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Departamento de Informática e Ingeniería, Musaliar College of Engineering and Technology, Pathanamthitta, 689653, India

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7KH UHVHDUFK RQ WKH HGXFDWLRQDO ILHOG WKDW LQYROYHV 'DWD OLQLQJ WHFKQLTXHV LV UDSLGO \ LQFUHDVLQJ \$ SSO \ LQJ' DWD OLQLQJ WHFKQLTXHVLQDQ HGXFDWLRQDO EDFNJURXQG DUH NQRZQ DV(GXFDWLRQDO'DWDOLQLQJWKDWDLPVWR GLVFRYHU KLGGGHQ NQRZOHGJH DQG SDWWHUQV DERXW VWXGHQW¶V SHUIRUPDQFH 7KLV ZRUN DLPV WR GHYHORS VWXGHQW¶V DFDGHPLF SHUIRUPDQFH SUHGLFWLRQ PRGHO IRU WKH % DFKHORU DQG ODVWHU GHJUHH VWXGHQWV LQ & RPSXWHU 6FLHQFH DQG (OHFWURQLFV DQG & RPPXQLFDWLRQ VWUHDPV XVLQJ WZR VHOHFWHG FODVVLILFDWLRQ PHWKRGV 'HFLVLRQ 7UHH DQG)X]N "HQHWLF \$OJRULWKP 3DUDPHWHUV OLNH LQWHUQDO PDUNV VHVVLRQDO PDUNV DQG DGPLVVLRQ VFRUH ZHUH VHOHFWHG WR FRQGXFW WKLV ZRUN, QWHUQDO PDUNV DUH WKH FRPELQDWLRQ RI DWWHQGDQFH PDUNV DYHUDJH PDUNV REWDLQHG IURPWZRVHVVLRQDOH[DPVDQGDVVLJQPHQWPDUNV \$GPLVVLRQVFRUHIRUGHJUHHVWXGHQWVLVWKHZHLJKWHGVFRUHREWDLQHG IURP WKDQG WKH[DPLQDWLRQ PDUNV DQGHQWUDQFHPDUNV ,QWKHFDVHRIPDVWHU¶VGHJUHHVWXGHQWV LWLQFOXGHVGHJUHHH[DPLQDWLRQ PDUNVDQGHQWUDQFHPDUNV \$HVXXOWDQWSUHGLFWLRQPRGHOFDQEHXVHGWRLGHQWLI \ WXXGHQWIJVSHUIRUPDQFHIRUHDFKVXEMHFW 7KHUHE \ WKHOHFWXUHUVFDQFODVVLI \ VWXGHQWVDQGWDNHDQHDUO \ DFWLRQWRLPSURYHWKHLUSHUIRUPDQFH 6 \ VWHPDWLFDSSURDFKHVFDQEHWDNHQWR LPSURYHWKHSHUIRUPDQFHZLWKWLPH XHWRHDUO \ SUHGLFWLRQDQGVROXWLRQVDUHGRQH EHWWHUUHVXOWVFDQEHH [SHFWHGLQILQDOH [DPV 6WXGHQWVFDQ YLHZWKHLUDFDGHPLFLQIRUPDWK \$6SDWPH \$6HSXWHGFRPSDQLHV KDYLQJDWLH XSZLWKWKHLQDVWLWXWLRQFDQ VHDUFK

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& RUUHVSRQGLQJDXWKRU

Dirección de correo electrónico: hashmia.hamsa@gmail.com

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OHDUQLQJ LVVXHV VXFK DV SRVVLEOH ODFN RI PRWLYDWLRQ DQG GLIILFXOWLHV IRU WKH HGXFDWRUV WR FROOHFW GLUHFW IHHGEDFN

