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A Climate-water balance model for whitebark pine distribution modeling within the GYE

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> > May 21, 2013

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Study area



The Greater Yellowstone Ecosystem encompasses Yellowstone National Park, Grand Teton National Park, and 10 wildemess area.

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Introduction

Climate change in the Greater Yellowstone Ecosystem

Play movie here

- 1. The mean temperature of the GYE has seen a 0.6° C increase in the last 30 years
- 2. Warming is effecting alpine regions (> 2250m 7500ft) elevations, the habitat of Whitebark Pine (aka WBP)
- 3. Projected warming in the next century to exceed 3°C across the region

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Methods

- 1. Summarize PRISM climate dataset for the GYE spatial domain at 30 arc-second resolution (Daly et al 2002)
- 2. Construct water balance model for predictor variable dataset
- 3. Calibrate Random Forest model given Forest Inventory Analysis (FIA) and Whitebark Limber Pine Information System (WLIS) presence and absence dataset
- 4. Generate prediction probability across all cells within GYE spatial domain (Breiman 2001)

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Water balance model

Thornthwaite method for calculating AET and deficit (Thornthwaite 1948, Dingman 2002) We calculate the melt factor ${\sf F}_m$

$$\begin{split} T_{a} &\leq 0^{o}C : F_{m} = 0 \\ 0^{o}C &< T_{a} &< 6^{o}C : F_{m} = 0 \\ T_{a} &\leq 6^{o}C : F_{m} = 1 \end{split} \tag{1}$$

where T_a is the mean monthly temperature, we then estimate the amount of rain and snow from the known P_m precipitation values:

$$RAIN_{m} = F_{m}P_{m}$$

$$SNOW_{m} = (1 - F_{m})P_{m}$$
(2)

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We then determine the monthly total accumulated snow pack PACK_m and snow melt MELT_m

$$PACK_{m} = (1 - F_{m})^{2}P_{m} + = (1 - F_{m})PACK_{m-1}$$

$$MELT_{m} = F_{m}(SNOW_{m} + PACK_{m-1})$$
(3)

The monthly water input W_m to the system (or individual cell) is:

$$W_{m} = RAIN_{m} + MELT_{m}$$
(4)

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Water balance model

The point is that we want to find out the soil moisture. & ET

 $SOIL_m = minimum[SOILmax^{((W_m - PET_m) + SOIL_{m-1})]}$ (5)

But soil moisture evaporates so we need that rate PET_m:

$$PET_{m} = 29.8 *nDays *Daylength * \frac{e_{a}(T_{a})}{T_{a} + 2732}$$
(6)

 e_a is the saturation vapour pressure at T_a :

 $e_a = 0.611exp(\frac{17.3T_a}{T_a+237.3})$

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Random Forest model of WBP distribution



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Projection scenario 1: RCP 4.5 650 ppm CO₂



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Projection scenario 2: RCP 8.5 1464 ppm CO₂

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- 1. 80% mortality of WBP already in GYE (MacFarlane et al 2013)
- 2. Whitebark pine climate envelope projected to reduce significantly over the next century
- 3. Active management should be considered for conservation of species