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# Analysis And Classification Of Motor Imagery Using Deep Neural Network



OjqYjuv Gqvjm²º.0cqjwpYq±jr² © 0YjwrYjvrw±50 © 0GkmKuQjmn"O–nuvx±5 © 0FJvruSjj"±oS±–j60 Of wFJejm²0Yx±qjQjvqr²jwm[vvjöQ±u+±v5

<sup>5</sup>Y"j "n Qnö Rj kx "j "x "ö x oXnuj kru"ö j wmOv"nuupnwl n x oKunl ""rl j uKz ±ry v nw"0N nknr [ wrén"–r"ö x oZnl qwx ux pö Zrj wsrw 7445740 I qrwj

<sup>6</sup>J nyj ""v nw" xoI xv y±"n" Yl mwl n j wmZnl qwxuxpö0Yl qxxuxoG""r 1 rj uOw"nuupnwl n2Nnknr[ wrén"-r"ö xoZnl qwxuxpö0Zrj wsrw 7448450V2X2I qrwj 2

<sup>7</sup>Hixv nml j uKwprwnn"rwp J nyj ""v nw"0[ wrén"-r"ö x oQx"rwlT rpn"rj 2

GHYZ I Z ( $\delta$  x "x" rv j pn" ö kj -nmxwk" j rwll xv y ±"n" rw"n" ql n , HI Q qj -j "j l"nmrv yx" j w" n-nj "l q j nw"rxwm-yr"n r"-mr l ±u" ö 2 O yų ö – j ér" j u" x m rw q ± v j w l x pwr"rx w j wmq nuy – rw v j t rwp "qn mml r-rx w 2 S j w ö" n-nj "l qn" – ±-n null ""x rwl nyqj ux l p" j v , KKM- -pwj u± "x -"±nö k" j rw j l "rér" ö í r" q un j wm" rpq" lqj wnv x énv nw" 2 J nny unj "wwp , J R- qj – knnw nv yux önmox" v x" x" rv j pn" ö , S O 2 O v" qr – j ""rl u 0 j mnny wn±" j u wn" í x" t , J T T - r – y "x y x – nmox" l uj — r l j "rx w x o un j wm" rpq" v x énv nw" x o KKM -rpwj u ±-rwp I x v v x w Yyj "rj u V j n" w , I YV- j – onj "±"n nó" j l" rx w í r" q –"j wnj "m p" j mmw" mn l nw" , MJ - í r" q v x v nw" ± v j wmj nj y "rén unj "wrwp "j "n RX 2 , MJ S RX - 0" qn yn" ox "v j wl n r – l x v yj "nm±-rwp j l x w ±-rx w v j ""ró0" qn j én" j pn l uj — r l j "rx w j l l ±" j l ö r – <; ) 0 í q n q r – rv y "x én mj – l x v yj "nmí r" q –"j "n k ol" qn lj "" v n" qx m-" qj " ±-nmnr n" nw" nj "j – n" – 2

Qnoʻʻ x"m-(aHʻj rwil xv y±"n" rw"n"qil nOKunl ""x nwl nyqj uxp"j yqöOS x"x" rv j pn"öOI x 1-yj l nOJ nny wn±"j uwn"i x"t

#### 1. INTRODUCTION

H"jrwll xv y±"n" rw"n"qln , HIO r- j lxunl"rxw x" -ö-"nv í qrl q ""j w-uj "n-k"j rw j l "rér"rn-0 yj n"w-xoj ±-n" érj lxv v j wm- x " v n--j pn- ox " rw"n"j l "rén ±-n-0 HI Or"+ ju+x qj"míj"n jwm -x íj"n lxv v ±wdj"rén meérln- érj k"j rw j w $mx \pm y \pm m$  mérl n-dSf 2O-nl x - j - i nu j - j wj uöün "qn k"j rw j l"rér"m– kö rwéj –rén x" wxwlrwéj –rén v xmj u"m–2 Owéj -rén v xmj u"ö rwéx uénm nunl ""x l x ""rl x p"j y qö , KI x Mj wmj l z ±r-r"rx w x onul ""rl j u-rpwj u- x o-rwpun wn±"x w-2T x wl rwéj ⊣rén v x mj u"ö rwl u±m "nl x "mwp nunl ""x nwl ny qj ux p1 "jyqö, KKM-jwm v jpwn"xnwl nyqjuxp"jyqö, SKM-d506f2 KKM r-í mnuö knrwp ±-nm rw HI Oknlj±-n xo-j an"ö ±-nm0 prén-kn n"-yj"rjuj-í nu j- "nv yx"ju "n-xu±"rx w0 í rm" kj wní m"q0kn n" -rpwj u"x wxr-n "j "rx , YT X-0j wmqrpqn" jvyur"±mn j-í nuuj-uxí n" j""rojl" d7f2HI Oprén-j lunj" l x v v ±wrl j "rx w l qj wwnu kn"í nnw "qn k"j rw j wm nó"n"wj u mérl n- knöx wm "qn k" j rw+ wx "v j u x ±" y ± " l qj wwnu+ xo yn"ryqn"j u wn"én– j wm v ±-l un– d8f2 Lx" "qn y±"yx -nm x o qj érwp "qn kn-" lxv v ±wrlj"rxw lqj wwnu kn"í nnw "qn q±v j w k"j rw j wm mnérl n-0 S x"x" rv j prwj "ö , S Olkj -nm k"jrwll xv y±"n" rw"n"qil n-, HI O-qjén ljumm"qn j nw"rxw xo "n-nj"lqn"- knlj±-n -ö-"nv - ljw o±wl"rxw ±-rwp "rv nl±wuxl t nm nunl ""x nwl ny qj ux p"j v , KKM- nj "j d9f 2 Gui HIO -ö-"nv - miju í r"q néxt nm yx "nw" rju- jwm v x "x " rv j pn"ö0"qn n nl " x o nó"n"wj u –±""x ±wmwp j wm qj "mí j "n í nj t nwnm "qn -rpwj ul"x lwxr-n "j "rx , YT X- x o KKM -rpwj u0 rwmém±jum n"nwln-ju-x lj±-nmuxí lxw""xujll±"jlöjí nu j – yxx" "nj ul"rv n ""j w-v r--rxw"j"n d: f2 HI Okj--nm KKM r- j l qj unwprwp "j-t rw "qn -l mw"r l j wm nwprwnn "rwp num "xmjö knlj±-n r" rw"n"y"n"- v nw"ju rv jpn"ö

1xv v j wmd; f2

• S x "x " O j prwj "ö GkmC- ' mm Xj wpn Uo Gyyul j "rx w-

S~x"x"~rv~j~prwj"o~, S~O~mj~u-i~r"q~"qn~v~x'env~nw"~x~o~v~j~wo~yj""-~x~o~"qn~kxmo~xk"j~rwnm~o~xv~-nw-x"o~lv~x"x"~lx""noʻjl"r'ej"rx~w2±-rwp~Hl~Oj~wm~xv~n~j~upx"r"qv~-unj~m"x~"qn~l~u-r~lj"rx~w~x~o~KKM~rpwj~ul~qj"jl"n"r-"rl~knqj~érx"~x"~yj~n"w~j-i~nuu~j-mm~rpw~onnnkj~lt~"x~nwj~kun~"nj~ul"rv~n~x"~rwpunl""rj~u~kj~r-0~j~ux"~x~o~"nl~qwz~±n~qj~m~knnw~nv~yux~onm~±l~q~j~A~j""r~l~nj~u~wn±"j~u~wn"i~x"t~0~Hj~on-rj~w~unj~"wrwp0~±yyx~"~énl~x"~v~jl~qrwn0~onnnlox~"i~j~m~kj~lt~ly~xyj~pj~"rx~w~n±"j~u~wn"i~x"t~,~LLHVT~T~0~uwnj~mr-l~"rv~rwj~w"~j~wj~uo~r~c±iuio~lj~"wn±"j~u~wn"i~x"t~qj~knnw~t-nm~x~"l~uj~-r~lj~"rx~w~v~x"~rv~j~pn"o~d~f~2

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## • Xnuj "nm' x "t nm

S j wö – "±mm– qj én knnw l x wm±l "nm "x rv y "x én "qn lų – r lj "rxwxoS x"x" rv j prwj "ö , S O mj" j 2 n n l mwl ö xo"qn-n -ö-"nv - j u x-" mynwm- xw "qn anj "±"n- -nunl "nm j wm "qn j wx "r"qv - ±-nm ox "l uj --r l j "rxw y±"yx-n-2 G v n"qxm ox" v x"x" rv j prwj "ö , S Q í j – y"xyx –nm ox" "qn lų —r lj "rxw xov ± url qj wwnununl ""xl x ""rl xp" j v , KI xM-0 Zjtrwp oʻxv yj "mw"- í r"q v nmljuö rw""jl "jkun oxlju nyruny-ö2 Zí x onj "±"n- nó" jl "rxw v n"qxm ±-nn0 í qrl q rj±"x"np"n—rén, GX- v xmulxn lmw"-jwm uxlju krwj"ö yj n"w, RHV- xyn"j"x"-2 O prén- -yj"rju "n-xu±"rxw jwm j wp±uj" -yjln t wxí umpn j uxwpí r"q "qn p"j mmw" kxx-"rwp , MH- "xpn"qn" í r"q x"mwj "ö unj -" -z ±j "n- , URY $j \psi x "r" qv \quad i j - \pm -nm j - j \quad l \psi -r \quad n" \quad \alpha "rv \quad y "x \acute{e} rwp \quad "qn$ n lmwlö S x "x "rv j prwj "ö , S O l ų —r l j "rx w ox "KI x M kj-nm H"jrwII xv y±"n" Ov"n"gʻln , HI O -ö-"nv 2 Xn-±u-xo"qn Kóyn"rv nw"j uxw "qn HI OI xv yn"r"rxw 000 nj "j  $\mbox{-n"}$  O-qxí nm "qj " "qn wxénu v n"qxm qj m én "ö $\mbox{pxxm}$ yn"ox"v j wl n j wmpj én j l "x—léj umj"rxw j l l ±"j l ö x o <<2<) j wmj l l ±"j l ö x o=7) 0"n–y nl "rénuö d5f2