UHJDUGLQJ WKH PRRG OHYHO RI LQWHUHVW RU HYHQ WKH XQGHUVWDQGLQJ RI WKH VWXGHQWV DIWHU DOO WKH SROLWLFDO FRQFHUQV

FRXQWULHV DUH JHWWLQJ D VXSHULRU XQGHUVWDQGLQJ RI WKH VLJQLILFDQFH RI KLJKHU HGXFDWLRQ LQ WKHLU GHYHORSPHQW DQG

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 $7KH\ UHVW\ RI\ WKH\ WH\ [W\ LV\ RUGHUHG\ DV\ IROORZV\ VHFWLRQ\ ,,\ SUHVHQWEDFNJURXQG\ VWXG\ \)\ DQG\ UHODWHG\ ZRUN\ VHFWLRQ\ ,,\\ SUHVHQWWKHGDWDVHWVDQGSUHSDUDWLRQ\ WKHSURSRVHGGDWDPLQLQJPRGHOLVSUHVHQWHGLQVHFWLRQ,9\ VHFWLRQ9GHVFULEH\ WKHH[SHULPHQWDOVHWXS\ UHVXOWVDQGDQDO\VLVDUHSUHVHQWHGLQVHFWLRQ9,\ ILQDOO\ WKHFRQFOXVLRQV$

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7KH VWXG \ LQ> @ LGHQWLILHVWKDW% D \ HV FODVVLILHU SHUIRUPDQFH UHVXOW ZDV GHFUHDVHG E \ DGGLQJ PRUH DFDGHPLF
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EHLOFUHDVHG 5HODWHGVWXGLHVDUH

2.1. Métodos de clasificación

, QDFODVVLILFDWLRQWDVN WKHREMHFWLYHLVWRDVVLJQDSUHGHILQHGODEHORUFODVVWRDUHFRUGEDVHGRQDVHWRINQRZQ DWWLEXWHV \$ QLPSRUWDQW IHDWXUH RI D FODVVLILFDWLRQPRGHOLVWKDWLWLV EXLOW E \$ SDUW RIWKH GDWD DOVR NQRZQ DVWKH WUDLQLQJ VHW ZKLFKLVXVHGWRWUDLQWKHPRGHO \$OOWKHDWWULEXWHVLQWKH VXEVHWDUHNQRZQ HYHQWKHFODVV \$IWHUWKH PRGHOLVEXLOW LWLVXVHGWRDVVLJQWKHODEHOWRQHZUHFRUGVZKHUHWKHFODVVDWWULEXWHLVXQNQRZQ 7REXLOGWKHPRGHOV WZRHFFKQLTXHVDUHXVHG '7DQG)*\$

\$"7LVDUHSUHVHQWDWLRQPDGHRIQRGHVDQGDUFVZKHUHDQLQWHUQDOQRGHSUHVHQWDGHFLVLRQEDVHGRQDWWULEXWH
YDOXHVDQGWKHDUFVVWDQGIRUWKHRSWLRQPDGHLQWKHQRGH, WHQGVRQDOHDIQRGH ZKLFKUHSUHVHQWVWKHODEHORUWKH
FODVVWREHDVVLJQHG 7RFDWHJRULJHDUHFRUGZLWK'7 LWVWDUWVIURPWKHURRWQRGHDQGJRHVRQHOHYHOGRZQDWDWLPH
WKDWGHSHQGVRQWKHUHVXOWVRIWKHFRQGLWLRQWHVWHGRQHYHU\QRGH ZKHQLWHQGVRQDOHDIQRGH WKHUHFRUGLVFODVVLILHG
DFFRUGLQJWRWKHODEHORQWKHOHDIQRGH 7KHNQRZOHGJHUHSUHVHQWHGE\"7EHH[WUDFWHGDQGSUHVHQWHGLQWKHIRUPRI
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)X]]VRJLF)/DGGUHVVHVDSSOLFDWLRQVWKDW UHVHPEOH KXPDQ GHFLVLRQPDNLQJZLWKD VNLOOWR JHQHUDWHH[DFW VROXWLRQV IURP FHUWDLQ RU DSSUR [LPDWH LQIRUPDWLRQ 7KH XVH RI) / EDVHG WHFKQLTXHV LV IRU HLWKHU LPSURYLQJ * \$
EHKDYLRXURUPRGHOOLQJ * \$ FRPSRQHQWV WKHUHVXOWVREWDLQHGKDYHEHHQFDOOHG) * \$ \$ IX]] \ ILWQHVVILQGLQJ))))
PHFKDQLVPJXLGHVWKH*\$WKURXJKVHDUFKVSDFHE\FRPELQLQJYDULRXVFULWHULD IHDWXUHVWKDWKDYHEHHQLGHQWLILHGDV

