

AperTO - Archivio Istituzionale Open Access dell'Università di Torino

Evidences of drought stress as a predisposing factor to Scots pine decline in Valle d'Aosta (Italy)

(Article begins on next page)

Evidences of drought stress as a predisposing factor to Scots pine decline in Valle d'Aosta (Italy)

Giorgio Vacchiano¹ , Matteo Garbarino¹ , Enrico Borgogno Mondino² , Renzo Motta¹

¹ Department of Agriculture, Silviculture and Land Management, University of Torino, Via L. da Vinci 44, 10095 Grugliasco, TO, 8 Italy

² Department of Agricultural, Forestry and Environmental Economics and Engineering, University of Torino, Via L. da Vinci 44, 10095 Grugliasco, TO, Italy

Abstract

 Scots pine (Pinus sylvestris L.) forests of many inner Alpine valleys have recently displayed a quick loss of vitality. A decline disease has been suggested as the cause, with drought as the main predisposing factor and the additional contribution of biotic agents inciting tree dieback. This study is focused on Valle d'Aosta, a dry, inner-Alpine region in NW Italy. We inferred vitality changes between years 2000 and 2007 by computing reductions in enhanced vegetation index (EVI). Image differencing was carried out on pre- processed Moderate Resolution Imaging Spectroradiometer (MODIS) imagery taken in late spring-time and validated against ancillary ground truth. We: (1) tested whether EVI reductions in Scots pine forests were significantly higher than those of a control species and of a wetter region for the same species, (2) analyzed decline incidence as a function of site and topographic variables, and (3) assessed the relative influence of site and stand structure on decline probability by means of path analysis. Mean EVI in the study area increased due to an early onset of the 2007 growing season. Nevertheless, the incidence of decline was 6.3% and significantly greater for Scots pine than the control species and site. Low-elevation, northerly exposed sites exhibited the highest incidence of decline.

 Path analysis suggested that the most important determi-nants of decline probability were slope, solar radiation, and stand sparseness.

Keywords: Pinus sylvestris - Decline disease – Drought - Enhanced vegetation index - MODIS

-
-

Introduction

 Unusually high mortality of Scots pines (Pinus sylvestris L.) has recently been observed in many inner- alpine valleys of Italy (Minerbi et al. 2006; Vacchiano et al. 2008), Switzerland (Dobbertin et al. 2005), Austria (Cech and Perny 2000), and southern France (Thabeet et al. 2009). When analyzed one at a time, such mortality episodes have been explained by a number of different agents, including water shortage (Bigler et al. 2006), tree and herbaceous competition (Weber et al. 2008; Giuggiola et al. 2010), and

 mistletoe (Viscum album ssp. Austriacum) (Dobbertin and Rigling 2006). Wood-boring insects, nematodes, and fungi have been found on dying trees, but they did not appear to be the main cause of mortality (Polomski et al. 2006; Gonthier et al. 2007, 2010; Wermelinger et al. 2008; Giordano et al. 2009).

 Even if Scots pine is considered a drought-tolerant species, pine growth and survival in the inner Alps are shown to be strongly limited by high temperatures and summer rain shortage (Oberhuber et al. 1998; Rebetez and Dobbertin 2004; Eilmann et al. 2006). Therefore, it is reasonable to consider pine mortality events as different occurrences of a unique, region-wide climatic response. Recent changes in precipitation regimes, coupled with elevated temperatures and the occurrence of repeated dry years (Schar et al. 2004; Intergovermental Panel on Climate Change 2007), have proven damaging to normally drought-tolerant tree species in other temperate mountain forests (e.g., Hasenauer et al. 1999; Breshears et al. 2005; Guari´n and Taylor 2005;Shaw 2006; van Mantgem et al. 2009; Allen et al. 2010). Climatic anomalies may act as a predisposing factor (*sensu* Manion 1991) to pine decline, increasing physiological stress (Waring 1987; Breda et al. 2006; McDowell et al. 2008) and thus sensitivity to secondary pathogens and insects (Logan et al. 2003; Rouault et al. 2006).

 We hypothesized that recent dry periods were the strongest determinant of region-wide Scots pine decline. In order to test this assumption, we pursued the following specific aims: (1) assess the extent and intensity of decline in a dry alpine region following recurrent dry years; (2) test whether stands located on drought- sensitive sites, e.g., inner alpine areas, south-facing slopes and lower eleva-tions, i.e., with a more negative water balance due to higher evapotranspiration (Baumgartner et al. 1983) exhibit a higher decline; and (3) assess the importance of interacting agents that may predispose stands to decline in sensitive areas, including site, climate, and forest stand structure.

Study area

 The study is focused on the Valle d'Aosta region (Fig. 1) that covers about 3,262 km2. Topography is shaped by a main east–west valley with several north–south protrusions, leg-acies of the last ice-age. Climate is continental with cold winters and hot summers; July and January monthly means may differ by as much as 22.C. Mean annual rainfall in Aosta (45° 26'N, 7° 11'E) for the years 1961–1990 was 494 mm, i.e., much lower than average on the Alps (Biancotti et al. 1998), with an aridity period extending from June to September. Winter precipitation usually comes as snow. Like other inner-alpine valleys, Valle d'Aosta is par-ticularly subject to multi-year drought spells, as those in the early 1990s and between 2003 and 2006 (Fig. 2; see also Rebetez et al. 2009).

 Fig. 1 MODIS image tile and study and control sites (geographical datum: UTM WGS 1984). Scots pine coverage in black. Data source for shaded relief: Jarvis et al. (2008).

 Fig. 2 Cumulated Palmer Drought Severity Index between 1980 and 2003 for the city of Aosta (source: van der Schrier et al. 2007) and smoothed 10-year mean (solid line).

 The study area exhibits both crystalline (granites) and metamorphic bedrocks, but most landscape is covered by quaternary deposits of glacial, gravitative, or colluvial origin. Soils belong to the series of western and central Alpine soil on igneous and metamorphic rocks (Costantini et al. 2004) and are mostly represented by 86 shallow soils (Lithic, Umbric and Dystric Leptosols), eroded soils (Eutric and Calcaric Regosols), acid soils with organic matter, iron oxides and aluminum accumulation (Dystric Cambisols, Haplic Podzols, Humic Umbrisols), or alluvial soils (Eutric Fluvisols).

