



\$UFKLWHFWXUDO (QJLQHHLQJ 7HFKQRORJ)

%HOODNDRXW \$ HW DO - \$UFKLW
KWWS G[GRL RUJ

5HYLHZ \$UWLFOH 2SHQ \$F

Automatic Segmentation of Lidar Data

\$EGHOPRXQDLP %HOKHNDNRXW 2PDUL Q(RKWDPPHG 0RQDPPHFXJDQL \$EGHUUDKPDQH
(QJLQHHLU 6XUYH\RU 7HFKQLFDO 'LUHFWRU 6(/%\$723 0RURFFR
\$JURQRPLF DQG 9HWHULQDU\ ,QVWLWXWH +DVVDQ ,, 0RURFFR
&RUUWHYGRVRLGWQWID#VF0R#33D€ À À ÀpAd9hwfTMTM€ P€`pPÀ`p€p0€`€ð0pÀ`pPÀ€pÀ ð0@ p0P€0P p€`pÀ 0À 0@

\$EVWUDFW
7RSRJUDSKLFDQ WHFKQRORJ\ E\ \$LUERUQH /,'\$5 /LJKW 'HWHFWLRQ DQG 5DQJLQ
ZLWK D GHQVLW\ RI VHYHUDO SRLQWV SHU VTXDUH PHWHU /,'\$5 GDWD SURFHVVLRQ
' LQIRUPDWLRQ LQ DXWRPDWLF ZD\ DQG HVSHFLDOO\ LQ XUEDQ DUHDV IURP /,'\$5
LQ FRPSXWHU YLVLHQ\ LW LV DOVR D QHFHVVDU\ VVHS IRU LPSOHPHQWDWLRQ RI
LQWHUSUHWDWLRQ RI /\$6(5 GDWD 7KHUHIRUH WKHUH LV UHFHQW\ DQ LQFUHDV
OLWHUDWXUH 7KH SUREOHPDWLF GLVFXVVHG LQ WKLV DUWLFOH OLHV LQ WKH GLI
D VSHFLILHG OD\HU RI LQIRUPDWLRQ FRQVWUXFWLRQ YHJHWDWLRQ URDGV OLQ
DLP RI WKLV VWXG\ LV WR SURYLGH D VHW RI DXWRPDWLF VHJPHQWDWLRQ WHFKQ
SURSRVHV D PHWKRGORJ\ WR FODVVL\ /,'\$5 GDWD ZLWK D PD[LQXP GHJUHH RI DX

.H\ZRUGV VHJPHQWDWLRQ /,'\$5 ' 3RLQW FORXG \$PHQPDWLRQ FDQ EH FRQGXFWHG
FDWHJRUL]HG RQ WKH EDVLV RI W\SH RI G
,QWURGXFWLRQ k 7KH ILUVW LV EDVHG RQ WKH SRLQW FO
)RU D ORQJ WLPH VFLHQWLWV DUH VWXG\LQJ PHWKRGV RI LQIRUPDWLRQ
ZHOOD DV WKHLU UHSUHVHQWDWLRQ 7KH DGYHFWRG, \$50DWWHPWRK 6VHLODZLHG
WKH FROOHFWLRQ RI D VLJQLILFDQW QXPEHU RI SRLQWV LQ WKUHH GLPHQVLRQV
D YHU\ VKRUW WLPH

/6(5 DLUERUQH V\VVHPV DUH DFWLYH VHQRUV WKDW LQFRUSRUDWH D
PHFKDQLVP IRU GLUHFV JHRUHIHUHQFLQJ FRXSOHG ,QHUWLDQ *36 OLJKW
SXOVHV HPLWWHG SURYLGLQJ D GHQVH ' SRLQW FORXG WKDW IDLWKIXOO\
UHSUHVHQWV WKH WRSRJUDSK\ VFDQQHG ZKLFK UHTXLUHV D FDUHIXO DQG
SRZHUIXO WUHDWPHQW

6HJPHQWDWLRQ RU DXWRPDWLF FODVVLILFDWLRQ RI ' /,'\$5 GDWD IURP
XUEDQ VFHQHV KDV D YHU\ LPSRUWDQW UROH LQ WKH VFLHQWLILF FRPPXQLW\
JLYHQ LWV LPSRUWDQFH IRU PRGHOLQJ DQ XUEDQ VFHQH DV LW FDQ
VLJQLILFDQWO\ UHGXFH WKH UHVXUFHV UHTXLUHG IRU GDWD DQDO\VLV DQG
PRGHOLQJ RI FLWLHV

