### Declaring success in *Sphagnum* peatland restoration: Identifying outcomes from readily measurable vegetation descriptors

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#### SUMMARY

Managers of restoration projects need readily applicable tools that give them an unequivocal declaration of success or failure based on primary goals that may vary according to different jurisdictions. We used restored extracted *Sphagnum* peatlands in Canada to illustrate how different types of plant communities assigned to different restoration outcomes can be identified from readily measurable descriptors. Vegetation was surveyed from 5–10 years after restoration at 2–3 year intervals in a total of 274 permanent plots in 66 restored peatlands located across 4500 km, from Alberta in the drier continental interior to the wetter maritime coastal province of New Brunswick. Plant community data were subjected to a k-means clustering that resulted in three restoration outcome categories. A linear discriminant analysis (LDA) model (the "declaration tool") correctly classified 91 % of the plots in a calibration database that included 75 % of the peatlands, and 93 % of the validation database (25 % of the peatlands), into the restoration outcome categories, using plant strata and number of years since restoration (only) as descriptors. The model includes classification functions that can be used to assign a new plot (not used to construct the model) to its restoration outcome category. We found that ~70 % of the severely degraded peatland is successfully regenerating towards the target plant community.

KEY WORDS: adaptive management, moss layer transfer technique, peat-accumulating, peat extraction

#### **INTRODUCTION**

Restoration of ecosystems is as complex as their nature. Outcomes can be multiple, often stochastic; trajectories of change variable, rather and unpredictable and open-ended (Hughes et al. 2005). However, to reclaim environmental down payment and fulfil legislation obligations, restoration practitioners need to assess the fate of restored ecosystems with unambiguous determinations of success and failure of their projects (Bernhardt et al. 2007, Suding 2011). Success is a nebulous part of the lexicon of restoration (Ruiz-Jaen & Aide 2005); target criteria can vary widely in both ambition and rationale, even among stakeholders within the same project. Ecological outcomes also differ from success related to economics, aesthetics, recreation, or education. Setting evaluation standards requires consensus among scientists, funding agencies and citizen groups. For managers to declare success unequivocally, science-based tools are needed (Bonnett et al. 2009). If these tools were based on simple, easily recognisable indicators such as the presence of a particular species or the abundance of a plant group, monitoring would be much easier to implement and the cost would be greatly reduced (Herrick et al. 2006). However, reducing the multidimensional nature of restored ecosystems to

simplified estimators that give an unequivocal declaration of success is not a trivial task and can lead to bias in restoration evaluations if these are not properly integrated. In the context of Sphagnum peatland restoration, González et al. (2013) showed that, while it is possible to identify plant species that are significant indicators of three main plant categories (respectively dominated by Sphagnum, Polytrichum strictum which is another bryophyte typical of peatlands, and bare peat), variations in frequency and cover of these indicator species are very small between different plant categories, making it difficult to evaluate related restoration outcomes with certainty. In addition, managers must integrate abundance thresholds from manv indicators, a complex task when species representing failure or success co-occur in the same site (Bachand et al. 2014). Integrating these factors into comprehensive models could facilitate the implementation of adaptive management strategies.

Multivariate analyses can be used effectively to develop integrative tools for evaluating restoration trajectories (i.e., change in plant community over time in this article) since they make it possible to synthesise environmental information, thereby explaining most system variability on fewer dimensions. González *et al.* (2014) combined indicator species, environmental and management

variables through Linear Discriminant Analysis (LDA; Fisher 1936, Rao 1948, Rao 1952) to predict one of three dominating plant categories shortly after restoration of extracted Sphagnum peatlands. While their method succeeded in developing an analytical approach for unequivocally predicting restoration trajectory after restoration measures using readily measurable indicators, their model was restricted to an early prediction of restoration outcomes. That is, their tool served to predict the future outcome of restoration after the implementation of restoration works, not strictly to declare "success" at a certain time point over the process of ecosystem recovery. Restoration success can be defined a priori as the reestablishment of moss species typical of dominated Sphagnum peatlands known to have a good peat accumulation potential (Rochefort 2001). Likewise, Vitt et al. (2011) defines the return of degraded peatlands to an equivalent land capability as a return to peatland communities that are capable of sequestering carbon, a key function of peatland ecosystems directly related to peat accumulation. The central question of the present article is when to declare success post-restoration? The development of a simple and integrative predictive tool to describe the outcomes will be the main goal, not the drivers of succession in the various restoration sites.

