Snow cover impacts on watershed discharge

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How do remotely sensed snow cover metrics impact discharge in the same water year in central Colorado?

Data checking

Data read in

First we need to get our snow metric (ndsi) data and then also download discharge data from the USGS

```
library(tidyverse)
library(lubridate)
library(dataRetrieval) #for downloading USGS data
#ndsi
ndsi <- read_csv('data/hayman_ndsi.csv') %>%
 rename(burned=2,unburned=3) %>%
  filter(!is.na(burned),
         !is.na(unburned)) %>%
  gather(.,key='site',
         value='ndsi',
         -DateTime) # For this analysis we want the data in long format
#USGS gauge above cheeseman lake '00060'
q_hayman <- readNWISdata(sites=c('06700000'), #Site code</pre>
                  parameterCd='00060', #discharge code in cfs
                  service='dv', # service = daily values (versus annual)
                  startDate='1984-10-01', #Start date for getting the data
                  endDate = '2019-9-10') %>% # End date (today)
  rename(q_cfs = X_00060_00003,
         quality_cd = X_00060_00003_cd) %>% #rename long column name
  filter(!is.na(q_cfs)) %>% #Drop NAs which can occur when there is ice or sensor breaks
  as_tibble() #To make it act like a tibble
```

Data exploring

NDSI summary

```
## DateTime site ndsi

## Min. :1984-04-10 Length:3208 Min. :-0.5727

## 1st Qu.:1999-10-13 Class :character 1st Qu.:-0.4835

## Median :2006-05-01 Mode :character Median :-0.4307

## Mean :2005-06-30 Mean :-0.2364

## 3rd Qu.:2013-03-17 3rd Qu.:-0.1352

## Max. :2019-08-02 Max. : 0.9459
```

Q summary

```
##
     agency_cd
                          site_no
                                               dateTime
    Length:3133
                        Length:3133
                                                   :2002-08-01 00:00:00
##
                                            1st Qu.:2007-04-10 00:00:00
##
    Class : character
                        Class :character
    Mode :character
                        Mode :character
                                            Median :2011-05-31 00:00:00
##
                                                   :2011-04-24 03:37:24
                                            Mean
                                            3rd Qu.:2015-07-21 00:00:00
##
##
                                            Max.
                                                   :2019-09-10 00:00:00
##
        q_cfs
                     quality_cd
                                           tz_cd
                    Length:3133
##
    Min.
              53
                                        Length:3133
##
    1st Qu.: 124
                    Class : character
                                        Class : character
##
    Median: 179
                    Mode :character
                                        Mode :character
##
    Mean
           : 243
    3rd Qu.: 291
##
           :2210
    Max.
```

Combining the data

Adding a water year column

When analyzing water flux data, we typically break the year up into "water years" which run from October to the end of September. For this exploratory analysis, we want to group the datasets by water year and then join them to each other so we can compare winter average, max, median, etc... of snow cover versus the next water year's water flux. So we have to add a column called water year

Q water year

```
q_water_year <- q_hayman %>%
 mutate(month=month(dateTime),
        year_offset = ifelse(month > 9,1,0),
        wtr_yr = year(dateTime) + year_offset)
table(q_water_year$wtr_yr)
##
## 2002 2003 2004 2005 2006 2007 2008 2009 2010 2011 2012 2013 2014 2015 2016
    61 183 183
                  164 183 183 183 183 183 183 183
                                                              183 183 183
## 2017 2018 2019
   183
        183
##
             163
NDSI water year
##
## 1984 1985 1986 1987 1988 1989 1990 1991 1992 1993 1994 1995 1996 1997 1998
##
    14
         34
              44
                   66
                        44
                             48
                                  26
                                       34
                                            50
                                                 56
                                                      60
                                                           60
                                                                64
                                                                     60
                                                                          60
## 1999 2000 2001 2002 2003 2004 2005 2006 2007 2008 2009 2010 2011 2012 2013
       106
             120
                 134
                      116
                            128
                                 132
                                     132
                                          130
                                               114 112 128
## 2014 2015 2016 2017 2018 2019
   138
        116
             130 114
                      130
```

Filtering and summarizing

Now that we have our matched datasets we want to do a couple filtering operations. First, we want to make sure that we are only analyzing complete water years from the Q dataset. Second, we want to make sure we are only summarizing the snow data over months where snow cover is possible, which I would guess is between october and may. Once we have these filtering operations done, we want to summarize each dataset by water year so we can eventually join them and see if snow cover predicts Q.

Snow water year summary statistics

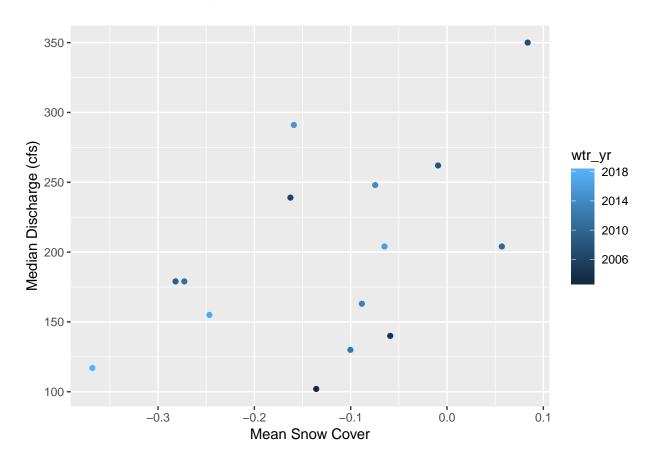
```
## # A tibble: 36 x 4
##
      wtr_yr mean_ndsi max_ndsi median_ndsi
##
       <dbl>
                  <dbl>
                            <dbl>
                                          <dbl>
##
    1
        1984
                0.483
                            0.605
                                        0.483
    2
               -0.104
##
        1985
                            0.539
                                       -0.123
    3
        1986
               -0.130
                            0.436
                                       -0.203
##
##
    4
        1987
                0.0614
                            0.655
                                        0.247
    5
##
        1988
               -0.309
                            0.616
                                       -0.425
##
    6
        1989
               -0.398
                           -0.208
                                       -0.404
##
    7
        1990
               -0.269
                            0.524
                                       -0.428
##
    8
        1991
                0.0130
                            0.632
                                       -0.0550
                                       -0.272
##
    9
        1992
               -0.0982
                            0.592
## 10
        1993
               -0.00697
                            0.626
                                       -0.0943
## # ... with 26 more rows
```

Whole Q water year summaries

```
## # A tibble: 15 x 4
##
      wtr_yr mean_q max_q median_q
##
        <dbl>
                <dbl> <dbl>
                                 <dbl>
##
    1
         2003
                 121.
                         350
                                   102
    2
         2004
                         296
##
                 145.
                                   140
##
    3
         2006
                 222.
                         395
                                   239
##
    4
         2007
                 325.
                         494
                                   350
    5
         2008
                         585
##
                 294.
                                   262
##
    6
         2009
                 253.
                         667
                                   179
##
    7
         2010
                 251.
                         622
                                   204
##
    8
         2011
                 272.
                         783
                                   179
         2012
    9
##
                 149.
                         278
                                   130
## 10
         2013
                 184.
                         332
                                   163
         2014
                                   248
## 11
                 280.
                         542
         2015
                        2210
                                   291
## 12
                 562.
## 13
         2016
                 204.
                         349
                                   204
## 14
         2017
                 205.
                         582
                                   155
## 15
         2018
                 131.
                         281
                                   117
```

Plots of Snow Cover vs Q

Mean Snow vs Median Q



Max Snow vs Median Q