Pine stands in the study area occur on 5,372 ha (6% of total forest cover), on both acidic and basic substrates

of well-exposed, bottom to mid-elevation slopes. Pure stands cover southerly exposed slopes and shallow

- soils (Ozenda 1985). A greater broadleaved component, represented predominantly by downy oak (Quercus pubescens Willd.) and chestnut (Castanea sativa Mill.), exists on sites with a more favorable water balance
- (Camerano et al. 2007). A Regional Forest Inventory (RFI) was carried out in the years 1992–1994. Base
- grid size was 500 m; sample plots were circular with a variable radius (8–15 m according to overstory
- density). For each plot, the following site-and stand-level variables were recorded: geographic coordi-nates,
- elevation, slope, forest cover type, percent canopy cover, seedling count, number of mortality trees, occur-rence of grazing by domestic or wild ungulates, and severity and cause of crown damage. Species and diameter at breast height (dbh) of all living individuals bigger than

 7.5 cm in dbh were recorded to the nearest cm. A total of 130 plots were sampled in the Scots pine cover types. Mean structural descriptors of pine stands from RFI are sum-marized in Table 1.

 To test the drought-related decline hypothesis, we con-trasted Scots pine against Norway spruce (Picea abies (L.) Karst.) cover as a control species in the same study area, and to Scots pine on a control site. This was represented by the Northern Piedmont region (Fig. 1), where the amount and seasonal distribution of rainfall are typical of a mesic climate (1,479 mm year -1 in Domodossola, 46° 07'N, 8 17'E, for years 1961–1990).

 Table . Summary of structural descriptors of Scots pine stands in Valle d'Aosta for trees larger than 7.5 cm in dbh (n = 130 sampling plots).

Mean **SD** Trees per hectare 881.8 545.6 25.7 m^2 12.7 m^2 Basal area per hectare 20.6 cm 5.1 cm Quadratic mean diameter Percent basal area of Scots pine 93.8% 7.0% Canopy cover 71.5% 17.7%

-
-
- **Methods**
-

 Stress in trees may result in the reduction in chlorophyll content, leaf necrosis, defoliation, or tree death, which in turn affect the radiation characteristics of tree and stand canopies (Jackson 1986; Carter 1993; Pen˜uelas and Filella 1998; Carter and Knapp 2001). Forest vegetation change can be remotely detected by

Satellite imagery

 means of spectral vegetation indices, which are linear combinations of satellite-sensor, multispectral re.ectance data (Tucker 1979; Bannari et al. 1995). Decline in vegetation greenness and presumably, crown vitality can be detected by the difference of the index images (Collins and Woodcock 1996) through time.

 The literature dealing with the use of vegetation indi-ces for remote detection of drought stress is vast (e.g., Peters et al. 1991; Liu and Kogan 1996; Breshears et al. 2005; Deshayes et al. 2006). Recently, an enhanced vegetation index (EVI) has been proposed, which is characterized by reduced influence of atmospheric conditions and canopy background signals as compared to the widely used Normalized Difference Vegetation Index (NDVI). EVI is more sensitive to leaf area index, stand and canopy structure, and plant 127 phenology and stress than NDVI (Huete et al. 2002). EVI is computed on a per-pixel basis as:

$$
EVI = G(NIR - red)(NIR + a_1 red - a_{2blue} + L)^{-1}
$$

.

 where NIR, red, and blue are surface reflectance bands in the near-infrared, red, and blue regions, G is a gain 131 factor to limit the EVI value to a fixed range, L is the canopy background adjustment, a_1 and a_2 are the coefficients of the aerosol resistance term, which uses the blue band to correct for atmospheric differences in the red band (Xiao et al. 2004).¹

 We used data from the Moderate Resolution Imaging Spectroradiometer (MODIS) on board the Earth Observing System-Terra platform, which outputs maps on a global basis every 1–2 days (Justice et al. 1998), beginning from year 2000. MODIS standard products include preprocessed EVI and quality analysis (QA) of the product. Input reflectance data are corrected for nadir and standard sun angles, molecular scattering, ozone absorption, and aerosols (Vermote et al. 2002). In order to filter out residual atmospheric errors, daily EVI data are combined into 16-day maximum-value compositing (MVC) intervals (Holben 1986; van 140 Leeuwen et al. 1999) at a base resolution (grain) of 250 m (MODIS product code MOD13Q1.004).² For production purposes, MODIS maps are output in 1,200 9 1,200 km georeferenced tile units in the integerized sinusoidal (ISIN) geographical projection.

 We selected images taken in late springtime (Julian Days 145–159) from the 2000, 2003, 2005, and 2007 datasets. Spring images were preferred so that each year's image was not influenced by that year's summer drought; therefore, two images predated the 2003 drought spell and two images followed. MODIS metadata for the four images reported that cloud cover of the MVC was between 1 and 4%. We re-projected the multi-147 band images to the Universal Transverse Mercator (UTM 32N) projection (datum: WGS84) and split them in single-band images representing EVI and QA. Pixels with a QA score of 2 and 3 (i.e., targets covered by snow/ice or cloudy pixel) as well as EVI scores lower than 0.15 or null (open water) were filtered out. Co-registration between images (Townshend et al. 1992) was visually checked by inspecting pixels in coastal areas (Toscano 2008).

¹ The coefficients adopted in the MODIS-EVI algorithm are L = 1, $a_1 = 6$, $a_2 = 7.5$, and G = 2.5. These enclose EVI in a range between -1 and +1.

 Data distributed by the Land Processes Distributed Active Archive Center (LP DAAC), located at the US Geological Survey (USGS) Earth Resources Observation and Science (EROS) Center (http:// lpdaac.usgs.gov). Accessed 28 February 2009.

 Validation of EVI data was performed against an ancillary dataset of 114 plots sampled for mean crown transparency, a variable that we considered indicative of stress at the stand scale (Zarnoch et al. 2004). The dataset covered the study area and nearby regions and was assembled from existing sources with variable plot size, year of sampling, and methods for defoliation assessment (Table 2). For validation purposes alone, stands with a mean crown transparency higher than 20% were classified as declining (Wulff 2002); the cutoff was chosen as to allow harmonization of different sampling methods and amplitude of crown transparency classes. EVI was com-puted for each site from available MODIS MVC tiles with a maximum 159 time lag of ± 1 year since field assessment. We fitted a logistic regression model of crown transparency (ground truth) using EVI as a predictor. We computed validation metrics for the logistic models such as producer's accuracy, i.e., the proportion of decline pixels correctly classified by the remote sensing method, and Kappa (KHAT) statistics (Cohen 1960; Rosenfield and Fitzpatrick-Lins 1986).