V"xyx-nm"qn jurjwln xo lxw"rw±x±- 'jénun" Z"jw-ox"v , I 'Z-"xpn"qn" í r"q mny lunj "wrwp1kj –nm ""jw-on" unj"wrwp" x – xuén "qny"xkunv0 qnjlqménmjw jll±"jlöxo=; 24:) d55f2G annmlox"í j"mkjlt ly"xyjpj"rxw wn±"j u wn"í x"t , LLHVTT- í j-y"xyx-nm kj-nm xw "qn v x"x" rwx"m" "x rv y"xén "qn yn"ax"v j wl n v x"x" rv j pn"ö  $l_{ij}$ —r  $l_{j}$ "rxwy $i_{j}$ w2 Gwm "qn Gll±"jlö í j- ==2×) d56f y"xyx±wmkn n" v n"qxmox" KKM I ų i —r l j "rxw oʻx v "qn onj"±"n nó""jl"rxw jwmlųi —r lj"rxw0 qn jwjuöünm jwm 1 xv yj "nm "qn n nl "rénwn— xo "qn oxuxí rwp j upx "r"qv -A I YVIRJ GO YI YVIRJ GO I YVIXJ GO jwm YI YVIXJ GO n mn"j runm – "±nrö –qxí nm "qj " "qn l ų —r l j "rxw yn"ox"v j wl n xoYI YVIXJ Gíj-kn n""qjwI YVIRJ G0YI YVIRJ G0I YV IXJ G rw ml ryqn" KKM -rpwj uj wml ų -r l j "rxw j upx "r"qv r- kn n" "qjw ""jm"rxwju jwx"r"qv -0 rv y"xénm kö 542,9) d57f2

 $V"n-nw"nmKKM nj"j-n"-\alpha" S OHI Oʻʻxv 96-±ksnl"-j-i nuij-"qn "n-±u" xo"qn y-öl qxuxpıl j uj wmyqö-rxuxpıl j u z±n-"rxwvj r"nOKS Mnj"j-n"-0"qn yx-r"rxwxo7mnul ""x mm-0 j wm KKM- <math>\alpha$ " wxw 1"j-t 1"nij"nm -"j"n-2 n nj"j i j-j wj uöünm kj-nm xw "qn yn"l nw"j pn xo kj m ""rj u-0 nénwl "nij"nm mm-öwl q"xwrij" "xw3 -öwl q"xwrij" "xw , KXJ 3KXY-j wj uö-r-2, 724<) nj"j-n"- pj én "nj-xwj kun j yy" xéj u rwx "v j" rxw d58f2 Pxrwnm oʻʻr CX j wm KKM -rpwj u-  $\alpha$ " l ij -r l j" rxw <ll ij -y "xkuv -0 kö I TT lj w j""r l rj u rw" nurpnwl n "xxu2 n l ij -r l j" rxw j ll ±"j l ö xw éxu±w"j "ö j wm rv j pn" oʻl"nij "nm"j-t-±-rwp "qn krv xnj uj yy" xj l q  $\alpha$ " I TT lkj-nmHI Opj én j wnoʻl nurw" "n-±u" d59f2

G mnny unj "wrwp v n"qxm  $\pm$ yxw xw Xn—""d"nm Hxu"üv j ww S j l qrwn , XHS - í j - y"xyx—nn0 yj ""il  $\pm$ uj "uö0 L"nz  $\pm$ nwl ö mxv j rw "ny"n—nw"j "rxw xo KKM —rpwj u- í j —

xk"jrwnm "q"x±pq q'-" Lx±"m" ""jw-ox"v ,LLZ- jwm íjénun" yjltjpn mnlxv yx⊣r"rxw ,' VJ - ín"n px"jwm ""jrwnm"q"nn XHS –2 Gwm–"jltnm±y "qn XHS – "xpn"qn" í r"q "qn "nv j rwrwp uj ön" "x ox "v j o"nz ±nw" mnny knumo , LJ НТ-2 I xws±pj "n p"j mmw" j wm kjlty"xyjpj"rxw v n"qxm- í n"n ±-nm "x wnl"±wn "qn LJ HT 2V±kul mj "j –n"–í n"n ±–nmj wmLJ HT rv y"xénm"qn yn"ox"v j wl n xén" x"qn" –"j "n– xo 1"qn j "" v n"qxm d<f2 -rwp j wm éj umi "rwp "qn yn"l nw"j pn xo kj m ""rj u-0 nénw "nii "nm mn-öwl q"xwriij "rxw3-öwl q"xwriij "rxw , KXJ 3KXY-0 n KKM mj. "j -n"  $-\alpha$ ". "qn S OHI Omj. "j -n" x o 96  $-\pm k$  snl. "-j í nuu j – "n-±u" xo y-ölqxuxprlju jwm yqö-rxuxprlju  $z\pm n$ -"rxwwj r"n í j –  $\pm$ -nm0r" –qxí nm; 724<) xo"qn mj"j í j – –"j "r–"rl j uö ±–nmox" j wj uö–r–2

Lnj "±"n nó"" j l "rxw v n"qx mérj "rv nl-n"m-y"nml "rxw kj –nmxw"qn GT LOY ox" "qn HI Oj yyurl j"rxwí j – y"xyx –nm0 "qn "n-±u" -qxí nm "qn yx"nw"nju ±-n xo "qn GTLOY rv j prwj "ö , S O l ų —r l j "rx w2 n GT LOY "rv n— -n "m y"nml "rxw "xpn"qn" í r"q S LL] mj "±"n-px" kn n" "n-±u"rw "qn HIO num d5: f2 Nn y"xyx-nm j wm "n wnm "qn "rv nlo"nz ±nwl öl-yj "rj u jyy "xjl q jwm jyy umm r" "x j xwnlmv nw-rxwj u fl ± "-x" l xw" xu HI O nóyn "rv nw" í r"q xwurwn onnnkjlt2] rj xo rwn jwjuö-r-xo"qn jéjrujkun mj"j0 "qnw néju±j"nm0"qn n lmwlöxo"qn y"n–nw" "n wnm í jö í j – l xv yj "nm í r"q "qn x"rprwj u "rv nlo"nz ±nwl ö1–yj "rj u n rvy"xénm yn"ox"vjwln rw ox"v – xo lųi – rlj"rxw jll±"jlö íj – ox±wm ox" "qn y"xyx–nm jyy"xjlq0ír"q j v njw jll±"jlö "j"n xo =5 $\mathfrak{Z}$ )  $\alpha$ " "í x -±ksnl "--"±mmd5; f2

n jl "rér" ö xo KKM "qö" qv – , v ± "qö" qv – í j – -"±mmm0 rw 1 x wwn1 "rx w "x rv j prwp x o ox x "0 "x wp±n0 "rpq"0 jwm un lqjwm v xénv nw" í r"q:4 KKM nunl""xmn–rw wrwn jkunlkxmmm –±ksnl"–2 n qjwm v ± "qö"qv – m-öwl q"x wrünm j uu "qn -±ksnl "-2 'qrun y"x p"n--rén qj wm "nprxwv ± "qö"qv í j – "±mmmm±"rwp "xwp±n x " oxx" v x"x" rv jpn"ö rw juu "qn -±ksnl"-2 n "njl"rén lxv yxwnw" oʻnz±nwl öʻi j−552 Nü 4280i qrun k"x j mlk j wmm"qn m—rpw lq"xv rünm lxv yxwnw"- j" I nw""n 542=Nü 42=0 "qn wj ""xí kj wm j wm qrpqn" o nz ±nwl o í n n xk-n en xw mn-öwl q"x wrünm l x v y x wnw"-2 n l ų --r l j "r x w kn"í nnw "qn ox±"lvx"x" rvjpn"ö kj⊸nm xw KKM ""nju íj– rv y "x énm d58f2 I KS J  $\,$  j wm  $\,$   $\,$   $\,$   $\,$  S YI  $\,$   $\,$  T  $\,$   $\,$  v  $\,$  n " $\,$  qx m  $\,$  i  $\,$  j  $\,$  y"xyx-nmox" rv y"xénm"qn yn"ox"v j wl n xov x"x" rv j pn"ö , S O KKM –rpwj u- l uj –r l j "rxw2 n kn–" KS J j upx "r" q v r– xy"rv rünmy "xyn" uö j wm j mmm "í x l x wm "rx w– "x –nunl" n nl "rén 🕔 L-2 n v ±u"rl-l j un l xwéxu±"rxwj u wn±"j u wn"í x"t í j  $-\pm$ -nmj - j onj" $\pm$ "n nó""jl"x"0"qn "n $-\pm$ u" -qxí -"qj" "qn j wx "r"qv – l j w nó" j l " "qn kn–" n nl "rén anj "±" n x " rwox "v j "rxwd5<f2