In this work, we used an LDA model that served to declare success unequivocally by identifying the restoration outcomes in extracted and later restored *Sphagnum* peatlands from readily measurable vegetation descriptors, within a window of 5–10 years since restoration, and at the scale of an entire country encompassing diverse climatic and biogeographical regions (Canada). The restoration outcome categories themselves are discussed within different frameworks of performance.

#### **METHODS**

#### Study sites

The present analysis is based on more than 80 extracted peatlands that have been restored across Canada. Only 66 of them, which had been restored at least 5 years previously, were used for this study. They ranged in size from 1 to 39 ha. Restoration of an entire extracted peatland could take years. Hereafter we use the term "restoration site" to designate a sector of an extracted peatland that was restored within a given year; consequently under slightly different management actions and sometimes under widely different annual weather conditions. Restoration sites might be located 2–5 km apart within the same peatland complex or in different

peatlands, and were distributed from the drier interior continental climate of Alberta (mean annual precipitation 400 mm) to the wetter more maritime climate of coastal New Brunswick (mean annual precipitation 1200 mm). More restoration sites were located in the east because of the longer history of peat extraction and restoration activities, with 11 sites in western Canada compared to 55 sites in eastern Canada (35 of the 55 sites were included by González *et al.* (2014) but with actualised recovery evaluations). Together, they stretch for more than 4500 km across the country.

The restoration sites were restored by the moss layer transfer technique, in the following steps: field topography (1) re-shaping to optimise rewetting; (2) spreading plant diaspores, including Sphagnum mosses previously collected from a donor site; (3) spreading straw mulch to protect diaspores improving microclimatic conditions bv and preventing desiccation of plant fragments; (4) blocking drainage ditches; and (5) in some cases, fertilising with phosphorus to favour colonisation by Polytrichum strictum to 'nurse' Sphagnum mosses (Quinty & Rochefort 2003, Rochefort et al. 2003, Sottocornola et al. 2007, Graf & Rochefort 2016).

#### Post-restoration monitoring programme

Permanent 5 m  $\times$  5 m plots were established in each restoration site to document the evolution of the vegetation community after restoration. The number of plots differed (ranging from one to six) between restoration sites as a function of restored peatland size and heterogeneity of the establishing vegetation. A total of 274 permanent plots were monitored in the 66 restoration sites; thus, 50 % (135 of them) were not part of the database of González et al. (2014). Even though the plots are being surveyed during the autumn at 5, 7, 10, 15 and 20 years post-restoration, data collected eleven or more years since restoration were not used in this study in order to shorten the time window and thus reduce differences in the successional stage across restoration sites, peatlands and regions. Sites in western Canada, for example, were incorporated into the long-term monitoring programme later than the sites in eastern Canada.

In the permanent plots we first identified visually the total cover of vascular plant strata (trees and shrubs excluding ericaceous species, ericaceous shrubs, and herbs: forbs and graminoid plants), as well as bare peat and litter cover, on a seven-point scale: 0=absent, 0.5=present, 1=1-10 %, 2=11-25 %, 3=26-50 %, 4=51-75 % and 5=76-100 %. Vascular plants were then identified to species level (or assigned to a higher taxonomic level when this was impossible) and the ground covered by their vertical projection visually estimated within four  $1 \text{ m} \times 1 \text{ m}$ quadrats located systematically within each permanent plot. Cover of all bryophyte species and lichens was recorded in 12 quadrats of  $25 \text{ cm} \times 25 \text{ cm}$ that were also systematically distributed within each permanent plot. A total of 113 lichens, bryophytes and vascular plant species were recorded; 19 taxa were identified to the genus level or a higher taxon (Table 1).

#### Data processing and statistical analyses

To account for the fact that some peatland complexes and some regions were incorporated into the monitoring program later than others and to avoid temporal pseudo-replication, we first chose one year of monitoring among the 5–10 yr post-restoration time series at each restoration site by stratified random sampling, so that the years since restoration were equally distributed across all peatland complexes and regions. Plant cover values obtained within the quadrats were averaged for each permanent plot to create a database with one row per plot and one column per species plus 'bare peat and litter' (dimensions  $274 \times 133$ , range of years since restoration = 5–10).