Change detection

 In order to detect significant reflectance changes, we applied an ordinary image differencing technique (Coppin et al. 2004; Lu et al. 2004) to the most and least recent satellite tiles. The variable of interest was the 168 7-year (2007–2000) EVI difference (Δ EVI). To reduce variance in spectral data due to species composition (including the presence of deciduous species, which have brighter foli-age), we filtered out pixels with less than 90% overlap to Scots pine cover polygons (Falkenstrom and Ekstrand 2002). Perimeters of forest .res from 1961 to 2007 (G. Cesti, unpublished data) were digitized and georefer-enced, and affected areas were excluded from further analysis (Yuhas and Scuderi 2009), in order to differentiate dieoff from reductions in reflectance caused by stand replacing disturbances. It is noteworthy that clearcutting is not routinely carried out in the study area.

The subtraction produced an image dataset where posi-tive or negative values represented areas of change;

values close to zero indicated areas relatively unchanged (Muchoney and Haack 1994). We assumed that

EVI was normally distributed with a zero mean. In order to distinguish reflectance anomalies from random

178 or systematic error (Morisette and Khorram 2000), we classified as decline pixels those where Δ EVI was

179 lower than (mean -1 SD), as computed from the full scene (Fung and LeDrew 1988). The Δ EVI map was

then clipped to the regional distribution of Scots pine in both the study and comparison site and that of

Norway spruce in the study area as a control species (see Table 3 for summary site characteristics).

 We computed summary statistics for EVI at different sites and image years. After failing to detect normality of EVI distributions (Kolmogorov–Smirnov test), we assessed the significance of EVI temporal trend at each site by means of a pairwise Wilcoxon test. We computed decline incidence for each species and site as the ratio between declining and total pixel counts. We also carried out a pairwise compari-son of pixel-based DEVI between the study and control site, by means of a two-sample t test, or a Welch test where the homoschedasticity assumption was not met.

189 *Table 2. Plot data used in validation of reflectance-based estimates of pine decline.*

Plot network References # Plots Plot area Country Crown transparency Years of assessment assessment $200 - 700$ m² Regional Forest Gottero et al. (2007) 87 Piemonte (IT) 3 or more dominant 1999-2001 Inventory trees Swiss Alps 1 $\overline{2}$ 500 m^2 Wallis (CH) Rigling et al. (2006), All pine trees 2000, 2001, Weber et al. (2008) 2005, 2006 Swiss Alps 2 Bigler et al. (2006) , \overline{c} 1 ha Wallis (CH) 250 (co)dominant 2000, 2001 Wermelinger et al. (2008) pine trees 2.000 m^2 Swiss Alps 3 M. Dobbertin, u.d. $\mathbf{1}$ Wallis (CH) All pine trees 2003-2006 Vacchiano et al. (2008) 4,900 m² All pine trees 2005-2007 Italian Alps 1 13 Valle d'Aosta, G. Nicolotti, u.d. Piemonte (IT) $\overline{9}$ 5,000 m² 2004-2007 Italian Alps 2 G. Vacchiano, u.d. Valle d'Aosta, Visual, plot-wise^a Piemonte (IT)

191

192 u.d. Unpublished data

^a193 The assessment was carried out by visual assessment of crown conditions (average defoliation and extremes)

194

195 *Table 3. Topographic Count Elevation (m a.s.l.) HLI Slope (.)characteristics of sites corresponding to the pixels used in this study* 196 *(mean ± SD).*

197 198

 In order to assess the effect of site variables on decline incidence, we extracted elevation, aspect, slope, and 200 solar irradiance (MWh m^{-2} year⁻¹) for each pixel from a region-wide digital elevation model (DEM) with a grain of 50 m, subsequently downscaled to 250 m. Aspect data were transformed to heat load index (HLI) (McCune and Keon 2002). Differences in dieback incidence between classes of topographical variables were assessed by means of multiple Chi-square tests.

204 All analyses were carried out at a significance level of $a = 0.05$ (2-tailed); software used included ENVI 4.3 (ITT Visual Information Solutions, Boulder CO) for image processing, ArcGIS Desktop 9.3 (ESRI Inc., Redlands CA) for geographical data handling, and SPSS 16.0 (SPSS Inc., Chicago IL) for statistical analyses.

208

209 *Effect of predisposing factors*

210

211 We employed path analysis (Shipley 2000) to assess the effect size of predisposing factors on pine decline.

212 Path analysis is a specialized version of Structural Equation Models, testing the relationships between the

213 putative causal variables (climate, site, and stand characteristics) and the hypothesized effect. Path analysis

214 allows modeling of both observed (manifest) and unmeasured (latent) variables. A graphical conceptual

215 model is presented (Fig. 3) for all pixels including a RFI plot ($n = 105$ after exclusion of outliers and plots

216 with less than 5 tallied tree). Arrows symbolize cause-and-effect relationships between variables that are

- represented by rectangles (manifest) and ellipses (latent). The response variable was Pine decline, i.e., the
- EVI difference between 2000 and 2007. Independent variables included:
-
- 220 1. Stand structure variables on a per-hectare basis for each RFI plot, including tree density, basal area (BA),
- percent abundance of Scots pine on plot BA, quadratic mean diameter (QMD), percent standing mortality,
- and Reineke's (1933) Stand Density Index (SDI) as an indicator of competition intensity (Shaw 2000).
-
- 2. Environmental variables: HLI, solar irradiance, elevation, and slope all considered as proxies for water
- availability, due to the absence of a high-resolution network of weather stations on the ground.
-

-
-

Fig. 3 - Conceptual model of decline predisposing factors.

 The conceptual model was tested first on all data, then on two subsamples based on an elevation cutoff of 1,250 m a.s.l. This allowed us to take into account potential dissimilarities in the decline process characterizing different ecological sectors of Scots pine distribution.

234 Variable effects were quantified by standardized regression coefficients (6). Quantitative model comparisons used a combination of Akaike's Information Criterion (AIC) statistic and the Root Mean Square Error of Approximation (RMSEA) that is relatively independent of sample size. The models with the smallest AIC statistic were selected as the most parsimonious ones (Hu and Bentler 1999). A model with RMSEA<0.06 was consid-ered a good .t (Hu and Bentler 1999). Path analyses were conducted using Mx software that works with covariance matrices as input data and a maximum likelihood (ML) .t function (Neale 1994).

