning. *Ergonomics*, 63(7), 896–908. <https://doi.org/10.1080/00140139.2020.1759608>

Etayeb, S., Stael, I. B., Haszani, A., & de Bie, R. A. (2009). Work Related Risks for Neck, Shoulder and Arms Complaints : A Cohort Study Among Dutch Computer Office Workers. *Journal of Occupational Rehabilitation*, 19(4), 315. <https://doi.org/10.1026/0926-0099-019-00004>

EU-OSHA. (2019). *Digitalization and occupational safety and health* [Brochure doi:10.2802/191288]. European Agency for Safety and Health at Work. <https://www.euro.who.int/en/who-europa/eu/oehse>

Fink, G. (2016). Chapter 1 - Stress: Definitions, Mechanisms, and Effects Outlined : Lessons from Anxiety. In G. Fink (Ed.), *Stress : Concepts, Cognition, Emotion, and Behavior* (p. 3-11). Academic Press. <https://doi.org/10.1016/B978-0-12-800611-3.00001-2>

Foreman, M., & Kanarim, A. (Eds.). (2010). *Handbook of Set Theory*. Springer Netherlands. <https://doi.org/10.1007/978-1-4614-7764-0>

Frutiger, M., & Boorhanies, R. (2021). Systematic Review and Meta-Analysis Support Strength Training and Workplace Modifications May Reduce Neck Pain in Office Workers. *Pain Practice*, 21(1), 100–131. <https://doi.org/10.1111/papr.12940>

Fuchi, P. (2018). The Challenges and Risks of Democratization of VR-AR. Dans B. Amaldi, P. Gutton, & G. Moreau, *Virtual Reality and Augmented Reality: Myths and Realities*.

Gallagher, M., & Ferré, E. R. (2018). Cyberickness : A Multisensor Integration Perspective. *Multisensory Research*, 31(7), 645–674. <https://doi.org/10.1163/721334808-20181293>

Gandevia, S. C. (2001). Spinal and supraspinal factors in human muscle fatigue. *Physiological Reviews*, 81(4), 1735–1769. <https://doi.org/10.1152/physrev.2001.81.4.1735>

Garcia-Aguilera, D., Reuter, B., Konzil, R., Caserman, P., Miede, A., & Göbel, S. (2019). Development of a Classifier to Determine Factors Causing Cyberickness in Virtual Reality Environments. *Games for Health Journal*, 8(6), 439–444. <https://doi.org/10.1089/g4h.2019.0045>

Gavangi, A. M., Nesbit, K. V., Blackmore, K. L., & Naikvalko, E. (2017). Profiling subjective symptoms and automatic changes to cybersickness. *Autonomic Neuroscience: Basic and Clinical*, 20(1), 41–50. <https://doi.org/10.1016/j.autneu.2016.12.004>

Grassini, S., & Laumann, K. (2021). Immersive visual technologies and human health. *European Conference on Cognitive Ergonomics* 2021, 1–6. <https://doi.org/10.1145/3452453.3467856>

Heidiraghdam, R., Mohammadi, I., Babamiri, M., Soltanian, A. R., Khorasani, H., & Sobrabi, M. S. (2020). Study protocol and baseline results for a quasi-randomized control trial: An investigation on the effects of ergonomic interventions on work-related musculoskeletal disorders, quality of work-life and productivity in knowledge-based companies. *International Journal of Industrial Ergonomics*, 80, 103030. <https://doi.org/10.1016/j.indergo.2020.103030>

Holt, T. J., & Bleivins, K. R. (2011). Examining Job Stress and Satisfaction Among Digital Forensic Examiners. *Journal of Contemporary Criminal Justice*, 27(2), 230–250. <https://doi.org/10.1177/0882260411417004>

Hoffring, R. C., & Seitz, C. (2016). Pupil size as an indicator of neurochemical activity during learning (pp. 341–342). Communication présentée au Proceedings of the Ninth Biennial ACM Symposium on Eye Tracking Research & Applications (ETRA '16), Charleston, SC, USA. doi:10.1145/2857491.2888586