Our analytical approach included two steps: (1) we classified each plot into different restoration outcome categories using the plant community data (including 'bare peat and litter'); (2) we then searched for the combination of readily measurable vegetation descriptors - plant strata and time since restoration - that best predicted the restoration outcome categories.

(1)In the first step, to control for the effect of different numbers of years since restoration at the restoration sites chosen for analyses. а redundancy analysis (RDA) was run to remove the effect of years since restoration from the post 5-10 years plant composition matrix (González et al. 2014). Therefore, the RDA was run with only one explanatory variable "age", and this accounted for differences in age between the various restoration sites and plots when assigning plant category. A Hellinger transformation was applied to species cover so that a Euclidean distance based method such as RDA (Legendre & Gallagher 2001) could be used. The significance of the RDA was assessed using a permutation test with 9999 randomised runs (Legendre & Legendre 2012). The residuals of the RDA were classified into k groups by a k-means partitioning technique. K-means partitioning is a nonhierarchical clustering method that finds a single partition of a set of objects such that the objects within each cluster are more similar to one another than to objects in the other clusters (Legendre &

Legendre 2012). The number of clusters is determined a priori by the user. We chose a number that maximised the Calinski-Harabasz (Milligan 1996). The criterion species composition of each group was explored to assign a restoration outcome plant category to each of the obtained k groups. These restoration outcome categories were interpreted as more or less "successful" on the basis of how much they resembled desirable plant communities with the re-establishment of moss species typical of Sphagnum dominated peatlands known to have a good peat accumulation potential.

(2) We then conducted a linear discriminant analysis (LDA) to find the combination of readily measurable vegetation descriptors (plant strata and time since restoration, explained below) that best segregated restoration outcome categories. LDA is a method of linear modelling originally proposed by Fisher (1936) and developed by Rao (1948, 1952) that searches for the best combination of descriptors to discriminate among previously defined groups of observations. In our case, the plots in the restoration sites were treated observations. The restoration outcomes as categories defined after examining vegetation composition in the post 5-10 year vegetation the matrix using k-means partitioning corresponded to the plant groups.

One of the main advantages of LDA is that it makes it possible to allocate new objects to one of the groups by providing classification functions that are computed from the original descriptors (Legendre & Legendre 2012). Classification functions look like multiple regression equations, with a constant and a weight for each original descriptor, and are computed for each group. A classification score for each new object is calculated for each classification function. Then, the object is assigned to the group whose classification function gave the highest score. In our case, the LDA model, and particularly its classification functions, served as a tool to assign one - and only one - restoration outcome category to which a new restored plot from a new restoration site (not included in the 274 plots and 66 restoration sites used to build the model) belongs.

Since a higher number of observations than the number of descriptors plus the number of groups is recommended (Ter Braak 1987), our analysis included only a few readily measurable vegetation descriptors, namely total cover of (1) trees and shrubs excluding ericaceous species, (2) ericaceous shrubs, (3) herbs, (4) *Sphagnum* spp. and (5) *Polytrichum* spp. The first three descriptors were obtained from Table 1. Median and range of plant strata, and frequency and mean cover when present (error is  $\pm 1$  SE) of all taxa identified in the 274 permanent plots on 66 restored peatlands clustered into three restoration outcome categories after k-means partitioning: (a) *Sphagnum*-cottongrass, (b) *Polytrichum-Sphagnum*, (c) Low cover-diverse peatland plants. Key species are highlighted in grey. \*species not typical of peatland ecosystems. The a, b, and c categories are equivalent to the categories "Successful", "*Polytrichum*-dominated" and "Failed" of González *et al.* (2013, 2014) and to the categories "Successful", "*Polytrichum*-dominated" and "Bare peat-dominated" of González & Rochefort (2014).