JRYHUQLQJIDFWRUVIRUWKHIRUPDWLRQRIWKHFOXVWHUV

2.2. Predicción del Rendimiento Académico

\$FDGHPLF UHFRUGVDQGLQLWLDODFDGHPLFLQIRUPDWLRQ¶VDUHXVHG IRUSUHGLFWLRQ > @ ,QLWLDODFDGHPLFLQIRUPDWLRQ LQFOXGHV WHQWK WZHOIWK HQWUDQFH H [DPLQDWLRQ PDUNV DQG GHJUHH DQG HQWUDQFH PDUNV IRU PDVWHU GHJUHH VWXGHQWV : HLJKWDJH LV JLYHQ IRU HDFK SDUDPHWHU LQ WKUHH FDWHJRULHV OLNH HLJKW IRU PDUNV DQG DERYH ILYH IRU PDUNV LQ EHWZHHQ DQG IRUPDUNV DQG EHORZ 7KHWRWDO RIZHLJKWLV FDOFXODWHG DQGWHUPHG DV DGPLVVLRQ VFRUH \$FDGHPLF UHFRUGVLQFOXGHDWWHQGDQFH WZRVHVVLRQDOPDUNV DVVLJQPHQWPDUNVDQGLQWHUQDOPDUNV ,QWHUQDOPDUND FRPELQDWLRQ RI DYHUDJH PDUNV REWDLQHG IURP WZR VHVVLRQDO H [DPV DVVLJQPHQW PDUNV DQG DWWHQGDQFH) URP SUHGLFWLRQ VWXGHQWVDWULVNDQGQRW DVLQ> @ WRSDVVDVXEMHFWDUHLGHQWLILHG 7KHUHVXOWVZLOODVVLVWWKHHGXFDWLRQDO LQVWLWXWLRQVWRLPSURYHWKHH[FHOOHQFHRIWHDFKLQJDIWHUHYDOXDWLQJWKHPDUNVVFRUHGE\WKHVWXGHQWVLQDQDFDGHPLF \ HDU 6WXGHQW¶VH [SHUWDUHDFDQEHDGGHGE \ OHFWXUHUV KHOSVFRPSDQLHVIRUUHFUXLWPHQW

'DWD6HWDQG3UHSDUDWLRQ

'DWD VHW LV WKH ZKROH GDWD XVHG IRU PLQLQJ 5HOHYDQW GDWD IRU SUHGLFWLRQ LV FROOHFWHG WKURXJK VFKHGXOHV OLNH
DGPLVVLRQWLPH GDLO\DWWHQGDQFH DVVLJQPHQWVXEPLVVLRQWLPH H[DPLQDWLRQFRQGXFWLQJE\DOHFWXUHUDWVFKHGXOHG
WLPH +HUH LW LQFOXGHV DQG VWXGHQWV IURP EDFKHORU DQG PDVWHU GHJUHH SURJUDP UHVSHFWLYHO\\$PRQJ
VWXGHQWVLWLQFOXGHVWZREDWFKHVRI VWXGHQWVIURPGHJUHHFRPSXWHUVFLHQFHGHSDUWPHQWDQGDQRWKHUWZREDWFKHVRI
VWXGHQWV IURP GHJUHH HOHFWURQLFV DQG FRPPXQLFDWLRQ GHSDUWPHQW /LNHZLVH WZR EDWFKHV RI VWXGHQWV IURP
PDVWHU¶VFRPSXWHUVFLHQFHDQGWZREDWFKHVRI VWXGHQWVIURPPDVWHU¶VHOHFWURQLFVDQGFRPPXQLFDWLRQGHSDUWPHQW
DUHWKHRWKHUGDWDVHW 7KHGDWDVHWXVHGIRUOHDUQLQJLVFDOOHGWUDLQLQJVHWDQGGDWDVHWXVHGIRUWHVWLQJLVFDOOHGWKHWHVW
VHW 6WUDWLILHGVDPSOLQJLVXVHGWRJHWWKHWUDLQLQJVHWDQGGKHUHPDLQLQJLVXVHGIRUWHVWLQJ