G v n"qxm í j – y"xyx-nm j wm mménuxynm  $\alpha$ " l uj —rtörwp wní v x"x" rv j pn"ö  $\pm$ -rwp "qn Znv yx"j u I xwéxu $\pm$ "xxwj u Tn"í x"t , ZI T-2 n í mm" l j  $\pm$ -j u l xwéxu $\pm$ "xxwí r"qrw ZI T í j – rwl  $\pm$ mm0 "qn "nv yx"j u rwx"v j"xxw rw j yj "j unu í jö í r"q v  $\pm$ l q qrpqn" l xv y $\pm$ "j"xxwj un l mwl ö "qj w "qn ""j m"xxwj uXTT-2Zrv n —"j l t nm-yj "rj uKKM-rpwj uqj mknnw nv yuxönmj — "qn rwy $\pm$ " x "qn ZI T2Hj —nm xw "qr-0kx"q "qn —yj "rj u m—""k2 $\pm$ "xxw rwx"v j"xxwj wm"nv yx"j uéj "rj"xxwxo"qn k"j rw-rpwj uí n"n l xw-mn"nm2 n ZI T v n"qx mqj mj —xu $\pm$ "xxw"qj" xk"j rwnm

-"j "nk ol"qnlj "" yn" ox "v j wl n xw" qn v ± url- $\pm$ k snl " j wmv ± ur l"j -t v x" x" rv j pn" ö l ų -r l j" rx w2 n l ų -r l j" rx w j ll ±"j l ö í j -=; 2<=) xw 64 - $\pm$ k snl "- j wm9 "j -t - qj mk nnw xk"j rwnmd5=f 2

n lxwéxut"rxwju wnt"ju wn"i x"t - ,I TT - í n"n y"xyx-nm"x lų -rco "qn v x"x" rv j prwj "o S OKKM -rpwj u-2 "nn j wx "r"qv - í n"n ±-nn0nj"j j ±pv nw"j "rxwj uxwp í r"q j w nól ut-rén ""j w-cn" unj "wrwp -""j "npö í n"n ±-nm"x -xuén "qn y"xkuv xo cní ""rj u- rw v x"x" rv j pn"o "j -t -2 n j wj uö"d j u"np"n—rxw v nj -t"nmí j - j yyumm"x "qn "jí mj"j cx" v r"npj "rwp "qn -""n— xo KUM xw KKM2 nw0 "qn -rv ±tj"rxw "n-tu"- érémuö -qxí nm "qn l xw""rkt"rxw xo "qn y"xyx-nm j upx "r"qv érj "n–"rwp xw Hl Ol xv yn"r"rxw Q nj "j -n" 6k2 Gyyuörwp KUM wxr-n "nv xéj u j wm nj"j j ±pv nw"j "rxwv n"qxm-"n-tu" rwj 42t; rv y"xénv nw" rw"qn t j yyj l xn l mw"2 rw j mm"rxw0 "qr— y"xyx-nm ""j w-cn" unj "wwp v n"qxmum"x j 42t: rv y"xénv nw" rw cx"v xo"qn t j yyj l xn l mw" d64f2

G l xw-±v n"lp"j m k"j rwll xv y±"n" rw"n"g l n mérl n í j – y"xyx-ımí qıl q qj –  $\alpha$ ±" l qj wwnı- un í r"q "ıpq" lqj wm v xénv nw" x mm-ıpwj wrw"n"g l n "x l xunl " j "x"j uxol ux – nuö : 44 – j v yun–  $\alpha$ " un l j wm "ıpq" lqj wm v x"x" rv j pn"ö , S O o"xv "í x –±ksnl "–2 Nrukn" ılN±j wp Z"j w- $\alpha$ " v í j – ±–nımj – anj "±"n no""j l "ıxw0 "qnw –±yyx"" lénl "x" v j l qrwn , Y] S – j wm t lwnj "n–" wnıpqkx"– , t ITT - j yx"r"qv –  $\alpha$ " unj "wwp"qn anj "±"n–j wml ų —r l j "ɪxwí n"n ±–nın2 r–j yy"xj l q qj – aní j kru"m– "x l ų —roö un l j wm "ɪpq" lqj wm v x"x" rv j pn"ö KKM – ɪpwj u-d66f 2

G wní  $-x\pm$ "l n -nyj"; "rxw v n"qxm í j - y"xyx-nm0 í qd q  $\pm$ -nm"qn lx""nl " v xmmuxo"qn qnj m"x  $\pm$ wlv ró "qn KKM-npwj u-érj  $\,$ j mr n"nw"  $-x\pm$ "l n rw"n"v -xo"qnr" yqö-nl j u uxl j "rxw-2O" nl xpwünm $-x\pm$ "l n-uxl j "nmrw m-"rwl " yqö-nl j u "nprxw-xo "qn k"j rw2 O+ l xv yj "nm í r"q rwmynwmw" l xv yxwnw" j wj wö-r -, O G-0 "qn wní  $-x\pm$ "l n-nyj "j "rxw v n"qx mqj m"qn kn-" -yj "rj u-ynl r l r"ö j - í nuuj -j uxí rwp qrpqn" l  $\psi$  -r l j "rxwj l l  $\pm$ "j l  $\ddot{o}$  xo<2 ) d67f2

G oʻj v ní x"t ox" xén"l xv rwp KKM  $\pm$ wl n""j rw"m— rw "nj ul"v n v  $\pm$ u'nl ų — S OHI Oʻi j — y"xyx $\pm$ nn0"qn v  $\pm$ u'nl ų — noʻnw $\pm$ xw xo "qn l xv v xw  $\pm$ yj "rj uyj n"w , I YV- i j  $\pm$ nm ox" j ""roj l" "nsnl "rxw j wmsxrw" j yy"xoʻrv j"n mj pxwj uʻij "rxw , RGJ - i j  $\pm$ nm j  $\pm$ n noʻ"j l"rxw , w j nj y"rén "n $\pm$ xwj wl n "qnx"ö , GXZ- kj  $\pm$ nm wn $\pm$ x lo $\pm$ üüö l ų  $\pm$ r n" wj v nm  $\pm$ nuol"np $\pm$ ų "nm  $\pm$ yn"ér $\pm$ nm Mj  $\pm$ rj w o $\pm$ üüö j nj y"rén  $\pm$ 0"nv j "" , YXYMILj  $\pm$ 1"  $\pm$ 1"  $\pm$ 1"  $\pm$ 1" oʻz  $\pm$ 1"  $\pm$ 1"  $\pm$ 2"  $\pm$ 2"  $\pm$ 3"  $\pm$ 4"  $\pm$ 4"  $\pm$ 4"  $\pm$ 4"  $\pm$ 4"  $\pm$ 5"  $\pm$ 5"  $\pm$ 5"  $\pm$ 7"  $\pm$ 8" oʻz  $\pm$ 1" oʻz  $\pm$ 1" rxw  $\pm$ 1"  $\pm$ 1" rxw  $\pm$ 1"  $\pm$ 1" rxw  $\pm$ 2" "nxv  $\pm$ 1"  $\pm$ 1" rxw  $\pm$ 1"  $\pm$ 1" rxw  $\pm$ 1"  $\pm$ 1" rxw  $\pm$ 1" rxw  $\pm$ 2" "nxoj "" v n"qxmd68f2

n í x"tjknr"ö xo Yyrtrwp Tn±"ju Tn"í x"t , YTTv xmu-rw yj n"w "nl xpw"rxw í j – "n–"nm ox "l ų –r l j "rxw

KKM -rpwj u i r"q én "j -t - r2n2"n-"0 un gj wn0"rpq" gj wn0oxx"0 j wm "x wp±n v x énv nw"- rw v x "x " rv j prwj "ö S @ "qn yn"ox"v jwln xox"qn" ""jmr"rxwjulų —r n"-j-í nuij-"qn yn"ox"v jwl n xo rwy±" onj "±"n– i r"q l xw–"jw" éju±n– j wm rwy±" anj "±"n í n"n l xv yj "nm yxí n" -ynl ""j u mmw-r"ö j wm í jénun" mnl x v yx ⊣r"rx w í j – ± –nm j – onj "±"n nó""jl"rx w -"jpn0"qn "n-±u" -qxí nm "qj" í r"q j -v jun" w±v kn" xo wn±"xw–0 –rvyun y"xkunv– ljw -xuénm d69f2 [ -rwp 1xv yunv nw"j "ö rwox "v j "rxw "x KXJ 3 KXYlkj –nmonj "±"n–2Oʻi j – y"xyx –nmj rv rwp "x rv y"xén "qn yn"ox"v jwln xov x"x" rv jprwj"ölkj –nm KKM l uj –r lj"rxw í r"q "qn oní 11 qj wwnu 1 x wm"rx w0 j wm "x pn"qn" -±yyx"" énl "x" unj "wrwp , KY] R- kj-nm j yy "xjlq í j -  $\pm$ -nm "x l x wwnl " "qn j méj w"j pn- x o "qn KXJ 3KXYlkj -nm onj "±"njwm "qn nénw"1"nuj"nm yx"nw"rjulkj-nm onj"±"n- rw v x"x" rv j prwj "ölkj –nm KKM l ų –r l j "rx w2 KY] R l ų –r n" l x ±um kn ±-nm yx-"n":rx" y"xkj kru"m- "x pn" nw-nv kun unj "wrwp jwm"qn KY] R1kj –nmv x"x" rv jpn"öl ij –r lj"rxwjyy"xjl q qj m"qn j méj w"j pn xo"qn v n"r"-xoKXJ 3KXY kj -nmonj "±"n j wm nénw"1"nuj "nm yx "nw"rj u kj →nm onj "±"n "x rv y "xén "qn nóyn"rv nw"j uyn"ox "v j wl n d6: f2