	(a)		(b)		(c)	
	Sphagnum-	cottongrass	Polytrichu	m-Sphagnum	Low co peatla	ver-diverse Ind plants
	(109	plots)	(78	s plots)	(87	′ plots)
Strata						
0 = absent, 0.5 = present, 1 = 1–10 %, 2 = 11–25 %,						
3 = 26–50 %, 4 = 51–75 % and 5 = 76–100 %	Median	Range	Median	Range	Median	Range
Bare peat and litter	1	0–5	2	0–3	4	2–5
Trees and shrubs excluding ericaceous species	1	0–3	0.5	0–3	0.5	0–4
Ericaceous shrubs	2	0.5–5	1	0.5–4	1	0–4
Herbs: forbs and graminoid plants	4	1–5	1	0–5	1	0.5–5
Species	Freq	Cover	Freq	Cover	Freq	Cover
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Total peatland species	100	106.7 ± 3.0	100	90.3 ± 3.0	100	30.6 ± 2.5
Richness (number of taxa)	16	± 0	15	5 ± 1	1	0 ± 1
Total non-peatland species	57	5.9 ± 1.0	55	$2.9 \pm 0.6$	60	5.1 ± 0.9
All mosses	100	46.4 ± 2.4	100	68.2 ± 2.8	77	13.0 ± 1.5
Sphagnum	99	36.0 ± 2.2	96	23.4 ± 2.8	52	$6.9 \pm 1.4$
Sub-genus Acutitolia	98	26.4 ± 1.9	94	20.9 ± 2.6	46	5.8 ± 1.2
Sphagnum flavicomans	15	2.0 ± 0.5	5	1.6 ± 0.8	5	0.8 ± 0.6
Sphagnum fuscum	56	3.6 ± 0.5	69	6.7 ± 1.4	14	2.7 ± 1.2
Sphagnum rubellum	98	24.0 ± 1.8	90	16.2 ± 2.2	46	4.9 ± 1.1
Sphagnum russowii	4	0.8 ± 0.4	3	10.9 ± 10.8	0	-

Species	Freq.	Cover	Freq.	Cover	Freq.	Cover
Sub-genus Cuspidata	54	3.1 ± 0.7	31	3.7 <i>±</i> 1.8	9	6.0 ± 4.4
Sphagnum angustifolium	34	2.2 ± 0.6	31	3.7 ± 1.8	8	2.6 ± 1.5
Sphagnum cuspidatum	1	0.0 ± 0.0	0	-	0	-
Sphagnum fallax	28	3.4 ± 0.9	4	0.3 ± 0.2	3	9.9 ± 9.9
Sub-genus Sphagnum	97	8.3 ± 1.1	76	2.4 ± 0.7	30	1.2 <i>±</i> 0.4
Sphagnum magellanicum	97	8.0 ± 1.0	76	2.4 ± 0.7	30	1.2 ± 0.4
Sphagnum papillosum	7	3.6 ± 2.2	0	-	0	-

Bryophytes other than Sphagnum	98	11 <i>±</i> 1.1	100	45.6 ± 2.6	76	8.5 <i>±</i> 1.1
Aulacomnium palustre	1	17.6 ± 0.0	3	0.3 ± 0.2	9	4.8 ± 3.1
Bryum species*	1	0.2 ± 0.0	1	2.8 ± 0.0	16	3.3 ± 1.0
Campylium stellatum*	0	-	0	-	2	0.2 ± 0.0
Ceratodon purpureus*	0	-	0	-	3	1.2 ± 0.6
Dicranella cerviculata	27	0.9 ± 0.2	44	1.7 ± 0.8	37	1.6 ± 0.4
Dicranum undulatum	0	-	1	0.2 ± 0.0	1	0.1 ± 0.0
Dicranum species	39	0.3 ± 0.1	40	1.8 ± 0.7	26	1.0 ± 0.3
Gymnocolea inflata	0	-	0	-	0	-
Hamatocaulis vernicosus	1	0.6 ± 0.0	0	-	1	1.2 ± 0.0
Hypnum lindbergii	0	-	0	-	1	2.1 ± 0.0
Leiomylia anomala	58	2.6 ± 0.5	56	3.1 ± 0.7	24	0.6 ± 0.1
Leptobryum pyriforme	1	1.5 ± 0.0	0	-	0	-
Marchantia polymorpha	1	4.3 ± 0.0	1	0.1 ± 0.0	6	1.7 ± 1.5
Hepatic other than Leiomylia anomala	35	1.6 ± 0.5	22	0.3 ± 0.1	13	0.5 ± 0.2
Palustriella falcate	1	0.3 ± 0.0	0	-	0	-
Plagiomnium medium*	1	0.3 ± 0.0 -	0	-	- 0	-
Pleurozium schreberii	0		0	-	- 3	0.1 ± 0.0
Pohlia nutans	54	1.4 ± 0.7	74	1.2 ± 0.2	21	1.0 ± 0.4
Polytrichum strictum	85	8.6 ± 0.8	100	41.1 ± 2.6	54	7.3 ± 1.0
Polytrichum commune	5	1.2 ± 1.2	18	1.5 ± 0.8	3	1.3 ± 1.2
Sanionia uncinata	0	-	0	-	1	0.2 ± 0.0
Thuidium recognitum*	0	-	0	-	1	3.4 ± 0.0
Tomentypnum nitens*	0	-	0	-	1	2.1 ± 0.0