-
-
-
-
-

 Table 4 Validation of EVI against crown transparency measured on the ground as predicted by logistic regression models.

Year of assessment	Model	Producer's accuracy (decline pixels)	KHAT	
0 $(n = 41)$	EVI, intercept	0.14	0.04	
	EVI	n.s.	n.s.	
$0, +1 (n = 57)$	EVI, intercept	0.30	0.18	
	EVI	0.80	0.22^a	

Results

 EVI was successfully validated against plot-level crown transparency (Table 4). The best validation metrics 258 were provided by ground truth sampled with a +0 or +1 year lag from the satellite image ($n = 57$).

 Descriptive statistics and dynamic range of EVI in the control and study area (2 species) are displayed in 260 Table 5. Control stands constantly exhibited the highest mean EVI; the spectral response of Norway spruce cover showed a wider range, but lower mean and dispersion than Scots pine across the entire study period.

 While mean EVI at each site significantly increased in time, Scots pine cover in the study area exhibited a very limited change (+3.9%), as opposed to the larger increase in mean reflectance experienced by the control species and site (+11.0 and +14.2%, respectively) (Fig. 4). Additionally, Scots pine in the study area showed increasingly lower extremes, while EVI minima in the control stands experi-enced an increase 266 similar to that of average values.

267 All 7-year Δ EVI values were positive, showing a mean increase in greenness at all sites. The variability of EVI was comparable, but on average, the improvement expe-rienced by Scots pine cover was much more limited, e.g., 0.016 versus 0.06 in the control stands and 0.04 in Norway spruce sites, respectively. A two-270 sample t test significantly segregated pine Δ EVI from both control and Norway spruce sites (P < 0.001). The incidence of 7-year decline was 6.3% in the study area, i.e., almost double than in the control area and manifold greater than in Norway spruce cover type (Table 6).

 In declining Scots pine cover, topographical variables significantly correlated to EVI throughout the study period (Table 7). The spectral index was inversely related to elevation, heat load, and irradiance, with larger correlation coefficients in the year 2003. When pixels were appor-tioned to topography classes (Fig. 5), Chi-

square tests evidenced a significantly higher decline incidence at low lying (below vs. above 1,200 m a.s.l., P

277 = 0.002) and north-facing sites ($P = 0.010$ vs. all southerly octants).

- In order to describe the influence of predisposing factors on pine decline, more than 60 alternative path
- models were tested. When applied to the full dataset, the path models did not yield significant results.
- Conversely, two alternative models (Fig. 6), one each for lower elevation and higher elevation pine forests, emerged as having significant sup-port. At higher elevation, environmental factors alone appeared to have a 282 significant influence on decline (Fig. 6b). These included a direct effect of elevation ($\beta = 0.38$), slope ($\beta =$ 283 0.17), and aspect ($\beta = 0.32$), with sun-exposed sites more subject to decline.
- The model for low-elevation stands had less explanatory power, i.e., lower goodness of fit (Table 8), but
- additionally included an explicit influence of stand structural variables (Fig. 6a), i.e., percent Scots pine and
- SDI. In particular, mixed forests with low SDI resulted more prone to decline. Significant environmental
- 287 variables for model (a) included slope $(\beta = 0.31)$ and aspect, with sun-exposed sites less sensitive to decline
- 288 $(\beta = 0.12)$.

 Fig. 4 - Temporal trend of mean EVI in the study (2 species) and control sites. Bars represent standard error of estimate for each year and site

Table 5. Statistical descriptors of EVI for selected monitoring years in the control and study area (2 species).

Discussion

 MODIS has the potential for identifying large, homogeneous damaged areas; omission errors may occur for small patches (less than 1.5 ha according to Lunetta et al. 2006) or low defoliation severities. Past studies using reflectance indices as a diagnostic element have provided mixed results, likely due to the confounding factors that affect EVI at different sites, i.e., stand structure (Carter et al.1989; Guyot et al. 1989; Asner 1998), topography (Burgess et al. 1995; Matsushita et al. 2007), or radiometric errors (Myneni and Asrar 1994). However, the classification of ''decline'' pixels was fairly accurate when tested against crown transparency of the current and subsequent year (consistent with findings by Heikkila¨ et al. 2002). It is noteworthy that EVI provided some predictive power, being able to spot changes associated with decline some-what earlier than ground-based estimates.

 The dynamic range and distribution of EVI in this analysis were consistent with previous findings (Huete et al. 2002; Li et al. 2007). As our study showed, spruce canopies generally have lower reflectance than pine (Kleman 1986).

 Contrary to expectations, we witnessed a mean increase in vegetation greenness throughout the study period. However, this can be explained by an region-wide advance of the growing season in the year 2007 (Colombo et al. 2009). Spring 2007 and Spring 2003 exhibited the two highest temperatures on record in the Alps (Rutishauser et al. 2008), which affected leaf dynamics and hence canopy reflectance, making our interpretation difficult.

 Minimum EVI increased in the control and Norway spruce sites, but decreased in Scots pine cover, suggesting that canopy stress occurred on sensitive sites. Vegetation greenness exhibited meaningful topographical gradients, i.e., higher at low elevations and moister (cooler) sites. Correlation analysis showed that reflectance was inversely related to irradiance and heat load, especially in spring 2003 when the drought spell began.

 The incidence of decline was moderate in the study area (6%) but significantly higher than in the control site, which conformed to our hypothesis. We detected pine forests as being more sensitive to decline below 1,200 m a.s.l. Similar studies have detected a prevalence of drought-induced decline events at low-lying sites, due to the unfavorable temperature and precipitation gradients (e.g., Allen and Breshears 1998; Dobbertin et al. 2005; Jolly et al. 2005; Knutson and Pyke 2008).

-
-

 Table 6. Summary of EVI anomalies (2007–2000) and incidence of signi.cant decline (EVI anomalies \ [mean -1 SD]) for 250 m pixels in the study and control area.

Site	Pixel count	Mean Δ EVI	SD ΔEVI	Decline pixels	Decline incidence $(\%)$	Total cover (ha)	Decline cover (ha)
Study area	862	0.0155	0.0846	54	6.3	5,387.5	337.5
Control	417	0.0623	0.0555		0.2	2,606.2	6.2
Norway spruce	2.080	0.0404	0.0837	80	3.8	13,000.0	500.0

Table 7. Correlation between EVI and topographic variables for the study area

333 \degree ^a Correlation significant at alpha = 0.05

 Fig. 5- Incidence of decline (i.e., relative frequency of decline pixels) in Scots pine stands as a function of elevation and aspect for the study area.