YI V í j – y "xyx –nm í r"q J nny KRS j – j l ij –r n" ír"q Mxxm n lmwlöd6; f2 Sx"rxwxw-n" ] KV J HT  $\pm$ -rwp KKM "rv n yx rw" – j – 1 ų –r n" í r"q 729 rv y"xénv nw" d6<f2 YY] KV jwm I TT í n"n y"xyx–nm  $\pm -rwp$  Hj wm yxí n" j - l y -r n" í ==26<) \* =8247) rv y"xénv nw" d6=f2 V7440 I TT í r"q KKM "rv n j – j lų – r n" í r"qjwjll±"jlöxo=929) d74f2Hjwmyxí n" ±-rwp J HT í r"q Yrpwr ljw" rv y"xénv nw"d<f2 KKM kj⊸nm xw ITT ij-y"xyx-nm S J G r-<625; 0 LHI YV r-<824) d75f2Hjwmyxin"kj-nmxwJHTij-±-nmir"qrv y"xénm jll±"jlö d76f2 Hjwm yxí n" kj-nm xw ITT/JHT í j- y"xyx→nm í r"q rv y"xénm xo =) d77f2 'x"tuxjmír"q Hjwmyxín" jwmGmjy"rén J HT í j – y"xyx–nm d78f2S x"x" rv j pn"ö kj –nm xw kj wm yxí n"  $\pm$ -rwp J HT j – j lų – r n" í r"q 926: ) rv y "xénv nw" d79f2 K""V0V7440S XI V2S x"x" rv j pn"ö kj –nm xw KMK "rv n yxrw" ±-rwp I TT j - j lųj --r n" í r"q 6) rv y"xénm d7: f2 S x"x" rv j pn"ö kj –nm xw KKM Xjí mj"j =) rv y "x énv nw" d7; f2 S x "x " rv j pn "ö kj –nm xw KKM Xj í  $\pm$ -rwp I TT1] GK j -l ų -r n" i r"q 7) rv y"xénmd7<f2

### j2 J nny unj "wrwp, J R-

J nny uj "wwp r– v j l qrwn uj "wrwp "qj "  $\pm$ -nm "qn v xmu "x uj "w "x l j ""ö x  $\pm$ " l  $\dot{y}$ —r l j "rxw "j  $\pm$  – ó xv KKM – pwj  $\dot{u}$ 0 "nó"0 rv j pn–0 n"12 wn $\pm$ " j u wn"i x"t  $\dot{i}$  j –  $\pm$ -nm "x rv yuv nw" mnny uj "wrwp2 n "n"v mnny  $\pm$ v yü v nj w—"qn w $\pm$ v kn" xown"i x"t  $\dot{u}$  ön"–0"qn qrpqn" "qn  $\dot{u}$  ön"–0"qn mnnyn" "qn wn"i x"t 2 n"n j "n 6 "x 7  $\dot{u}$  ön"–  $\dot{i}$  r"q "qn "j m"rxwj u wn"i x"t j wmv x"n "qj w q $\pm$ wm"nm- xo $\dot{u}$  ön"–  $\dot{i}$  r"q "qn mnny wn"i x"t 2

## k2 Gyyulj "rxwxomny unj "wrwp

KKM -rpwj u j wj uö-r-0 Lj l n "nl xpwr"rxw0 éx rl n "nl xpwr"rxw0 j wm l ų -r lj"rxw0 "nó" rw"n"y"n"j"rxw0 -x  $\pm$ wm "nl xpwr"rxw0 ""j l -rpw "nl xpwr"rxw0 ų wn l ų -r lj"rxw0 m"rén" j -r-"j wl n0-v j ""yqxwn j yy0j w GZS 2

 $\label{eq:continuous} J \ nny \ unj "wwp \ qj-j \ mp"nn xojll ±"jlölxv yj "nm"x x"qn" v xmnu- m±n "x "qn oxuxí rwp y"xyn""m-@v j — nj "j lj wkn jlln—nj -nzö0j ų "pn j v x±w" xonj "j lj wkn jlln—nm í r"qrw j -qx"" yn"rxm0 j wm "qn v xmnu í j - k±n" kö$ 

nóvn""-ď7=f2

J TT sxrw" -nén"j u wxwrwnj" ų ön"- érj -rv yun v nl qj wr-v - í x"t rwp rw yj "j unuj wmrw-yr"nmkö krx ux prl j u wn"éx  $\pm$  - -ö–"nv -2 J TT qj - rwy $\pm$ "0 qmmmw0 j wm x $\pm$ "y $\pm$ " ų ön"- l x wwnl "nm "q"x $\pm$ pq wn $\pm$ "xw- x" wx mr-0 "qn x $\pm$ "y $\pm$ " ų ön" í j - $\pm$ -nmj - "qn rwy $\pm$ " xo "qn wnó" ų ön" d84f2

Ov "qr- yjyn"- í n [ -nm j mnny wn±"ju wn"í x"t , J TT- j wm  $\pm$ -rwp l x l-yj l n v x mnu , I YV- j - j onj " $\pm$ "n nó""j l "x"0"qn - $\pm$ v v j "ö "n-nj "l q mxwn  $\pm$ -rwp j mnny wn $\pm$ "j u wn"í x"t í n"n prénwrw"qn "j kunknuxí 2

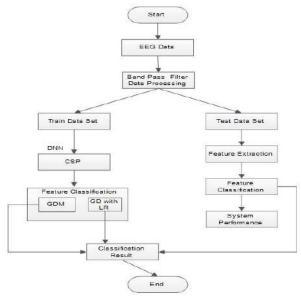
#### 2. METHODOLOGY

#### G2 Kóyn"rv nw"j uJ j "j

HI O mj. "j –n" í j – xk" j rwnm j ", q y @3 prpj nk 2x "p3 mj "j -n" 35446=9-0 ox" luj --r lj "rxw í r" q 96 --±ksnl "0 kx" q v jun jwm cnv jun xo 64 "x 69 önj"-0-j" xw j lqjr" jwm "nujó í r"q j "v "n-"-2kö rv j prwp "qn un j wm "rpq" qj wm v xénv nw"0 "qn nóyn"rv nw" í j – jyy"xénm kö "qn rw-"r"±"rxwju "némí kxj"m xo pí jwps± xo 4 mwl n jwm "nlqwxuxpö2 n mj"j í j−"nlx"mm ±–rwp :8 Gp3GpIu jl"rén nunl""xm-2:8 lqj wwnu í n"n ±-nm ±-rwp kj-nm xw 54154 -ö-"nv 0"qn l qj wwnuj "nAGL; 0GL70GLc 0GL80GL<0 LV50LVc 0LV60L; 0L90L70L50Lc 0L60L80L: 0L<0LZ; 0 LI 90L70LI 50LI ü0LI 60LI 80LI : 0LZ<0Z; 0I 90I 70I 50 I  $\ddot{u}0I$  60I 80I : 0I <0ZV; 0I V90I V70I V50I Vc 0I V60I V80 I V: 0ZV<0V; 0I V90I V70I V50I Vc 0I V60I V80I V: 0V; 0 V90V70V50Vc 0V60V80V: 0V<0VU; 0VU70VUü0VU80V4<0 V=02U502Uü02U60201 í r"q -j v yun "j "n xo956qü2KKMJ j "j í r"q 584 "n–" ""rj u-0564 ""j rwrwp j wm 6 l uj –n–0j " –j v y un "j"n x o 56 < Nü0"qn ⊣pwj uí n"n u"n" kn"í nnw 429 174 Nü0"qn "rvn" jtnwox" njlq""njuíj – =-uxwp2 njw"n"nx" i/—0 yx-"n"rx" ilixo "qn kryxų "KKM l qj wwnu í n"n v nj -±"nm í r"q I 70I c 0j wmI 8 d5: f2

### k2 Luxí I qj ""xoV"xyx-nmHl OYö-"nv

J nny unj "wwp wn±"j u wn" i x"t , J TT- kj-nm xw y"nly"xl n—rwp KKM-rpwj u-±-rwp l x l-yj l n v xmu, I YV- j – mj "±"n nó""j l "x"0 "qn –"ny – rwéx uénm j "n –qx í w rw Lrp±"n 5 knuxí 2



Lrp252 Luxí lqj ""xoy "xyx-nmHl O-ö-"nv

#### 12 J j "j V"xl n—rwp

n --pwj ur- u"n"nm $\pm$ -rwp j Hj wnyj — u"n" j wm "qn --pwj u o"nz $\pm$ nwl ö r- mérmm rw"x "í x kj wm-0 Hn"j j wm S  $\pm$ kj wm "n-ynl "rénuö2 n mny wn $\pm$ "j u wn"i x"t í j -  $\pm$ -nm I xv v xwYyj "rj uVj n"w, I YV- j - "qn onj " $\pm$ "n no""j l"x"2