)RUPLQLQJSXUSRVH WKHUHOHYDQWDWWULEXWHVDVLQ> @DUHDGPLVVLRQVFRUH DYHUDJHIRUWZRVHVVLRQDOPDUNVDQG
LQWHUQDOPDUNV 3UHGLFWLRQLVQRWSRVVLEOHLIVWXGHQWGHWDLOVDUHQRWHQWHUHGRUQRWYDOLG)ROORZLQJWDEOHVVKRZVWKH
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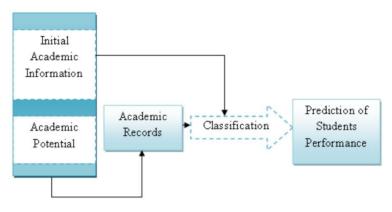
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	/ VKRZV WKH GDWDVHW IRU SUHGLFWLQJ VHFRQG \ HDU ELJ GDWD UHVXOW IRU H
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	5ROO1R, QWHUQDO 6HVVLRQDO \$ GP6FRUH

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(ISHULPHQWDO6HWXS

'7DQG)*\$DUHXVHGIRULPSOHPHQWDWLRQ 7KHDWWULEXWHVHWXVHGIRUERWKDOJRULWKPVDUHVDPH LQWHUQDOPDUNV
VHVVLRQPDUNVDQG DGPLVVLRQ VFRUH 6HVVLRQPDUNV DUH FRQVLGHUHG VHSDUDWHO \ EHFDXVH QRWWR DYRLGWKH FKDQFH IRU
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WKHDQJRULWKPLVDVIRQORZV

de 'HFLVLRQWUHHLVDFODVVLILHUUHVHPEOHVDWUHHVWUXFWXUH

'HFLVLRQ QRGH GHQRWH D WHVW RQ D VLQJOH DWWULEXWH / HDI QRGH VSHFLI \ WKH YDOXH RI WKH WDUJHW DWWULEXWH %UDQFK VSOLWRIDWWULEXWH 3DWK DGLVMXQFWLRQRIWHVWWRPDNHWKHILQDOGHFLVLRQ

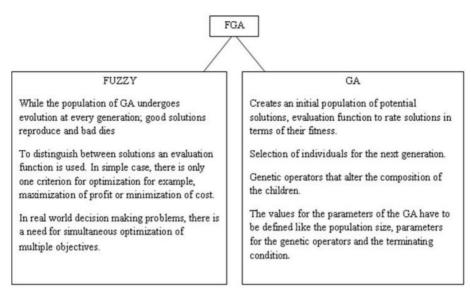
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)RU WKH ZRUNLQJ RI GHFLVLRQ WUHH ' WKH GDWD SDUWLWLRQ DWWULEXWHBOLVW VHW RI VHOHFWHG DWWULEXWHV DQG

DWWULEXWHBVHOHFWLRQBPHWKRG DUH UHTXLUHG DV LQSXW \$ WWULEXWHBVHOHFWLRQBPHWKRG LV D SURFHGXUH WR GHWHUPLQH WKH
VSOLWWLQJ FULWHULRQ WKDW ³EHVW' SDUWLWLRQV WKH GDWD WXSOHV LQWR VHSDUDWH FODVVHV 7KLV FULWHULRQ FRQVLVWV RI D
VSOLWWLQJBDWWULEXWH HLWKHUDVSOLWSRLQWRUVSOLWWLQJVXEVHW