Howard, M. C., & Van Zandt, E. C. (2021). A meta-analysis of the virtual reality problem : Unequal effects of virtual reality sickness across individual difference. *Virtual Reality*. <https://doi.org/10.1007/s00335-021-00574-3>

Iskander, J., Hossny, M., & Nahavandi, S. (2018). A Review on Ocular Biomechanical Models for Assessing Visual Fatigue in Virtual Reality. *IEEE Access*, 6, 19345–19361. doi:10.1109/ACCESS.2018.2815663

Islam, R., Lee, Y., Jakob, M., Muhammad, I., Zhu, D., & Quarles, J. (2020). Automatic Detection of Cybersickness from Physiological Signal in a Virtual Roller Coaster Simulation. *2020 IEEE Conference on Virtual Reality and 3D User Interfaces Abstracts and Workshops (VRW)*, 648–649. <https://doi.org/10.1109/VRW5115.2020.9137575>

Jahncke, H., & Halfman, D. M. (2020). Objective measures of cognitive performance in activity based workplaces and traditional office types. *Journal of Environmental Psychology*, 72, 101503. <https://doi.org/10.1016/j.jenvp.2020.101503>

Kim, Y. Y., Kim, J. H., Kim, E. N., Ko, J. D., & Kim, H. T. (2016). Characteristic changes in the physiological components of cybersickness. *Psychophysiology*, 49(5), 616–625. <https://doi.org/10.1111/1469-8938.20043>

LaVolta, J. I. (2000). A discussion of cybersickness in virtual environments. *ACM SIGCHI Bulletin*, 32(1), 47–56. doi:10.1145/333229.333344

Lambool, J., Iesselingh, W., Fortuin, M., & Heynderickx, I. (2009). Visual Discomfort and Visual Fatigue of Stereoscopic Displays: A Review. *Journal of Imaging Science and Technology*, 53(3), 1–14. <https://doi.org/10.2351/j.1547-3163.2009.013020>

Lawson, R. D. (2014). Motion Sickness Symptomatology and Origins. In H. K. Hsieh & K. M. Starkey (Eds.), *Handbook of Virtual Environments Design, Implementation, and Applications* (second). CRC Press. <https://www.taylorfrancis.com/books/9780420928710/chapters/10.1201/b17360-33>

Lim, H.-K., Kim, H., Jang, T., & Lee, Y. (2013). Research Trends of International Guides for Human Error Prevention in Nuclear Power Plants. *Journal of the Ergonomics Society of Korea*, 32. <https://doi.org/10.13153/1524-0013.32.1.125>

Li Torri, G., Esposto, A., Scariati, I., & Chappetta, M. (2019). Definition, symptoms and risk of stress/stress : A systematic review. *International Archives of Occupational and Environmental Health*, 92(1), 13–35. <https://doi.org/10.1007/s00360-018-1352-1>

Li, J., Li, H., Umer, W., Wang, H., Xing, X., Zhao, S., & Hou, J. (2020). Identification and classification of construction equipment operators' mental fatigue using wearable eye-tracking technology. *Automation in Construction*, 109(103000). <https://doi.org/10.1016/j.autcon.2020.103000>

Maher, M. A., Chircop, C., Pascual, V. M., Hinch, D., & McNaughton, M. (2012). *Measuring Perception in Environmental Stressors*: Evidence for Consistency of Responses and Optimal Control Interventions. *Cognitive Diseases*, 21, 2152. <https://doi.org/10.1007/s00322-012-2152-3>

Matsuura, Y. (2019). Aftereffect of Stereoscopic Viewing on Human Body II. Dans H. Takada, M. Miyao, & S. Futeh, *Current Topics in Environmental Health and Preventive Medicine* (1<sup>st</sup> éd., pp. 89–99). (S.l.) : Springer, Singapore. doi:10.1007/978-981-33-1601-2\_8