#### J 2 I xv v xwYyj "rj uVj n"w, I YV-

I xv v xw Yyj "rj u Vj n"w , I YV- r-  $\pm$ -nmj - j onj " $\pm$ "nó" jl "rxwj yx "r"qv 0 $\pm$ -nmox "-yj "rj u u"n"rwp0 $\pm$ - $\pm$ j uö mxwn ox " í x ll y — l y —r l j "rxw y $\pm$ "yx -n-2 -yj "rj u m-"rk $\pm$ "rxw l xv yxwnw" xo j u l y —n- l j w kn nó" jl "nm ox v v  $\pm$ u"rl l qj wwnunj "j 0"qn mmj xo I YV j yx "r"qv - r- "x mj pxwj uün "qn v j "ró "x pn" j -n" xoxy "rv j u u"n" - ox "y "xsnl "rxw0"qn mr n"nwl n kn"í nmw "qn éj "rj wl n xo"qn "í x "öyn-xo-pwj uí rulkn v j órv rünn0qnwl n0qrpq m-l "rv rwj "rxwj ll  $\pm$ "j l ö xo "qn onj " $\pm$ "n énl "x "í rulkn xk"j rwnmd8f 2

n v j rw kj -r- x o I YV Gupx "r"qv - r- -yj "rj u u"n"' 0 "qn yj "j v n"n" j wmnz ±j "rx w-j "n j - cnuxí A

n l j "npx" ö x o "qn y"ny" x l n—nm KKM mj "j r– j – ox ul uxí A

n twxí w l uj —roö, s K d5: f-ar –j v yun l x éj "nj wl n v j ""ról j w k n l j ul ± uj "nmí r"q ox uux í rwp nz ± j "rx w@

$$P_{xi} = cov(X_i) , 5-$$

nw0wx"v juünmlxéj"rjwlnxo"qnlıj—ljwljul±uj"n j–j onuxí 0±–rwp"qnoxuxí rwpnz±j"rxw0

$$P_{j} = \frac{1}{n} \sum_{i=1}^{nj} P_{xi}$$
, 6-

Lx" sC 5 x" 60 j wm ws r– "qn w±v kn" xo ""rj u- rw nj l q l uj —2 n nrpnwéj u±n nml xv yx –r"rxwí ruukn yn" cx"v nm±–rwp "qn cxuxí rwp nz ±j "rxwA

$$(P_1 + P_2)^{-1} P_1 = W_{\Lambda} W^T \qquad , 7$$

$$f_p = \log \left( \frac{var(Z_P)}{\sum_{i=1}^{2m} var(Z_i)} \right)$$
 , 8-

I xw-nz±nw"uö0 kö lxv yx-rwp "qn v j ™ró cy xo "qn "xí –j wmuj–" v "xí –nó""jl"nmő"xv c ,6S BT-

n Mnwn"j utinm Xj öunpq $\,z\pm x$ "mw" kj –nm –yj "–n I YV j "n j –ouw í A

$$J(W) = \frac{W^T X_1 X_1^T W}{W^T X_2 X_2^T W} = \frac{W^T P_{X1} W}{W^T P_{X2} W} ,9$$

' qn"n Z r–"qn""j w-yx -n v j ""ró2

Nnwl n0' Oa  $_5$ Oa  $_6$ , a r3r C506- Cj wm,  $V_{a\,5}$ O $V_{a\,6}$ 3r C506- 2

n l x w="j w" éj u±n Q í j - v ±u"ry umm "x w±v n"j "x" j wm mmwx v rwj "x"0 j wm "qn nz ±j "rx w 9 nx n- wx" l qj wpn "qj " r- P, ' -0

$$J(kW) = J(W) \qquad , : -$$

$$L(\lambda, W) = W^T P_{X1} W - \lambda (W^T P_{X2} - 1)$$
 ,;

Hö "j t rwp "qn yj ""rj u m"réj "rén– , ; - xo Rj p"j wprj w l xwl n"wrwp' 0r" nz ±j u"x ün"x0"qnw  $V_{ab}{}^{\mathcal{S}}V_{ab}$  ' '

Hj –nmxw "qn j kxén  $\infty$ "v ±ų 0I YV j  $\psi x$ "r"qv – í rukn l xwén""nmrw"x nrpnwéj u±n  $\infty$ " –xvérwp l xv yunó KKM– $\psi y$ u-2

' r"q pnwn"j uünmnrpnwéj u±n-0M"j mmw" J n-l nw" í r"q v xv nw"±v j wm j nj y"rén RX í j – ±-nm "x l xv yj "n o±"±"n nó""j l "xxw "n-±u"-0"nynj "nm9444 "rv n-2

## n2 M"j mmw" J n-l nw" S n"qx m

 $M''j nmw'' m-l nw'' r-j "-"k"mm' r"n'j "rén xy"rv rüj "rxw j wx"r''qv ±-nm \u03b3 "xk"j rwwp j wlju v rwv ±v xo j m n''nw''rj kun \u03b3 wl "xxw0 r''+ kj -nm xw "qn xk-n''ej kun v ±u''rléj "rj kun \u03b3 wl "xxw$ **L, 6** $- í r''qrwj yxrw'' "qn \u03b3 wl "rxw' nu ml "nj -n "j ymmö kö o''xv j "x "qn m''nl "rxwxoLj" j 01 L, j -$ 

$$a_{n+1} = a_n - \gamma \nabla F(a_n)$$

Gu+x0 r– j –v j un" yx–r"rén "nj u w±v kn" L , j "- L , j "/  $_{\rm w}$ - I xw–nz ±nw"uö0L , a  $_{\rm 4}$ - L , a  $_{\rm 5}$ - L , a  $_{\rm 6}$ - L , a  $_{\rm 8}$ - j wm–x xw

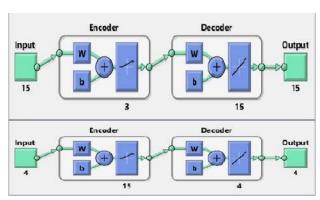
$$\gamma \mathbf{n} = \frac{\left| \left( X_n - X_{n-1} \right)^T \left[ \nabla F X_n - \nabla F X_n \right] \right|}{\| \nabla F (X_N) - \nabla F X_{n-1} \|^2} \qquad , < -$$

ro "qn l qx-nw r- ų "pn "x n-"rv j "n0 r" í nu qj wp x" -í rwp j "x±wm"qn xy"rv j uyxrw"0 wx"  $\propto$ uxí rwp "qn j l "±j u "n-±u" k±" rol qx-nw-v j uéj -" j v x±w" xor"n"j "rxwj wml qj wpn "qn j yy"xj l q xo "qn xy"rv ±v r"n"j "rxw0 MJ - qj én knrwp ±-nm kö "n-nj "l qn"-l ų -r l j "rxwj éj nj ku nj "j 2

n l ų — r l j "rx w yn" ox "v j wl n x o v x" x" rv j prwj " ö , S  $\Theta$  í j – rv y "xénmí r" q v xv nw"  $\pm$ v j wmj nj y "rén RX d85f2

## ⊗ Kwl xm" j wmJ nl xm"

Kwl xm" j wmml xm" í n"n  $\pm$ -nm $\alpha$ " l xwén""rwp KKM -rpwj uốx v xwn  $\alpha$ " v "x j wx"qn"  $\alpha$ " nj -ö y"x l n—rwp j – í nu j – nwmwp j wm"nl nrérwp "qn -rpwj ud86f 2



Lrp262 Kwl xmm" j wmJ nl xmm"

### p2 Vn"ox"v j wl n Kéj u±j"rx w

Ov "qr- "n-nj "l q0 "qn yn " $\alpha$ " v j wl n j ll ±"j l ö l ų -r l j "rx w í j - néj u±j "nm rw yn "l nw"j pn , ) -  $\alpha$ " kx "q "n-"rwp j wm "j rw nj "j 2

$$Accuracy = \left(\frac{mumber \ of \ correct \ trials}{total \ mumber \ of \ trials}\right) \times 100\% \quad , = -100\%$$

Sensitivity = 
$$\frac{TP}{TP + FN} \times 100\%$$
 , 54-

$$Specificity = \frac{TN}{TN + FN} \times 100\%$$
, 55-

$$Accuracy = \frac{TP + TN}{TP + FN + TN + FP}$$
, 56-

í qn"n ZV r- <sup>™</sup>±n yx-t"rén0ZT r- <sup>™</sup>±n wnpj "rén0LT r- gi u-n wnpj "rl n j wmLVr- gi u-n yx-t"rén2

#### q2 Rrwnj "Xnp"n—rxw

Rrwnj " "np"n—xw r— j "nl qwz  $\pm$ n "qj " -qxí - j wm rwén—"pj "n— "qn "nuj "rxw-qry kn"í nnw "í x éj "rj kun–0 r" +  $\pm$ -nım "x mmw"rö "qn "nuj "rxw-qry kn"í nnw x $\pm$ " "j "pn" j wm x $\pm$ "y $\pm$ " "n-±u"2 Gwm "qn j l l  $\pm$ "j l ö0 y"nl r-rxw0 j wm j wj uö-r-xo "qn rv yj l "xo "qn v xmuxo "qn -ö-"nv j "n v nj -±"nm² O+ prénwkö nz  $\pm$ j "rxw-j -

QCS / Q

' qn"n S j wma j "n m wnmkö nz ±j "rxw–j -@

$$M=(Intercept) = \frac{\sum K \sum X^2 - \sum X \sum Xk}{n \sum x^2 - \sum x^2} ,57$$

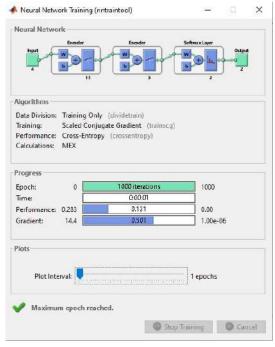
$$I=(Slope) = \frac{n\sum XK - (\sum X)(\sum K)}{n\sum X^2 - (\sum X)^2}, 58$$

$$R^2 = \frac{Variation(Mean) - Variation(fit)}{variation(Mean)} \quad , 59$$

qnwl n0a j wmQj "n "i x éj "rj kun-0 $\Omega$ r – uxyn $\Omega$ S r – én "rl j u ukn $\Omega$ a r – "-" nj "j Géj utn  $\pm$ nnnj wm $\Omega$ r – nl x wmnj "j –n"  $\pm$ nnn $\Omega$ 