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UHPDLQLQJ DWWULEXWHV WR SDUWLWLRQ WKH WXSOHV RU QR WXSOHV IRU D JLYHQ EUDQFK LV WUXH WKH UHFXUVLYH SDUWLWLRQLQJ LV
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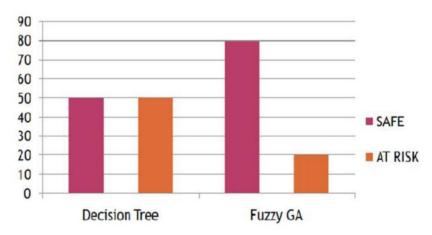
 $7 \text{KH}) \text{`$LQ} > \text{@KDVWZRFRPSXWDWLRQDOHOHPHQWVWKDWZRUNWRJHWKHU 7KHHQHWLFOJRULWKP $^DQG)X]}. \\ \text{) LWQHVV) LQGHU))) 7 \text{KHZRUNLQJLVVKRZQLQ) LJXUH} \\$



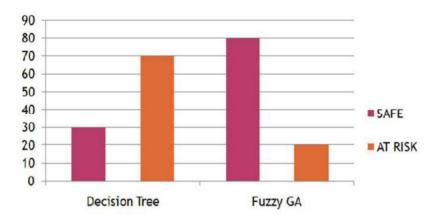
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,Q7 SUHGHILQHGVWULFWGHFLVLRQVDUHIROORZHG VRVWXGHQWVDWWKHEDUULHURIVXFFHVVZLOOEHLGHQWLILHGDVDWULVN 6RLQOHFWXUHU¶VSRLQWRIYLHZ DYHUDJH OHYHOVWXGHQWVZLOODOVREHXQGHUWKHFDUHRIH[SHUWV 6RLQWKHILQDOH[DPV D JRRGUHVXOWFDQEHH[SHFWHG ,Q)*\$ DVWXGHQWKDYLQJDORZVFRUHLQVRPHDWWULEXWHV KDYHDFKDQFHWREHDWVDIHGXH WKHKLJKVFRUHDWWDLQHGIURPRWKHUDWWULEXWHVZKLFKPDNHVWXGHQWVFRPIRUWDEOH \$ORQJWKHJUDSK WKHOLVWRIVWXGHQWV DQGWKHLUVWDWXVZLOOEHGLVSOD\HG &RPSDQLHVFDQVHDUFKVWXGHQWVDFFRUGLQJWRWKHLUUHTXLUHPHQWDQGWKHOLVWRIVDIH VWXGHQWVZKRDUH H[SHUWLQWKHLU ILHOGZLOO EH GLVSOD\HG)ROORZLQJ)LJXUH DQG)LJXUH DUHWKH UHVXOWLQJ JUDSKV REWDLQHGDIWHUDSSO\LQJ'7DOJRULWKPDQG)*\$IRUVXEMHFW¶VPDWKHPDWLFVDQGELJGDWDIRUEDFKHORU¶VDQGPDVWHU¶V GHJUHHUHVSHFWLYHO\



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PHQWDO VDWLVIDFWLRQ% XW WKH OHFWXUHUV ZLOO WDNH DWWHQWLRQ RQ WKHP LQGLUHFWO\6R D IULHQGO\HQYLURQPHQW ZLOO EH
FUHDWHGLQ EHWZHHQOHFWXUHUVDQGVWXGHQWV \$OVRH[SHUW VWXGHQWVZLOO EH UHFUXLWHG E\ UHSXWHGFRPSDQLHVWKDWPDNH
VWXGHQW¶VIXWXUHVHFXUH 6WXGHQW¶VHDUO\UHFUXLWPHQWWRFRPSDQLHVEULQJVERWKWKHLQVWLWXWLRQDQGVWXGHQWVWRSUHVWLJH

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> @ 5DPHVK 9 3DUNDYL 3 &RPSXWHU\$SSOLFD\		

> @ 4XLQODQ - 5 , QGXFWLRQRIGHFLVLRQWUHHV 0DFKLQHOHDUQLQJ

@ /DNVKPL 7 0 0DUWLQ \$ 9HQNDWHVDQ 9 3 &RPSXWHU6FLHQFHVDQG\$SSOLFDWLRQV $\ Q\ QDO\ \ VLV\ RI\ 6WXGHQWV\ 3HUIRUPDQFH\ 8VLQJ\ ^*\ HQHWLF\ $\ OJRULWKP\ -RXUQDO\ RI\$