Minutillo, S., Cleary, M., & Visser, D. (2021). Employee Well-Being in Open Plan Office Spaces. *Issues in Mental Health Nursing*, 42(1), 103–105. <https://doi.org/10.1080/10608260.2020.1860072>

Mun, S., Park, M.-C., Park, S., & Whang, D. (2012). SVSEF and ERP measurement of cognitive fatigue caused by stereoscopic 3D. *Neuroscience Letters*, 525(2), 89–94. doi:10.1016/j.neulet.2012.07.049

Nestor, K., & Naikvalko, E. (2018). Cyberickness. In N. Lee (Ed.), *Encyclopedia of Computer Graphics and Games* (p. 1–14). Springer International Publishing. [https://doi.org/10.1007/978-3-319-82314-7\\_251](https://doi.org/10.1007/978-3-319-82314-7_251)

O'Regan, K., & Nozaki, H. (2001). A sensorimotor account of vision and visual consciousness. *The Behavioral and Brain Sciences*, 24(5), 939–973, discussion 973–1031. <https://doi.org/10.1017/S0140525X01000015>

Peterson, R. (2009). Review Paper: Human factors of stereoscopic displays : An update. *Journal of the Society for Information Display*, 17(12), 987–996. <https://doi.org/10.1889/jstd.v17i12.987>

Peterson, R., Winterbottom, M. D., & Pearce, B. J. (2006). Perceptual issues in the use of head-mounted visual displays. *Human Factors: The Journal of the Human Factors and Ergonomics Society*, 48(8), 555–573. doi:10.1518/001872006778606877

Perez, L., Perez, J., Englehardt, D. R., & Sachau, D. (2010). Secondary Traumatic Stress and Burnout among Law Enforcement Investigators Exposed to Disturbing Media Images. *Journal of Police and Criminal Psychology*, 25(2), 113–124. <https://doi.org/10.1080/107351109031701378600>

Philips-Wren, G., & Adya, M. (2020). Decision making under stress: The role of information overload, time pressure, complexity, and uncertainty. *Journal of Decision Systems*, 0(0), 1–13. <https://doi.org/10.1080/107351109031701378600>

Pouget, A., Beck, J. M., Ma, W. J., & Latham, P. E. (2013). Probabilistic brains : Knowns and unknowns. *Nature Neuroscience*, 16(9), 1170–1178. <https://doi.org/10.1038/nrn3545>

Porcino, T., Rodrigues, E. O., Silva, A., Clua, E., & Trevisan, D. (2020). Using the gameplay and user data to predict and identify causes of cyberickness manifestation in virtual reality games. *2020 IEEE 8th International Conference on Serious Games and Applications for Health (SeGAH)*, 1–8. <https://doi.org/10.1109/SeGAH49190.2020.92101648>

Prem, R., Paškun, M., Kubek, B., & Korunka, C. (2018). Exploring the ambivalence of time pressure in daily working life. *International Journal of Stress Management*, 25(1), 35–43. <https://doi.org/10.1037/i0020-00000044>

Rac-Lubashevsky, R., Slagter, H. A., & Kesler, Y. (2017). Tracking Real-Time Changes in Working Memory Updating and Gating with the Event-Based Eye-Blink Rate. *Scientific Reports*, 7(1), 103. doi:10.1038/s41598-017-02942-3

Reason, J. T. (1978). Motion sickness adaptation: A neural mismatch model. *Journal of the Royal Society of Medicine*, 71(11), 819–829.

Rebentisch, L., & Owen, C. (2018). Review on cybersickness in applications and visual displays. *Virtual Reality*, 20(1), 165–174. <https://doi.org/10.1007/s10255-018-0285-9>

Rebentisch, L., & Owen, C. (2021). Estimating cybersickness from virtual reality applications. *Virtual Reality*, 21(1), 165–174. <https://doi.org/10.1007/s10255-020-00446-6>

Sheppard, A. L., & Wolfson, J. S. (2018). Digital eye strain : Prevalence, measurement and amelioration. *BMJ: British Medical Journal*, 391. <https://doi.org/10.1136/bmjjingleigh-2018-001866>

Shrader-Frechette, K. (2010). *Technology and Ethics*. Dans C. Hanks, *Technology and Values* (pp. 60–64). (S.l.) : Wiley-Blackwell.