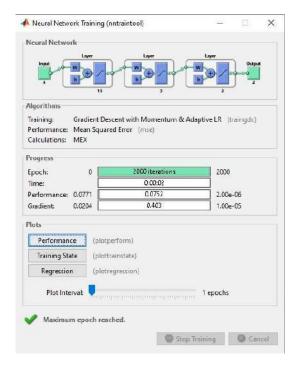
#### 3. ANALYSIS AND RESULT

"nn v xmu- í n"n  $\pm$ -nm rw "qr- "n-nj "l q "qn v rwrv  $\pm$ v n""x "xo "qn ""j rwrwp j wm "n-"rwp í j-j "j "pn" j-1 C42445 I42490 unj "wrwp "j "n j wm v j órv  $\pm$ v nyxl q j "n 4245 j wm 59444 "n-ynl "rénuö0 p"j mmw" nm-l nw" , MJ-j wm p"j mmw" nm-l nw" í r"q v xv nw" $\pm$ v j wm RX , MJ-RX-0  $\pm$ wl "rxw-0 qj én  $\pm$ rv nj " nm-rpw j wm yj "j v n"n" ox "y "xl n-rwp2



Lrp272MJ S RX

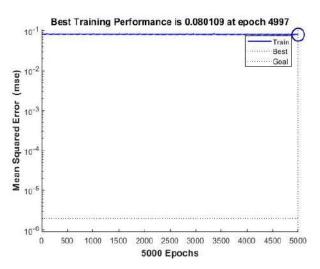
n nóyn"rv nw"j u "n–±u" xo "qn v xnmu- qj én j w j l l ±"j l ö xo <6) í r"q "qn MJ ""j rwwp v n"qxmj – í nuuj – MJ S RXO "qn yn"ox"v j wl n mnynwm xw "qn w±v kn" xo r"n"j "xxw "qj " xl l ±"-0 j – v x"n mn"j ru- -qxí w rw Lrp±"n 7 j wmLrp±"n 82



Lrp282MJ

## Z"j rwrwp yn"ox"v j wl n2

n ""j rwrwp yn " $\alpha$ " v j wl n r– xk"j rwnm kö Ø y "xérwp J j "j j wm Gupx "r"qv Z±wrwp2 n z±j u"ö xo "qn v xmu+ r– pnwn"j uö l xw–""j rwnm kö "qn z±j u"ö xo ""j rwrwp nj "j kn–" yn " $\alpha$ " v j wl n r– xk"j rwnm j" 424864=: j" nyxl q 5=<<5 –qxí wrwLrp±"n 92



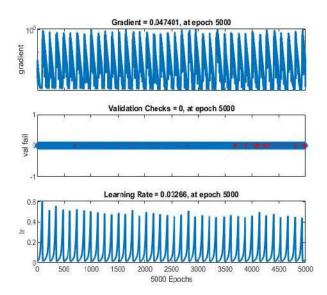
 $\textbf{Lrp292} \ Hn-"\ Z"j\ rwrwp\ yn"\alpha "v\ j\ wl\ n$ 

n v j rw pxj uxo  $\pm$ -rwp  $-z\pm$ j "n n""x" r—"x v rwrv rün "qn n""x" í qrl q r— mn wnmkö "qn Rx— L $\pm$ wl "rxw2 n kn—" ""j rwrwp yn"  $\alpha$  "v j wl n xo 42=55=7 j" 67 nyxl q— -qxí w rw Lrp $\pm$ "n; 2

nlų – r n" yn" ox "v j wl n x ok x" q un j wm" rpq" lqj wm

v xénv nw"-r--qxí wrwLrp±"n<2

n rv j pn -qxí nm "qn l ų —r l j "rxw "n-±u" xo KKM -rpwj u-0 "qn l qj wpn xo "qn l xux" -qxí nm "qn n nl " xo yj "j v n"n" j wm"qn yn "αx" v j wl n xo "qn l ų —r n"2



Lrp2: 2 Rnj "wrwp "j "n

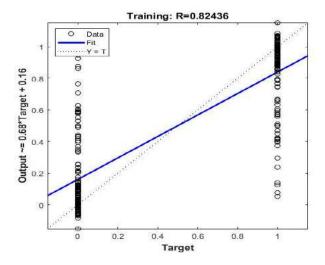




Fig. 7. Regression analysis result and Mean square error.

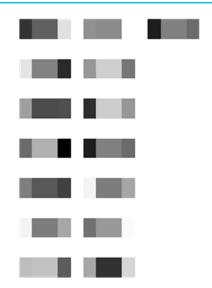
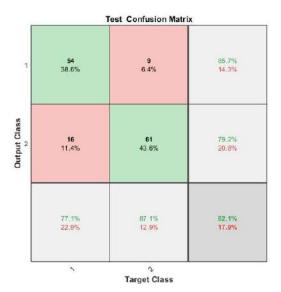
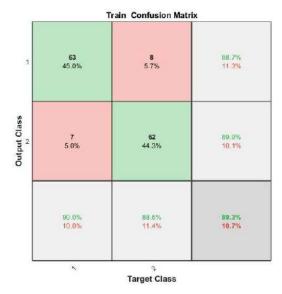


Fig. 8. Shows the performance classifier task on with trials



**Lrp2=2**Zn-"1 x wo±-rx w S j ""ró



Lrp2542Z"j rwl xwo±-rxwS j""ró

#### 4. DISCUSSION

n mmy wn±"ju wn"í x"t í j – ±-nm  $\alpha$ " "qn lų –r lj "rxw KKM nj "j un qj wmj wm" rpq" qj wmxo S x"x" rv j prwj "ö , S O0 í r"q "qn  $\alpha$ uuxí rwp "j wpnlkj wm xo o"nz ±nwl ö <174Nü0<158Nü0 j wm58174Nü0v ± "qō"qv – j "n kn-"  $\alpha$ "  $\alpha$ "  $\alpha$ "j "±"n nó""j l "rxw o"nz ±nwl ö "j wpn xo , <158Nü-j wm rv y"xén "qn yn" $\alpha$ x"v j wl n í r"q "qn kn"j kj wm , 58174Nü-0 ų –"uö0 ±-rwp l xwo±-rxw v j ""ró v xmu- $\alpha$ " t wxí rwp "qn yn" $\alpha$ x"v j wl n xo l ų –r l j "rxw0 kn n" l ų –r l j "rxw l j w kn j l qménm í r"q v ± kj wn2 n Yynl r l r"ö j wm-nw-r"rér"ö xo"qn "n-" l xwo±-rxw v j ""ró í n"n  $\alpha$  ±wm"x kn <528) j wm<624) "n-ynl "rénuö -qxí w rw p±"n = j wm540j wm $\alpha$ " "qn ""j rwl xwo±-rxw v j ""ró "qn -ynl r l r"ö j wm -nw-r"rér"ö j "n j u x  $\alpha$  ±wm "x kn <92) j ym <; 25) 0 v r-l ų –r l j "rxw"j "n-í n"n  $\alpha$  ±wm"x kn 5; 2=) j ym572) 2

 $U\pm$ " "n- $\pm$ u" -qxí nm "qj" MJ S GRX ""j rwrwp qj - j kn n" yn" ac "v j wl n j wm r – ± –nm ac " l ų –r l j "rxw S O" q j w wx "v j u MJ 2 Rj "pn mj "j "nz ±r"nm "qn qrpqn" "qn wn"i x "t yj "j v n"n" "x rwl "nj -n "qn -ynnm x o y "xl n-rwp0 tj "pn mj "j j nl" "qn -ö–"nv n lmwlö2 n w±v kn" xo r"n"j"rxw mnynwm-xwkömn-r"nmyj n"w"nlxpwr"rxwjll±"jlö2Jnny wn±"ju wn"íx"t-±–n "qn jkxén rwox"vj"rxw ox" "qn l ų —r l j "rx w x o S x "x " rv j prwj "ö , S  $\,$  Q2Vx –r "rén "np "n—rx w r-xk"jrwnmj--qxíwrw p2,2 'r"qrw"n"lny"xox25jwm ""jrwrwp "j"n xo 42=55=7 í qrlq -qxí un— éj"rj"rxw0 n lų —r lį "rxwl ±"én į wmw±v kn" xor"n" į "rxw0" gn w±v kn" xo r"n"j "rxw r– v ±l q qrpqn" "qj w "qn w±v kn" xo ""rj u+0 ox" 64444 r"n"j "rxw-0"qn "rv n "j t nw í j – 5=– í qrl q r– nz  $\pm$ j u"x 42=9-α" njlq r"n"j "rxw0í qrlq -qxí nm"qj" "qn v n"qxmrgi –"0"qn kn–" ""j rwrwp yn"ox "v j wl n r–j " 424864: : j " nyxl q 5=<: 5 -qxíw rw Lrp2 90 "qn kn-" yn "ox "v jwln r- j" 424459==< j "nyxl q 67 í qrl q r-"qn kn-"l xw" "xurwp xí xo nj"j jwm jéxmrwp xén" rwp jwm v rwrv rürwp "qn ux—2 L"xv "qn Lrp2: 2 n éj umj "rxw n""x" í j – ün"x j" 64444 r"n"j "rxw-0"qr-v nj w-"qn v x mu ±-nm r- í x"t rwp yn"anl "vö ox"lų —r lj"rxwS x"x" rv j prwj"ö, S O2

### 5. CONCLUSION

Ov "qr-í x"t 0j w j yy "x j l q "x l ų —roö v x"x" rv j pn"ö , S O KKM —rpwj u-  $\pm$ -rwp j mnny wn±"j u wn"í x"t ,J TT-í r"q I YV onj "±"n nó" j l "rx wí r"q —"j wnj "mp" j mnw" mn-l nw" , MJ - v n"qx m j wn p"j mnw" mn-l nw" v n"qx m í r"q v xv nw" $\pm$ v j wm j nj y "rén RX , MJ S RX- qj - knnw y "xyx-nm2"qn l ų —r l j "rx w j l l  $\pm$ "j l ö í j -  $\alpha$   $\pm$ wm"x kn <; ) í q l q r-j w 55) rv y "x énv nw"2