 The higher incidence of decline on north-facing slopes (low HLI) contradicted both our expectations and the results from previous studies (e.g., Rigling et al. 2006; Yuhas and Scuderi 2009). However, Quaglino et al. (1987) had already detected, in the same study area, more severe dieback in mixed, low-elevation forests of north-facing slopes. We offer two alternative explanations for this: (1) pines on southern slopes may be physiologically adapted to regular drought conditions (Letts et al. 2009); (2) due to different land use in the study area, and not to aspect itself, pine forests occur at low elevations on northern slopes and on southern slopes at high elevations.³ The latter have already been shown as being less sensitive to decline.

 F *Fig. 6 - Path diagrams for Scots pine forests at a low (<1,250 m a.s.l.) and <i>b high (> 1,250 m a.s.l.) elevations, showing the effect of environmental (gray) and stand structural variables (white)on DEVI response. Continuous arrows positive paths; dashed arrows negative paths. Thickness of path vectors corresponds to the strength of the effect. Only significant path coefficients are presented next to each path.*

³ Pixels with pine coverage > 90% (n = 594) exhibited a significant difference in mean elevation between southern slopes (1,501 m) a.s.l.) and northern ones (1,253 m a.s.l., P < 0.001 after Welch *t* test).

Table 8. Fit indices for path models of pine decline at (a) low (<1,250 m a.s.l.) and (b) high (>1,250 m) elevations.

Model	ML χ^2	đt		RMSEA	AIC
(a	7.941		0.160	0.121	-2.059
(b)	6.018		0.872	< 0.001	-15.982

359 AIC Akaike's Information Criterion; RMSEA Root Mean Square Error of Approximation; *df* degrees of freedom; ML χ^2 maximum 360 likelihood χ^2 fit function value and its P probability.

 This was a good reason to test predisposing factors in a multivariate way, accounting for both their direct and indirect effects. No significant model could be fit to the totality of plots. Hence, we developed models for two different elevation belts, assuming that the causal chain in the area with high decline incidence (1,250 m a.s.l. and below) would differ from that associated to the low-inci-dence area. In the latter, environmental factors alone drove changes in greenness, with a direct effect of elevation and aspect. Mid-elevation forests could bene.t more than high elevation from the anticipation of the 2007 growing season and showed larger increases in photosynthetic activity. Southerly slopes were more sensitive to decline, suggesting that when precipitation is not limiting, high temperature and radiation directly impact pine tree vitality.

 Below 1,250 m a.s.l. the process differed. Environ-mental factors had an inverse effect on decline, in that low lying, northerly exposed stands were more sensitive. In continental valleys, precipitation is limiting at low eleva-tions. In this case, the negative impact of repeated pre-cipitation shortage was more important than that of temperature, a fact that produced a negative elevation gradient in pine decline. We have already explained the potential causes for a higher sensitivity of northerly aspects in low-lying forests. Slope also played a significant role: on sites with an unfavorable water balance, steepness may be associated to thinner soils, and hence, more severe water stress after drought events.

 In these stands, the degree of mixture was slightly associated to decline, confirming that interspecific competition has the potential to expose pines to further stress (Weber et al. 2007). On the other hand, we detected a strong effect of stand density, in that sparser stands were more prone to decline. This counterintuitive result could once again be linked to water balance: sparser stands exhibit a higher cover by the herb and shrub layers, which may exert a strong competition for water due to their extensive root systems (McMurtrie and Wolf 1983). Alternatively, low-density pine stands may have developed on poor sites (e.g., rocky out-crops), where drought events can severely impact an already limiting water balance. Finally, infection by mistletoe, a shade-intolerant, hemi-parasitic species common in the study area, preferentially occurs on open-grown trees and spreads faster in open stands (Vallauri 1998). Mistletoe negatively affects a 386 plant's water balance, acting as a sup-plementary evapotranspiratory organ for the branches it infects, and has already been found as a contributing factor to pine decline North of the Alps (Dobbertin and Rigling 2006; Rigling et al. 2010).

-
-
-
-

Conclusion

 The study was designed to evaluate the impact of drought as a potential key factor limiting the vitality in Scots pine stands. The study was carried out in Valle d'Aosta, an inner-alpine valley subject to multi-year 397 drought episodes (average precipitation: 494 mm year⁻¹), as those between 2003 and 2006. To assess the 398 drought decline hypothesis, pine stands with a typical mesic climate (average $1,479$ mm year⁻¹) were used as a control.

 The major achievements of this study were: (1) pro-ducing a spatially explicit estimate of the extent and inci-dence of 7-year decline in Scots pine vitality across the study area. Significant decline of canopy greenness occurred on 337 ha, or 6.8% of overall pine cover, at a 250-m grain; (2) ascertaining the role of drought in Scots pine decline, since reflectance changes of pine cover were significantly higher than both the control species and the control site; (3) evaluating the effect of potential factors predisposing stands to decline, including site, climate, and stand structure. Path analysis suggested that sparser stands, low- elevation and north-facing slopes were more prone to decline. Where precipitation was limiting (i.e., low- eleva-tion stands), environmental and stand structural variables interacted in predisposing water-stressed sites to decline. At higher elevations, environmental drivers alone affected pine decline.

 The novelty of our approach lied in linking information from remotely sensed data to ground-based forest inven-tories, in the study versus control design of drought response analysis, and in the multivariate investigation of direct and indirect causal drivers.

 Scots pine proved to be a sensitive species, showing early signs of vitality decline that may be remotely detected even by coarse-resolution, readily available satellite imagery (MODIS). Furthermore, MODIS- derived EVI provided some predictive power, being able to spot changes associated to decline earlier than ground-based estimates. ''Early warning'' systems (Verbesselt et al. 2009) and decision support systems aimed at prioritizing the management of drought-sensitive pine forests may be designed based on such approach.

Acknowledgments

 This research has been supported by European Commission, Regione Piemonte (Direzione Opere pubbliche, Difesa del suolo, Economia Montana e Foreste), Regione Autonoma Valle d'Aosta (Direzione Foreste) and Canton du Valais (Services des foreˆts et du paysage)—project INTERREG IIIA 2000–2006 Italia-Svizzera ''Le pinete delle vallate alpine: un elemento del paesaggio in mutazione''. We acknowledge I.P.L.A. S.p.A. and all data providers, the crew of the Swiss Federal research Institute WSL-Birmensdorf,

 L. Giordano and A. Rigling for field sampling, D. Godone and F. Pirotti for helping out with remote sensing techniques, J. N. Long, R. J. DeRose and anonymous reviewers for useful comments.