Slater, M., Gonzalez-Llortres, C., Hagger, R., Vinkers, J., Jelley, S., Watson, B., Green, R., Stothard, D., Hallin, S., Fox, D., & Silver, J. (2020). The Ethics of Realism in Virtual and Augmented Reality. *Front. Virtual Real.* 1. doi:10.3389/frvir.2020.00001

Souchet, Aleksi (2020) Visual fatigue impacts on learning via serious game in virtual reality. PhD thesis, Paris 8 University, Saint-Denis, France. DOI: 10.33401/16.2.2.2619-56084

Souchet et al. (2019) Investigating Cytoskeletal Stereoscopic Effects over Visual Discomfort and Fatigue in Virtual Reality. In: Proceedings of the 18th IEEE International Symposium on Mixed and Augmented Reality (ISMAR'19), Beijing, China. DOI: 10.1109/ISMAR5000.2019.900031

Souchet et al. (2018) Eyestrain impacts on learning job interview with a serious game in virtual reality: a randomized double-blinded study. In: Proceedings of the 24th ACM Symposium on Virtual Reality Software and Technology (VRST'18), Tokyo, Japan. DOI: 10.1145/3281505.3281509

Stone, R. J. (2016). Getting VR Right Then and Now... : The indispensable role of Human Factors and Human-Centred Design. *Presence: Teleoperators and Virtual Environments*, 25(2), 151–161.

Stanney, K., Lawson, B. D., Rakers, B., Dennison, M., Fidopiastis, C., Stoffregen, T., Weech, S., & Fulvio, J. M. (2020). Identifying Causes of and Solutions for Cybersickness in Immersive Technology : Reformulation of a Research and Development Agenda. *International Journal of Human-Computer Interaction*, 36(19), 1783–1803. <https://doi.org/10.1080/10447318.2020.1778350>

Toriz, K., & Hansari, M. (2017). Causes of discomfort in stereoscopic content : a review. *Computing Research Repository (CoRR)*.

Ueki, K., & Howarth, P. A. (2008). Visual fatigue caused by viewing stereoscopic motion images: Background, theories, and observations. *Displays*, 29(2), 106–116. doi:10.1016/j.displa.2007.09.004

Vasile, M. R., Kirby, J. A., & Angele, B. (2018). Auditory Distraction During Reading : A Bayesian Meta-Analysis of a Continuing Controversy. *Perspectives on Psychological Science*, 13(3), 567–597. <https://doi.org/10.1177/1745691617747398>

Van Ackter, B. B., Parmentier, D. D., Vlerick, P., & Saldien, J. (2018). Understanding mental workload : From a clarifying concept analysis toward an implementable framework. *Cognition, Technology & Work*, 20(3), 351–365. <https://doi.org/10.1007/10111-018-0481-3>

Van den Berg, M. M. H. E., Maas, J., Muller, B., Braam, A., Kaandorp, W., Van Lieshout, R., Van Poppel, M. N. M., Van Mechelen, W., & Van den Berg, A. E. (2015). Autonomic Nervous System Responses to Viewing Green and Built Settings : Differentiation Between Sympathetic and Parasympathetic Activity. *International Journal of Environmental Research and Public Health*, 12(12), 15860–15874. <https://doi.org/10.3390/ijerph121215860>

Watt, D. G. D. (1983). Sensory and Motor Conflict in Motion Sickness. *Brain, Behavior and Evolution*, 23(2), 32–35. <https://doi.org/10.1159/000121485>