Ov o±"±"n í x"t 0í n yų w "x ±-n v x"n "nl nw" onj "±"n nó""j l "rxw j wm lų -r lj "rxw v n"qxm- -±l q j - -yrt rwp wn±"j u wn"í x"t 0 sxrw" "rv n oʻnz ±nwl öl-yj l n lų -r lj "rxw j wm rv y "x én "qr-"nl qwrz ±n "x ménuxy j v xmnu kj -nm xw HI Olų -r lj "rxw"j -t -2

## AUTHOR INFORMATION

#### I x ""n-y x wm wp G±"qx"

. Kv jru@-jq-juv jqv jmF pv jru1/2 xv

## UXI () 📵

#### REFERENCES

- dSf a ± Lj wpüqx±0c qx± 'nmx wp0c qnw b nrw0b±j w Wr2 I yj —r lj "rxwxov x"x" rv j pn"ö"j -t -ox" nunl ""xl x ""rl l xp"j v kj –nmk"j rwll xv y±"n" rw"n"gl n2 Hxv nmd j u Kwprwnn"rwp Rn n"–26458A8, 6-
- d6f Rx n L0 I xwpnmx S 0 R l±ön" G0 Rj v j "l qn L0 G"wj um H2 G "némí xol ų —r lj"rxw j ųpx"r"qv ox" KKMlkj –nm k"j rw l xv y±"n" rw"n" gl n–2 *Br±"wj u xo T n±"j uKwprwnn"rwp2*644; A8, 6-
- d7f Rnn Yn±wp lHx0Qrv Nö±wlHt0Qrv Nj t -n±wp0Hxwp lt lNxxw0 Rnn Ynxwp1' qj w0 Qrv J xwplRx2 I xv yj "j "rén j wj uö-r-xoanj "±"n-no""j l "nmo"xv KKM -yj "rj u0-ynl ""j uj wm"nv yx"j unxv j rw-ax" krwj "ö j wm v ±u"rl uj --v x "x" rv j pn"ö l uj --r l j "rxw2 Ovx "v j "rxw Yl mwl n-2645=A946
- d8f Qj "x S j-j t r0 Qj wx pj Y±p±"±0 Nx-qrwx Z j t j ö±t r0 L±t j v r Z j nj wx "r2 S x "x " Ø j pn"ö I yi —r l j "rx w x o Lrwpn" S x "rx w- [ -rwp S ± u"d yi I YV2 6464 86 wm Gww±j u Øv"n"wj "rx wj u I x wm"nwl n x o "qn ØKKK Kwprwnn"rwp rw S nml rwn \* Hx ux pö Yx l m"ö , KS HI 264642
- d9f Rux"nuj Lj krx X2) Vj"xí M±-"j éx0 Güx" w Bx- S 2 I xwéxu±"rxwj u wn±"j u wn"í x"t- j wm pnwn"d j upx"r"qv ox" ér-±j u rv j pn"ö l uj --r l j"rxw2 Vqö-d j u j wnKwprwnn"rwp Yl mwl n-rwS nml rwn26464A87,7-
- d: f J xwp Kwiinwp0 c qx± Qj r"±r0 Zxwp Prpj wp0 J ± Yqnwpiiqr2 G wxénu qök" m t n"wnu o±wl" rxw "nunéj wl nénl" x" v j l qrwn ox" v ±u" rl"j -t v x"x" rv j pn"ö KKM l ų -r l j" rxw2 Hrxv nnnl j u Yrpwj u V"xl n—rwp j wm I xw" xu26464A: 4
- d; f Wrw Rnr0 Nn Hrw2 G í jénun"lkj -nm "rv n o"nz ±nwl ö j wj uö-r-j yy"x j l q ox" l uj --r l j "rx w x ov x "x" rv j pn"ö ox" k"j rw l xv y ±"n" rw"n"g l n j yyul j "rx w-2 Px ± "wj u x o T n±"j u Kwprwnn"rwp26449 A6, 8-
- d<f R± Tj 0Rr Znwponr0Xnw a rj xmxwp0S rj x Nxwpö±2G J nny Rnj "wwp Yl qnv n α " S x"x " Ø j pn"ö I ų —r lj"rxw kj –nm xw Xn–""rl"nm Hxu"üv j ww S j l qrwn–2*0KKZ "j w-j l"rxw–xw T n±"j uYö–"nv –j wm Xnqj knr"j "rxw Kwprwnn"rwp2*645; A69, : -
- d=f N-± 'nrlb nw2 KKMlkj -nm v x "x 'rv j pn"ö l ų -r l j "rx w ±-rwp wn±"x lo±üüö y "nml "rx w j wm í j énun" o"j l "j u onj "±"n-2 *Px±"wj u xo Tn±"x-l mwl n S n"qxm-2*6454A5<=, 6-
- dS4f R± T j 0 Rr Znwpan0 Vj w Pwsrw0 Xnw a rj x nx wp0 Lnwp c±"nw0 S rj x Nxwpö±2 Y\*\*±1"±"n l xw-\*\*\*j rwnm -nv rlwx wwnpj "rén v j ""ró g l "x "rij "rx w ox " KKMlkj -nm v x "x " rv j pn" ö l tj —r l j "rx w2 I x v y±"n"– rw Hix ux pö j wmS nnd rwn26459 A 4
- dSSf Qį w" Vrö±-q0 Rj -tj" Yqj qnm±u Nj z±n0 Nj ij "ttj P±yr"j "j 0 S j qj v ±wn X±yn-q2 I 'Z Hj -nm Z"j w-on" Rnj "wrwp  $\alpha$ " S x"x"  $\Theta$  j pn"ö I tj -r lj "rxw  $\alpha$ " H"j rw l xv y±"n"  $\Theta$ "n"gl n-2 Bx±"wj u xo Tn±"x-l mwl n S n"qxm-26464A789
- d56f PJ wj Mkyj u I qj wnij 0 Yi nij yj mv j Gunnwj 0 Vj wj rt V"j -j w" Q±v j "2Kwqj wl rwp "qn yn "αx"v j wl n x ov x"x" rv j pn"ö l uj -r l j "rxw "x mn-rpw j "xk±-" k"j rw l xv y±"n" rw"n "gl n ±-rwp αnnm αx"i j "m kjl t l y"xyj pj "rxw wn±"j uwn"i x"t 2 Grw Yqj v Kwprwnn "rwp Px±"wj u2645<A=, 8-

- dS8f Vo±""-l qnun" M2) H"±wwn" I 2) Yl qu pu G2) Rxyn- nj Ynéj L2N2S ± "qö"qv , mr--öwl q"xwiij" xwj wmKKM -rwpunl""rj u l  $\dot{y}$  —r l j "rxw xo mr n"nw" v x"x" rv j pn"ö "j -t -2Tn±"x0j pn2644: A75, 5-
- dS9f Xjqvjw S m2 G-j m±"0 [ mmw S xqjvvjm Yqx"rd0 Gqvjm S xqr±mmw2 S xmmwp jwm lų -r lj"rxw xo éxu±w"j"ö jwm rvjpn"ö v xénv nw"- \alpha" k"jrw lxvy±"n" rw"n"gln öxv of OX jwm KKM -rpwju-"q"x±pq lxwéxu±"rxwju wn±"ju wn"i x"t 2 Nnju"q Ova "vj"rxw Ylmwl nj wm Yö-"nv -2645=A;,5-
- dS: f I qx Nxqö±w0 Gqw S rwt ö±0 Gqw Yj wp"j n0 Qí xw S xxwöx±wp0P±wY±wp I qj w2KKMmj"j -n"- α" v x"x" rv j pn"ö k"j rw l xv y±"n" rw"n"gl n2 *Mtpj Yl mwl n2* 645; A: , ; -
- dS; f bj v jí j t r T 20' nt n I 20Rr± c 20Nn H22Gw Kwqj wl nm Zrv nIL"nz±nwl öIYyj" ju Gyy"xjl q α" S x"x" O j pn"ö I ų —r l j"rxw2 OKKK Z"j w-j l"rxw-xw T n±"j u Yö–"nv – j wm Xnqj knu"j"rxw Kwprwnn"rwp2 644: A 58 , 6-
- dS<f Zjwp a rjwu±w0 Rr 'nr0 Rr a rwpl qnw0 Sj'nrl qjwp0 Jjwp a rjxö±jw2 Sx"x"rv jpn"ö KKM "nl xpwr"rxw kj –nm xw l xwmr"rxwj u xy"rv rij "rxw nv yr"rl ju v xm ml xv yx–r"rxw j wm v ±u"rl-l ju l xwéxu±"rxwj u wn±"ju wn"i x"t 2 Kóyn"" Yö–"nv í r"q Gyyul j"rxw–2 6464A 58=
- dS=f R± T j 0b rw Z j x 0 Pwp a ±n2 G Z nv yx "j uI xwéx u±"rxw T n"i x"t Yxu±"rxw αx" KKM S x"x" Ø j pn"ö I uj —r l j "rxw2 645= OKKK 5="q Ov"n"wj "rxwj u I xwon"nwl n xw Hixrwox "v j "rl j wm Hixrworm"rwp , HOHK-2645=2
- d64f Vj "éj w S nj m0Mqrj -r Gv r" Xrt q" nqpj "0Xnüj rr Zx qrm bx±-n 0 Lj "üj v wij Gu² Z" j w-an" Rnj "wrwp kj -nm S x" x" Ø j pn"ö I uj -r lj" rxw ±-rwp I xwéx u±" rxwj u T n±" j u T n" i x"t -2*645= 6; " q Oj wij w I xwan" nwl n xw Kunl" "d j uKwprwnn" rwp , O KK-2*645=2
- d65f ' jwp Q±w0 a ± S rwynwp0 c qj wp Yqj w-qj w0 Qn b ±anwp0 S rwp J xwp2 Gwj uö-r- j wm I uj --r lj "rxw ac" KKM Vj n"w- xo Lx"ln S x"x" Ø jpn"ö [ -rwp S xénv nw" Xnuj "nm I x""d j u Vx"nw"rj u-2 645< 84"q Gww±j u Øv"n"wj "rxwj u I xwan"nwl n xo "qn ØKKK Kwprwnn"rwp rw S nmd rwn j wm Hrxuxpö Yxl m"ö , KS HI 2645<2
- d66f ' jwp Mjwö±0 S j ""rw S rp±nt0 N±wp Vj ""rl t 0 S j l J xwj um Yqjwn2 Zxí j "m- I tj —rcörwp S x"x" O j pn"ö [ -rwp j I xw-±v n"lM"j rm H"j rwll xv y±"n" Ov"n"g l n2 645= OKKK Ov"n"wj "zxwj u I xwan"nwl n xw I xpwr"rén I xv y±"rwp, O I I 2645=2
- d67f J j uö @w0Xökj "S nj w2Tn±"j ul xv yxwnw" j wj uö-r-@
  -x±"l n uxl j ur-j "rxw ox "v x"x "rv j pn"ö
  l uj —r l j "rxw26464 86wm Gww±j u Ov"n"wj "rxwj u
  I xwon"nwl n xo"qn OKKK Kwprwnn"rwp rw S nml rwn \*
  Haxuxpö Yxl m"ö, KS HI 264642
- d68f I] gʻʻrgʻʻv j wm Gö-j 0Hj mj v l qrüj mnq S xqj v v j m Gu2 Xnj ul'rv n v ±u'rl uj — v x''x" rv j pn"ö k"j rwll xv y±'n" rw'n"qʻl n kö v xmr nml xv v xw -yj 'rj u yj n"w- j wm