- **References**
-
- Allen CD, Breshears DD (1998) Drought-induced shift of a forest-woodland ecotone: rapid landscape response to climate variation. Proc Natl Acad Sci 95:14839–14842
- Allen CD, Macalady AK, Chenchouni H, Bachelet D, McDowell N, Vennetier M, Kitzberger T, Rigling A,
- Breshears DD, Hogg EH, Gonzalez P, Fensham R, Zhang Z, Castro J, Demidova N, Lim J-H, Allard G,
- Running SW, Semerci A, Cobb N (2010) A global overview of drought and heat-induced tree mortality reveals emerging climate change risks for forests. For Ecol Manag 259:660–684
- Asner GP (1998) Biophysical and biochemical sources of variability in canopy re.ectance. Remote Sens
- Environ 64:234–253 Bannari A, Morin D, Bonn F, Huete AR (1995) A review of vegetation indices. Remote Sens Rev 13:95–120
- Baumgartner A, Reichel E, Weber G (1983) Der Wasserhaushalt der Alpen: Niederschlag, Verdunstung,
- Ab.uss und Gletscherspende im Gesamtgebiet der Alpen im Jahresdurchschnitt fur die Normalperiode 1931–1960. Verlag Oldenbourg, Mu¨nchen
- Biancotti A, Bellardone G, Bovo S, Cagnazzi B, Giacomelli L, Marchisio C (1998) Distribuzione regionale di piogge e temper-ature. Regione Piemonte, Torino
- Bigler C, Bra¨ker OU, Bugmann H, Dobbertin M, Rigling A (2006) Drought as an inciting mortality factor in Scots pine stands of the Valais, Switzerland. Ecosystems 9:330–343
- Breda N, Huc R, Granier A, Dreyer E (2006) Temperate forest trees and stands under severe drought: a
- review of ecophysiological responses, adaptation processes and long-term consequences. Ann For Sci 63:625–644
- Breshears DD, Cobb NS, Rich PM, Price KP, Allen CD, Balice RG, Romme WH, Kastens JH, Floyd ML,
- Belnap J (2005) Regional vegetation die-off in response to global-change-type drought. Proc Natl Acad Sci 102:15144–15148
- Burgess DW, Lewis P, Muller J (1995) Topographic effects in AVHRR NDVI data. Remote Sens Environ 54:223–232 Camerano P, Terzuolo PG, Varese P (2007) I tipi forestali della Valle d'Aosta. Compagnia delle Foreste, Arezzo
- Carter GA (1993) Responses of leaf spectral re.ectance to plant stress. Am J Bot 80:239–243
- Carter GA, Knapp AK (2001) Leaf optical properties in higher plants: linking spectral characteristics to
- stress and chlorophyll concen-tration. Am J Bot 88:677–684
- Carter GA, Paliwal K, Pathre U, Green TH, Mitchell RJ, Gjerstad DH (1989) Effect of competition and leaf
- age on visible and infrared re.ectance in pine foliage. Plant Cell Environ 12:309–315
- Cech TL, Perny B (2000) Kiefernsterben in Tirol. Forstschutz Aktuell Wien 22:12–15
- Cohen J (1960) A coef.cient of agreement for nominal scales. Educ Psychol Meas 20:37–46
- Collins JB, Woodcock CE (1996) An assessment of several linear change detection techniques for mapping
- forest mortality using multitemporal Landsat TM data. Remote Sens Environ 56:66–77
- Colombo R, Busetto L, Migliavacca M, Cremonese E, Meroni M, Galvagno M, Rossini M, Siniscalco C,
- Morra di Cella U (2009) On the spatial and temporal variability of Larch phenological cycle in mountainous areas. Ital J Remote Sens 41:79–96
- Coppin P, Jonckheere I, Nackaerts K, Muys B (2004) Digital change detection in environmental monitoring: a review. Int J Remote Sens 25:1565–1596
- Costantini EAC, L'Abate G, Urbano F (2004) Soil regions of Italy. CRA-ISSDS, Firenze
- Deshayes M, Guyon D, Jeanjean H, Stach N, Jolly A, Hagolle O (2006) The contribution of remote sensing to the assessment of drought effects in forest ecosystems. Ann For Sci 63:579–595
- Dobbertin M, Rigling A (2006) Pine mistletoe (Viscum album ssp austriacum) contributes to Scots pine
- (Pinus sylvestris) mortality in the Rhone valley of Switzerland. For Pathol 36:309–322
- Dobbertin M, Mayer P, Wohlgemuth T, Feldmeyer-Christe E, Graf U, Zimmermann NE, Rigling A (2005)
- The decline of Pinus sylvestris L. forests in the Swiss Rhone Valley—a result of drought stress? Phyton 45:153–156
- Eilmann B, Weber P, Rigling A, Eckstein D (2006) Growth reactions of Pinus sylvestris L. and Quercus
- pubescens Willd to drought years at a xeric site in Valais, Switzerland. Dendrochronologia 23:121–132
- Falkenstrom H, Ekstrand S (2002) Evaluation of IRS-1c LISS-3 satellite data for defoliation assessment on Norway spruce and Scots pine. Remote Sens Environ 82:208–223
- Fung T, LeDrew E (1988) The determination of optimal threshold levels for change detection using various accuracy indices. Photogramm Eng Remote Sens 54:1449–1454
- Giordano L, Gonthier P, Varese GC, Miserere L, Nicolotti G (2009) Mycobiota inhabiting sapwood of healthy and declining Scots pine (Pinus sylvestris L.) trees in the Alps. Fungal Divers 38:69–83