3URFHVVLRQ /,'\$5 SRLQW FORXG LQ DQ DXWRPDWLF ZD\ E\ VSHFLDO
DOJRULWKPV SHUPLWV WR JHGHUDWH SODQV LQ DQ LQVWDQW ZD\

6WDWH RI WKH \$UW

7KH ILUVW UHVXOW RI SURFHVVLRQ /,'\$5 GDWD LV WKH VHJPHQWDWLRQ RI WKH
SRLQW FORXG LQWR WZR PDLQ FODVVHV JURXQG DQG DERYH JURXQG 7KL
VHJPHQWDWLRQ FDQ EH REWDLQHG E\ XVLQJ RWKHU VRXUFHV RI LQIRUPDWLRQ
VXFK DV ' FDGDVWUDO GDWD WKH VLJQDO LQWHQVLW\ RU MXVW EDVHG RQ WKH
GDWD ; < DQG =

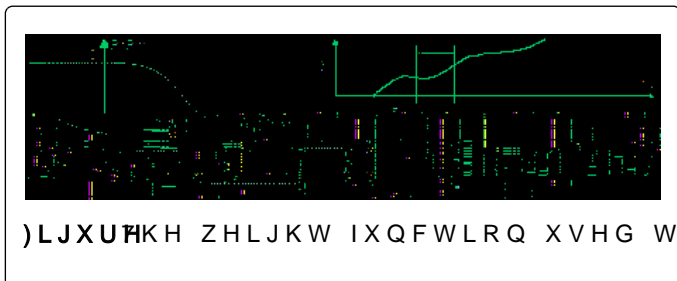
\$ JRRG VHJPHQWDWLRQ UHVXOW GRHV QRW QHFHVVDULO\ DOORZ D JRRG
VHJPHQWDWLRQ UHVXOW :H SURSRVH WKURXJK WKLV SDSHU D VWXG\ RI WKH
VWDWH RI WKH DUW RI GLIIHUHQW VHJPHQWDWLRQ PHWKRGV SURSRVHG LQ W
OLWHUDWXUH

7KLV PHWKRG ZDV SURSRVHG E\ :DQJ DQG 7VHQJ IRU /,'\$5 SRLQW
FORXG LWV SULQFLSOH LV ZKLFK LV WKH KLHUDUFKLFDO GHFRPSRVLWLRQ RI W
FORXG SRLQW RQ WKH RFWUHH VWUXFWXUH XQWLO WKH SRLQWV FRQWDLQH LQ
QRGH EHORQJ WR WKH VDPH SODQH WKH GLVDGYDQWDJH RI WKLV PHWKRG LV W
LV LV XQDEOH WR FODVVL\ WKHP > @

:H DOVR ILQG WKH DOJRULWKP SURSRVHG E\ .UDXV DQG 3IHLIHU WKDW XVHV
OLQH DU SUHGLFWLRQ > @ ,WV SULQFLSOH LV WKDW HDFK PHDVXUH KDV D JLY
DFFXUDF\ LW RSHUDWHV LWHUDWLYHO\ > @

,Q WKH ILUVW VWHS WKH VXUIDFH LV FDOFXODWHG ZLWK D PDWUL[ZHLJKW HTX
WR RQH WKLV LV DQ DYHJDJH VXUIDFH EHWZHHQ SRLQWV RQ WKH JURXQG DQG
DERYH JURXQG ZKLFK JHQHUDOO\ JLYHV D QHJDWLYH UHVLGXH DW WKH SRLQWV
WKH VRLO FODVV DQG UHYHUVH WR WKH DERYH JURXQG FODVV WKHVH UHVLGXH
XVHG WR FDOFXODWH WKH ZHLJKW PDWUL[3L IRU HDFK PHDVXUH =L

7KH ZHLJKW IXQFWLRQ LV HVWDESO LWV WR DIIHFW KLJK FRHIILFLHQWV
DERYH JURXQG VXUIDFH SRLQWV ZKLFK DUH VLWXDWHG EHORZ RU DGMDFHQW W
WKH PLGGOH VXUIDFH DQG DW RFWWKRZURXQGLFLHQW
VXUIDFH SRLQWV)LJXUH



7KLV PHWKRG LV HIIHFWLYH WR GLYLGH WKH SRLQWV LQWR WZR FODVVHV
JURXQG DQG DERYH JURXQG VXUIDFH WKLV PHWKRG GRHV QRW H[WUDFW WKH
EXLOGQLQJV YHJHWDWLRQ DQG OLQH DU REMHFVV FODVVHV EHFDXVH WKH DE
JURXQG FODVV FRQWDLQV EXLOGQLQJV YHJHWDWLRQ HW DO VR DOO ' REMHFVV
'HWHFWLRQ RI ' VXUIDFHV LV D PHWKRG LQWURGXFHG IRU FODVVL\LQJ '