- j mj y "rén wn±" x lo±üüö 1 uj —r n"2*Hx v nml j u Yrpwj u V"x1 n—rwp j wm1 x w"" x w*6464A9;
- d69f ] r"prux M2I j "ux J 20Yx j G2P±j w N20Gw"nur I) ém"
  S 20Lj d w R±r K22Yyrt rwp T n±"j uT n"í x "t j yyumm
  "x "qn l uj r l j "rxw xo v x"x" "j t rw KKM
   rpwj u-2*T n±"j uT n"í x "t 2*6464A566
- d6: R±x Pwp0Mj x a rwp0c q± a rj xkm0' j wp Hrw0R± T j 0
  ' j wp Pm2 S x"x" rv j pn"ö KKM l uj —r l j "rxw kj –nm
  xw nw–nv km –±yyx"" énl "x" unj "wrwp2I xv y±"n"
  S n"qxm-j wmV"xp"j v –rwHxv nml rwn26464AS=7
- d6; f J rwp Yqron0 c qj wp T j w0 a ± a rwüqnwp0 M±x Rru0 c qj wp Itj w2J nny K6""nv n Rnj "wrwp S j l qrwn j wmO–Gyyul j "rxw rw KKM I ų —r l j "rxw2S j "qnv j "h j u V"xkuv –rwKwprwnn"rwp26459A6459
- d6<f S j Znwp0Rr N±r0b j wp Nj x0Ré a ±urw0Rr Vnröj wp0 Rr± Zms±w0b j x J nüqxwp0 a ± Vnwp2 n nó\*"j l "rxw xo v x "rxwlxw-n" ] KV Hl Oonj "±"n– kj -nm xw mmy unj "wrwp j wm l xv y "n—nm -nw-rwp2*Px±"wj u xo Tn±"x-l mwl n S n"qxm-2*645; A6; 9
- d6=f Qí j t Tx 1Yj wp0 S un" Qý ±-IXxkn""0 Rnn Ynxwp1 ' qj w2 G l xwéx u±"rx wj u wn±"j u wn"í x"t ox" –"nj mö –"j "n ér-±j u néxt nm yx"nw"rj u l ý –r l j "rxw ±wm" j v k±ų "x"ö nwér"x wn w"2 VRUY UT K2645; A56, 6-
- d74f I nl x r N0 M"j-n" G2 I xwéxut" ixwju Tn±"ju Tn"í x"t ox" V744 J n"nl" ixw í r"q Gyyutlj" ixw "x H"j rwlI xv y t"n" Ov"n" oʻl n–2 OKKK Z"j w-j l" ixw-xw Vj n"w Gwj vö-r-j wmS j l qrwn Ov" nurpnwl n26455A77,7-
- d75f Yl qr"v nr-"n" Xxkrw Zrkx"0 Yy"rwpnwkn"p Px-"
  Zxkrj -0Lmnm"n" R±t j J xv rwrz±n Px-nd0Mij —"n n"
  S j ""rw0 Kppnw-yn"pn" Qj "qj "rwj 0 Zj wpn"v j ww
  S rl qj nu0 N± n" L"j wt 0 H±"pj "m ' xu"j v 0 Hj uz
  Zxwrx2 J nny unj "wrwp í r"q l xwéx u±"rxwj u wn±"j u
  wn"í x"t α" KKM ml xmwp j wm
  ér-±j urij"rxw2N±v j wH"j rwS j yyrwp2645; A7<, 55-
- d76f Y"±"v Oʻnwn0 Rjy±-lqtrw Ynkj-"rjw0 Yjvnt 'xslmlq0S un" Qij±-lXxkn""2 Ov"n"y"n"jkun mmy wn±"ju wn"i x"t- ox" -rwpun1""rju KKM lij--r lj1 "rxw2Rx±"wjuxoTn±"x-lmwlnS n"qxm-2645: A6; 8
- d77f Zjkj" bx±–no Xnüj nr0 Njul r [p±"2 G wxénu mmy unj "wrwp jyy" xjl q ox" luj—r lj" rxw xo KKM v x" x" rv jpn"ö –rpwj u+2*Px±"wj u xo Tn±"j u Kwprwnn"1 rwp2* 645: AS8, 5-
- d78f brw cqxwp0 cqjwp Ptjwq±j2 I "x—1-n—rxw lųj—r lj"rxw xov nw"ju í x"tuxjm unénu-±-rwp KKM jwm jw jnjy"rén mnny unj"wrwp v xmm2.Hxv nmlju YrpwjuV"xln—rwp jwml xw""xu2645; A77
- d79f brwc qxwp0c qj x S nwpö±j w0′j wp bxwpórxwp0bj wp Prwpnxwp0 c qj wp Prj wq±j 2 Xnl xpwr"rxw x o nv x"rxw-±-rwp v ±u"rv xnj u yqö-rxuxprl j u -rpwj u- j wm j w nw-nv kun mnny unj "wrwp v xmmu2*l xv y±"n" S n"qxm-j wmV"xp"j v -rwHix v nml rwn2*645; AS84
- d7: f ' ± J xwp"±r0 a ± broj w0 R± Hj x IRrj wp2 Z"j w-on"
  Rnj "wrwp ox" KKMIHj -nm H"j rwII xv y±"n"
  Ov"n"oj l n-@ G Xnémí xo V"xp"n— S j mn Yrwl n
  645: 2 OKKK Z"j w-j l "rxw- xw I xpwr"rén j wm
  J nénuxyv nw"j uYö-"nv -264642
- d7; f Gwa r±0Q±j wp J nyrwp0M±x a rj x srj x 0c qj x b ru±0Nn Rrj wpq±j 2 G J nny Rnj "wrwp S n"qxm ox" I tj —r l j "rxw x 0 KKM J j "j Hj —nm xw S x"x"

- Oʻjpn"ö2*Oll"nurpnw" I xv y±"rwp rw Hxrwox"v j"I* rl –264582
- d7<f J jr S nwpór0 c qnwp J nüqr0 Tj X±r0 ' jwp Yq±jr0 c qj wp Yq±jrur2 KKM I ų —r l j "rxw xo S x"x" O j pn"ö [ -rwp j T xénu J nny Rnj "wrwp L"j v ní x"t 2*Ynw-x" -2*645=AS=, 7-
- d7=f S j smxé  $\mathfrak{G}\mathfrak{q}$ "röx"0 ' qj wpkx Zj npt n±w2 K l mw" I ų; —r l j "rxw xoS x"x"  $\mathfrak{Q}$  j pn"ö Kull ""x nwl ny qj uxpl "j yqö Yrpwj u- [ -rwp J nny Rnj "wrwp S n"qx m-2 Ynw-x"-2645=A5=, ; -
- d84f Qrv Vqrı2 S GZRGH J nny Rnj "wrwp1 r"q S j l qrwn Rnj "wrwp0 T n±"j u T n"i x"t – j wm G""r l rj u W"nurpnwl n2Gy"n—@Hn"t nunö0I GA645; 2
- d85f ' j w''x Gwsj "0 Gwnj wr Y±wnj "r Xn"wx0 Vxwrwp-rq Vxwrwp-rq0J ní r Xj z j 0R±kr-S ±qj v v j mXmí j w0 Yj y±""j ' mxnx0 Qt"j wj @j Ut "j 2 Gwj tö-r- x o Y"j wnj "m M"j mmw" J n-l nw" í r"q MJ S xv nw"±v j wm Gnj y"rén RX αx" YVX V"nml "rx w2*CT G1 Xóré 2*645<2
- d86f J rv xu"-j Yyr"x-0 Rr-"n" Vj ±u L2 ' j énox"v y"n-n"érwp nwl xm" ox" "qn l xv y"n--rxw xo KKM nj "j 2*Yrpwj uV"xl n--rwp2*5=<: A54, 8-



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