- Giuggiola A, Kuster TM, Saha S (2010) Drought-induced mortality of Scots pines at the southern limits of 488 its distribution in Europe: causes and consequences. iForest 3:95–97
- Gonthier P, Giordano L, Nicolotti G (2007) Sui disseccamenti acuti e generalizzati del pino silvestre nell'envers della media Valle d'Aosta. L'informatore Agricolo 23:41–45
- Gonthier P, Giordano L, Nicolotti G (2010) Further observations on sudden diebacks of Scots pine in the European Alps. For Chron 86:110–117
- Gottero F, Ebone A, Terzuolo P, Camerano P (2007) I Boschi del Piemonte: conoscenza e indirizzi gestionali. Regione Piemonte, Blu Edizioni, Torino
- Guari´n A, Taylor AH (2005) Drought triggered tree mortality in mixed conifer forests in Yosemite National Park, California, USA. For Ecol Manag 218:229–244
- Guyot G, Guyon D, Riom J (1989) Factors affecting the spectral response of forest canopies: a review. Geocarto Int 4:3–18
- Hasenauer H, Nemani RR, Schadauer K, Running SW (1999) Forest growth response to changing climate between 1961 and 1990 in Austria. For Ecol Manag 122:209–219
- Heikkila¨ J, Nevalainen S, Tokola T (2002) Estimating defoliation in boreal coniferous forests by combining
- Landsat TM, aerial photographs and .eld data. For Ecol Manag 158:9–23
- Holben B (1986) Characteristics of maximum-value composite images from temporal AVHRR data. Int J Remote Sens 7:1417–1434
- Hu L, Bentler P (1999) Cutoff criteria for .t indexes in covariance structure analysis: conventional criteria versus new alternatives. Struct Equ Model 6:1–55
- Huete AR, Didan K, Miura T, Rodriguez EP, Gao X, Ferreira LG (2002) Overview of the radiometric and biophysical performance of the MODIS vegetation indices. Remote Sens Environ 83:195–213
- Intergovermental Panel on Climate Change (2007) Climate change 2007: the scienti.c basis. IPCC Fourth assessment report. Cambridge University Press, Cambridge
- Jackson RD (1986) Remote sensing of biotic and abiotic plant stress. Annu Rev Phytopathol 24:265–287
- Jarvis A, Reuter HI, Nelson A, Guevara E (2008) Hole-.lled seamless SRTM data V4. International Centre for Tropical Agriculture (CIAT). http://srtm.csi.cgiar.org. Accessed 6 June 2009
- Jolly WM, Dobbertin M, Zimmermann NE, Reichstein M (2005) Divergent vegetation growth responses to the 2003 heat wave in the Swiss Alps. Geophys Res Lett 32:L18409
- Justice CO, Vermote E, Townshend JRG, Defries R, Roy DP, Hall DK, Salomonson VV, Privette JL, Riggs
- G, Strahler A (1998) The Moderate Resolution Imaging Spectroradiometer (MODIS): land remote sensing for global change research. IEEE Trans Geosci Remote Sens 36:1228–1249
- Kleman J (1986) The spectral re.ectance of stands of Norway spruce and Scotch pine, measured from a helicopter. Remote Sens Environ 20:253–265
- Knutson KC, Pyke DA (2008) Western juniper and ponderosa pine ecotonal climate-growth relationships across landscape gradients in southern Oregon. Can J For Res 38:3021–3032
- Letts MG, Nakonechny KN, Van Gaalen KE, Smith CM (2009) Physiological acclimation of Pinus .exilis to
- drought stress on contrasting slope aspects in Waterton Lakes National Park, Alberta, Canada. Can J For Res 39:629–641
- Li HJ, Zheng L, Lei YP, Li CQ, Zhou K (2007) Comparison of NDVI and EVI based on EOS/MODIS data. Prog Geogr 26:26–32
- Liu WT, Kogan FN (1996) Monitoring regional drought using the vegetation condition index. Int J Remote Sens 17:2761–2782
- Logan JA, Regniere J, Powell JA (2003) Assessing the impacts of global warming on forest pest dynamics. Front Ecol Environ 1:130–137
- Lu D, Mausel P, Brondizio E, Moran E (2004) Change detection techniques. Int J Remote Sens 25:2365– 2401
- Lunetta RS, Knight JF, Ediriwickrema J, Lyon JG, Worthy LD (2006) Land-cover change detection using multi-temporal MODIS NDVI data. Remote Sens Environ 105:142–154
- Manion PD (1991) Tree disease concepts. Prentice Hall, Englewood Cliffs
- Matsushita B, Yang W, Chen J, Onda Y, Qiu G (2007) Sensitivity of the Enhanced Vegetation Index (EVI)
- and Normalized Differ-ence Vegetation Index (NDVI) to topographic effects: a case study in high-density
- cypress forest. Sensors 7:2636–2651
- McCune B, Keon D (2002) Equations for potential annual direct incident radiation and heat load. J Veg Sci 13:603–606
- McDowell N, Pockman WT, Allen CD, Breshears DD, Cobb N, Kolb T, Plaut J, Sperry J, West A, Williams DG (2008) Mechanisms of plant survival and mortality during drought: why do some plants survive while