Wahl, K. S., McGovern, D. P., Clark, A., & O'Connell, R. G. (2020). Evaluating the neurophysiological evidence for predictive processing as a model of perception. *Annals of the New York Academy of Sciences*, 1464(1), 242–268. <https://doi.org/10.1111/nyas.14321>

Yang, K. C. C. (2019). Reality-Creating Technologies as a Global Phenomenon. *Dans Cases on Immersive Virtual Reality Techniques* (pp. 1–18). (S.l.) : IGI Global. doi:10.4018/978-1-5225-5912-2.ch001

Yildirim, C. (2020). Don't make me sick : Investigating the incidence of cybersickness in commercial virtual reality headsets. *Virtual Reality*, 24(2), 231–239. <https://doi.org/10.1007/s10255-019-00401-0>

Young, M. S., Brookhuis, K. A., Wickens, C. D., & Hancock, P. A. (2015). State of science : Mental workload in ergonomics. *Ergonomics*, 58(1), 1–17. <https://doi.org/10.1080/00140139.2014.956151>

Young, E., Frankenhuus, W. E., & Ellis, B. J. (2020). Theory and measurement of environmental unpredictability. *Evolution and Human Behavior*, 41(6), 550–556. <https://doi.org/10.1016/j.evolhumbehav.2020.08.006>

Zhang, S., & Laumann, K. (2021). Immersive visual technologies and human health. *European Conference on Cognitive Ergonomics 2021*, 1–6. <https://doi.org/10.1145/3452453.3467856>

Heidiraghdam, R., Mohammadi, I., Babamiri, M., Soltanian, A. R., Khorasani, H., & Sobrabi, M. S. (2020). Study protocol and baseline results for a quasi-randomized control trial: An investigation on the effects of ergonomic interventions on work-related musculoskeletal disorders, quality of work-life and productivity in knowledge-based companies. *International Journal of Industrial Ergonomics*, 80, 103030. <https://doi.org/10.1016/j.indergo.2020.103030>

Holt, T. J., & Bleivins, K. R. (2011). Examining Job Stress and Satisfaction Among Digital Forensic Examiners. *Journal of Contemporary Criminal Justice*, 27(2), 230–250. <https://doi.org/10.1177/0882260411417004>

Hoffring, R. C., & Seitz, C. (2016). Pupil size as an indicator of neurochemical activity during learning (pp. 341–342). Communication présentée au Proceedings of the Ninth Biennial ACM Symposium on Eye Tracking Research & Applications (ETRA '16), Charleston, SC, USA. doi:10.1145/2857491.2888586

Howard, M. C., & Van Zandt, E. C. (2021). A meta-analysis of the virtual reality problem : Unequal effects of virtual reality sickness across individual difference. *Virtual Reality*. <https://doi.org/10.1007/s00335-021-00574-3>

Iskander, J., Hossny, M., & Nahavandi, S. (2018). A Review on Ocular Biomechanical Models for Assessing Visual Fatigue in Virtual Reality. *IEEE Access*, 6, 19345–19361. doi:10.1109/ACCESS.2018.2815663

Islam, R., Lee, Y., Jakob, M., Muhammad, I., Zhu, D., & Quarles, J. (2020). Automatic Detection of Cybersickness from Physiological Signal in a Virtual Roller Coaster Simulation. *2020 IEEE Conference on Virtual Reality and 3D User Interfaces Abstracts and Workshops (VRW)*, 648–649. <https://doi.org/10.1109/VRW5115.2020.9137575>

Jahncke, H., & Halfman, D. M. (2020). Objective measures of cognitive performance in activity based workplaces and traditional office types. *Journal of Environmental Psychology*, 72, 101503. <https://doi.org/10.1016/j.jenvp.2020.101503>

Kim, Y. Y., Kim, J. H., Kim, E. N., Ko, J. D., & Kim, H. T. (2016). Characteristic changes in the physiological components of cybersickness. *Psychophysiology*, 50(5), 1469–1486. <a href="https://doi.org/10.1111/1469-8938.2004