LQ RFWUHH WUHHV DQG XVH WKH FULWH%DDWRHOFKHWUDDFHXDVG \$MKHLPNHWZQWR/V
VHJPHQWDWLRQ > @ FORXG LQWR WZR FODVVHV JURXQG DQG
\$DOVR IRXQG LQ WKH OLWHUDWXUH DOWLWXGH>WKP@W%DRHWDO DDDOIHG
RI KHLJKWV DQG LQWHQVLW\ RI VFDQWFKOLJULWKUHHFODVVRVPELOHDDOIVL
LPDJH PXVW EH FRUHFHWG 6RQJ HW \$DWRQDLUWVHWDOHUWYM LURXQGDGDE
3IHLIHU SURSRVH WKH UDGLRPHWULF FRUHFHWLRODRYHLPDJHLOWHWDG
<DQ HW DO FRQFOXGHG WKDW DIWHU /LX HW DO KDYH DOVR XVHGWKH WZR @FR
VHJPHQWDWLRQ LV LPSURYHG E\ WR WKH LOWHQVLW\ FRPSRQHQW WR WKH KHL

\$SSURDFK \$GYDQWDJH 'LVDGYDQWDJH

5HTXLUHV D ODUJH PHPRU\

\$SSURDFKHV 7EDVFRQVHUYDWLRQ RI WKH ROKHLODDFFKUDRIFWHJPHQWLEWLRQ LV DGDSWHG DFFRUGLQJ V
RQ@Q WKH UDWRISRWQW FORXG SUHFLVLRQ ORFDWLRQ WRSRJDUSKLFDO
FORXG UHODWLRQV 8VLQJ WKH ILUVWURFKRDPV WKDW XVH WKLV DSSURDFK DUH QRW QXPHURXV

,V EDVHG RQ WKH LGHD WKDW WKH XUEDQ VFHQH LV FRPSR

/RVV RI LQIRUPDWLRQ FDXVHG E\ WKH UHVDPSOLQJ VWHS
\$ELOLW\ WR XVH NQRZQ DQG HWWHIEOLWKESDIDRQWKPZKLFK FRQWDLQV Q SRLQWV UDLV
WKH ILHOG RI GLJLWDO SKRWRJUDPPHWU\ DQG UHPRWH
VHQQVLQJ)DOVH GDWD DOVR FDXVHG E\ WKH UHVDPSOLQJ VWHS <R
LQIRUPDWLRQ FDXVHG E\ H[WUDSRODWLRQ EHFDXVH WKH

(DY) WR KDQGOH EHFDXVH WKHYBUHG DFFHVVLEOH
\$SSURDFKHV EDVHGFRVRIWZDUH DQG RU E\ RSHQ VRXUFH
GHULYDWLYH SURGXFWV 6KLIWLQJ FRRUGLQDWHV RI /,\$5 SRLQW 5HVDPSOLQJ VKLIV

)DVW SURFHVVVLQJ DQG FDOFXODWLQJ
7KH DOWLWXGH RI WKH SL[HO LV DQ DYHUDJH YDOXH ZKL
7KH ' FKDUDFWHU IDFLOLWDWGRUPKHWISURCFHVZHQJKWHG DYHUDJH
SL[HOV DQG WKHLU QHLJKERUV
(UURUV DUH DFFXPXODWHG DIWHU HDFK VWDJH RI WUHDW

ORVW VHJPHQWDWLRQ PHWKRGV IRXQG LQ WKH
OLWHUDWXUH DUH RI WKLV IDPLO\

DQG IRU VSHFLILF ODQG FKDUDFWHULVWLFV IRU H[DPSOH IODW XUEDQ DUHD UX
DUHD IRUHVWHG DUHD HWF

\$OJRULWKP K\SRWKHVLV W\SHV RI SURFHVVHG REMHFWV RU WKH QDWXUH RI
VHJPHQWHG DUHD DOO WKHVH FRQVWUDLQWV OHDG XV WR WKLQN DERXW D SUR
WKDW WUHDWV WKH SRLQW FORXG ZLWKRXW UHFRXUVH QHLWKHU WR LQWHUSRO
QHLWKHU WR VSHFLILF GDWD W\SH DQG H[WUDFW WKH PD[LPXP LQIRUPDWLRQ
ZKDWHYHU WKH W\SH RI WHUUDLQ

2XU YLVLRQ LV WR GHYHORS D QHZ SURFHVV LQ WKH DXWRPDWLF
VHJPHQDWLRQ ILHOG RI /,'\$5 GDWD WKLV SURFHVV ZLOO SURGXFH D VHW RI
GDWD OD\HUV LQ WKH IRUP RI SRLQW FORXG PDLQWDLQLQJ WKH RULJLQDO
DFFXUDF\ RI WKH SRLQW FORXG ZLWKRXW DQ\ LQWHUSRODWLRQ FHRODHW RIP