others succumb to drought? New Phytol 178:719–739

- McMurtrie R, Wolf L (1983) A model of competition between trees and grass for radiation, water and nutrients. Ann Bot 52:449–458
- Minerbi S, Cescatti A, Cherubini P, Hellrigl K, Markart G, Saurer M, Mutinelli C (2006) La siccita`
- 548 dell'estate 2003 causa di dissec-camenti del pino silvestre in Val d'Isarco. For Obs 2(3):89-144
- Morisette JT, Khorram S (2000) Accuracy assessment curves for satellite-based change detection.

Photogramm Eng Remote Sens 66:875–880

- Muchoney DM, Haack BN (1994) Change detection for monitoring forest defoliation. Photogramm Eng Remote Sens 60:1243–1251
- Myneni RB, Asrar G (1994) Atmospheric effects and spectral vegetation indices. Remote Sens Environ 47:390–402
- Neale MC (1994) MxGui 3.2. Department of Psychiatry, Virginia Commonwealth University, Richmond. http://www.vcu.edu/mx. Accessed 1 Apr 2011
- Oberhuber W, Stumbo¨ck M, Ko.er W (1998) Climate-tree-growth relationships of Scots pine stands (Pinus sylvestris L.) exposed to soil dryness. Trees 13:19–27
- Ozenda P (1985) La ve´ge´tation de la chaiˆne alpine dans l'espace montagnard europee´n. Masson, Paris
- Pen˜uelas J, Filella I (1998) Visible and near-infrared re.ectance techniques for diagnosing plant physiological status. Trends Plant Sci 3:151–156
- Peters AJ, Rundquist DC, Wilhite DA (1991) Satellite detection of the geographic core of the 1988 Nebraska drought. Agric For Meteorol 57:35–47
- Polomski J, Scho¨nfeld U, Braasch H, Dobbertin M, Burgermeister W, Rigling D (2006) Occurrence of Bursaphelenchus species in declining Pinus sylvestris in a dry Alpine valley in Switzerland. For Pathol 36:110–118
- Quaglino A, Mondino GP, Nosenzo A, Borelli M, Motta R, Pividori M (1987) DEFOR86: Deperimento delle foreste in Valle d'Aosta—Possibili rapporti con l'inquinamento atmosferico. Universita` degli Studi di Torino e Regione Autonoma Valle d'Aosta, Aosta
- Rebetez M, Dobbertin M (2004) Climate change may already threaten Scots pine stands in the Swiss Alps. Theor Appl Clim 79:1–9
- Rebetez M, Dupont O, Giroud M (2009) An analysis of the July 2006 heatwave extent in Europe compared to the record year of 2003. Theor Appl Clim 95:1–7
- Reineke LH (1933) Perfecting a stand-density index for even-aged forests. J Agric Res 46:627–638
- Rigling A, Dobbertin M, Bu¨rgi M, Gimmi U, Pannatier E, Gugerli F, Heiniger U, Polomski J, Rebetez M, Rigling D (2006) Verdra¨n-gen Flaumeichen die Walliser Waldfo¨hren? Merkblatt fu¨r die Praxis 41:1– 16
- Rigling A, Eilmann B, Ko¨chli R, Dobbertin M (2010) Mistletoe-induced crown degradation in Scots pine in a xeric environment. Tree Physiol 30:845–852
- Rosen.eld GH, Fitzpatrick-Lins K (1986) A coef.cient of agreement as a measure of thematic classi.cation accuracy in remote sensing. Photogramm Eng Remote Sens 52:223–227
- Rouault G, Candau JN, Lieutier F, Nageleisen LM, Martin JC, Warze´e N (2006) Effects of drought and heat on forest insect populations in relation to the 2003 drought in Western Europe. Ann For Sci 63:613–624
- Rutishauser T, Luterbacher J, De.la C, Frank D, Wanner H (2008) Swiss spring plant phenology 2007:

 extremes, a multi-century perspective, and changes in temperature sensitivity. Geophys Res Lett 35:L05703

- Scha¨r C, Vidale PL, Lu¨thi D, Frei C, Ha¨berli C, Liniger MA, Appenzeller C (2004) The role of increasing temperature variability in European summer heatwaves. Nature 427:332–336
- Shaw JD (2000) Application of stand density index to irregularly structured stands. West J Appl For 15:40– 42
- Shaw JD (2006) Forest Inventory and Analysis (FIA) annual inventory answers the question: what is happening to pinyon-juniper woodlands? J For 103:280–286
- Shipley B (2000) Cause and correlation in biology: a user's guide to path analysis, structural equations and causal inference. Cam-bridge University Press, Cambridge
- Thabeet A, Vennetier M, Gadbin-Henry C, Denelle N, Roux M, Caraglio Y, Vila B (2009) Response of Pinus sylvestris L. to recent climatic events in the French Mediterranean region. Trees 23:843–853
- Toscano S. (2008) L'utilizzo di immagini satellitari per l'individuazione dei cambiamenti nella componente
- vegetazionale del territorio: aspetti procedurali critici e possibili soluzioni. Dissertation, Universita` degli Studi di Torino, Torino
- Townshend JRG, Justice CO, Gurney C, McManus J (1992) The impact of misregistration on change detection. IEEE Trans Geosci Remote Sens 30:1054–1060
- Tucker CJ (1979) Red and photographic infrared linear combinations for monitoring vegetation. Remote Sens Environ 8:127–150
- Vacchiano G, Dobbertin M, Egli S, Giordano L, Gonthier P, Mazzoglio P, Motta R, Nola P, Nicolotti G, Patetta A, Polomski J, Rigling A, Rigling D (2008) Il deperimento del pino silvestre nelle Alpi
- occidentali: natura ed indirizzi di gestione. Compag-nia delle Foreste, Arezzo
- Vallauri D (1998) Parasite dynamics of Viscum album L. in Austrian black pine stands in the Saignon watershed (southwestern Alps). Ann For Sci 55:823–835
- van der Schrier G, Efthymiadis D, Briffa KR, Jones PD (2007) European Alpine moisture variability for
- 1800–2003. Int J Clim 27:415–427
- van Leeuwen WJD, Huete AR, Laing TW (1999) MODIS vegetation index compositing approach: a
- prototype with AVHRR data. Remote Sens Environ 69:264–280
- van Mantgem PJ, Stephenson NL, Byrne JC, Daniels LD, Franklin JF, Fule PZ, Harmon ME, Larson AJ,
- Smith JM, Taylor AH (2009) Widespread increases of tree mortality rates in the western United States. Science 323:521–524
- Verbesselt J, Robinson A, Stone C, Culvenor D (2009) Forecasting tree mortality using change metrics derived from MODIS satellite data. For Ecol Manag 258:1166–1173
- Vermote EF, El Saleous NZ, Justice CO (2002) Atmospheric correction of MODIS data in the visible to middle infrared: .rst results. Remote Sens Environ 83:97–111
- Waring RH (1987) Characteristics of trees predisposed to die. Bioscience 37:569–574
- Weber P, Bugmann H, Rigling A (2007) Radial growth responses to drought of Pinus sylvestris and Quercus pubescens in an inner-Alpine dry valley. J Veg Sci 18:777–792
- Weber P, Bugmann H, Fonti P, Rigling A (2008) Using a retrospective dynamic competition index to reconstruct forest succession. For Ecol Manag 254:96–106
- Wermelinger B, Rigling A, Schneider Mathis D, Dobbertin M (2008) Assessing the role of bark-and wood-
- boring insects in the decline of Scots pine (Pinus sylvestris) in the Swiss Rhone valley. Ecol Entomol 33:239–249
- Wulff S (2002) The accuracy of forest damage assessments: experiences from Sweden. Environ Monit Assess 74:295–309
- Xiao X, Hollinger D, Aber J, Goltz M, Davidson EA, Zhang Q, Moore B (2004) Satellite-based modeling of gross primary production in an evergreen needleleaf forest. Remote Sens Environ 89:519–534
- Yuhas AN, Scuderi LA (2009) MODIS-derived NDVI characterisa-tion of drought-induced evergreen dieoff
- in western North America. Geogr Res 47:34–45
- Zarnoch SJ, Bechtold WA, Stolte KW (2004) Using crown condition variables as indicators of forest health.
- Can J For Res 34:1057–1070
-