

Université de Paris Ecole Doctorale Bio Borbonne Paris Cité ED 562 *Hôpital Robert Debré*

Etude du Neurofeedback électroencéphalographique appliqué au trouble du déficit de l'attention avec ou sans hyperactivité

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REMERCIEMENTS

RESUME DE THESE

Mots-clés

ABSTRACT

Keywords

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Introduction

1.1 Définition du Neurofeedback

1.1.1 Historique

Découverte de l'EEG, premiers pas de la neuromodulation avec Durup et Fressard, les études de Sterman et Lubar, la très forte augmentation des études sur le Neurofeedback depuis les années 2000

1.1.2 Principe du Neurofeedback

Conditionnement opérant, définition phase de transfert, type de seuillage, individualisation des protocoles (iapf), montage, matériel utilisé, marquage CE ou non, gestion des artefacts, définition neuromarqueur, définition impédance

1.2 Les champs d'application du Neurofeedback

1.2.1 De nombreuses applications

Epilepsie, diminution de l'anxiété, douleurs chroniques, etc

1.2.2 Neurofeedback et Trouble du Déficit de l'Attention avec ou sans Hyperactivité (TDAH)

Définition TDAH chez l'enfant (parler du dsm-4 et 5) et parler de l'essor de la problématique du TDAH chez l'adulte, parler des études et des méta-analyses sham-NFB

Enoncé de la problématique quant à l'efficacité du NFB appliqué aux enfants TDAH

1.3 Contribution et résumé des chapitres

Lister les objectifs de la thèse : - Réplication et mise à jour d'une méta analyse en codant les étapes en Python - Identification des facteurs ayant une influence sur le NFB grâce à des méthodes multivariées - Analyse de la distribution d'un marqueur de l'attention pour augmenter l'efficacité du NFB

1.4 Liste des publications

Evaluation de l'efficacité du Neurofeedback par la méta-analyse

Identification des facteurs influençant l'efficacité du Neurofeedback

Analyse de la distribution d'un marqueur de l'attention au sein d'une population d'enfants TDAH

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