Species	Freq.	Cover	Freq.	Cover	Freq.	Cover
Lichens	38	0.5 <i>±</i> 0.1	64	1.8 <i>±</i> 0.6	39	2.4 ± 0.8
Cladonia species	20	0.6 ± 0.2	32	1.5 ± 0.7	25	0.8 ± 0.2
Lichens	34	0.2 ± 0.0	53	1.3 ± 0.5	32	2.2 ± 0.9
Herbs	100	44.1 <i>±</i> 2.1	92	11.6 <i>±</i> 1.5	100	13.5 <i>±</i> 1.5
Agrostis species*	1	0.5 ± 0.0	6	$0.3 \pm 0.1$	28	0.9 ± 0.5
Anaphalis margaritacea*	1	$3.8 \pm 0.0$	3	$0.6 \pm 0.4$	0	-
Beckmannia svzigachne*	0	-	0	-	2	0.1 ± 0.0
Bidens cernua*	0	-	0	-	7	$0.4 \pm 0.1$
Bidens frondosa*	0	-	3	0.3 ± 0.2	0	-
Calamagrostis canadensis	1	0.3 ± 0.0	8	1.0 ± 0.6	2	0.5 ± 0.3
Carex aquatilis	1	$2.5 \pm 0.0$	5	4.7 ± 0.8	2	$3.9 \pm 2.1$
Carex brunnescens	1	$1.5 \pm 0.0$	1	$0.1 \pm 0.0$	8	22.2 ± 11.9
Carex canescens	6	5.8 ± 1.3	1	1.0 ± 0.0	1	1.3 ± 0.0
Carex disperma	0	-	1	0.5 ± 0.0	2	0.4 ± 0.1
Carex flava	0	-	0	-	1	$0.3 \pm 0.0$
Carex hvstericina*	0	-	0	-	1	1.3 ± 0.0
Carex limosa	0	-	1	0.5 ± 0.0	0	-
Carex magellanica	1	3.8 ± 0.0	1	2.5 ± 0.0	0	-
Carex oligosperma	14	6.8 ± 2.1	15	2.3 ± 0.8	18	3.8 ± 1.2
Carex rostrata	0	-	1	0.3 ± 0.0	0	-
Carex trisperma	8	3.8 ± 1.3	9	0.8 ± 0.4	1	0.5 ± 0.0
Carex utriculata	0	-	0	-	5	3.4 ± 2.5
Chamerion angustifolium	2	0.3 ± 0.2	8	1.3 ± 0.7	2	0.4 ± 0.3
Cirsium arvense*	0	-	0	-	2	0.9 ± 0.4
Coptis trifolia	1	0.1 ± 0.0	0	-	0	-
, Drosera rotundifolia	39	0.3 ± 0.0	28	0.4 ± 0.0	18	0.4 ± 0.1
Eleocharis palustris	0	-	0	-	2	4.3 ± 3.8
Elymus trachycaulus*	0	-	0	-	1	0.3 ± 0.0
Epilobium canum*	0	-	1	0.9 ± 0.0	1	1.4 ± 0.0
Epilobium ciliatum*	0	-	0	-	1	0.3 ± 0.0
Epilobium ciliatum ssp. glandulosum*	0	-	0	-	1	0.1 ± 0.0
Ėguisetum arvense	3	12.3 ± 5.8	3	8.1 ± 3.9	1	0.5 ± 0.0
Eriophorum angustifolium	48	18.1 ± 3.1	6	2.6 ± 1.9	20	2.4 ± 0.6
Eriophorum vaginatum var. spissum	94	31.6 ± 2.0	79	7.5 ± 1.1	66	8.3 ± 1.4
Eriophorum virginicum	9	0.4 ± 0.1	15	2.9 ± 2.5	7	2.5 ± 1.0

Species	Freq.	Cover	Freq.	Cover	Freq.	Cover
Euthamia graminifolia	5	2.4 ± 1.0	10	2.1 ± 0.8	11	0.6 ± 0.2
Gramineae species	0	-	1	0.1 ± 0.0	1	0.1 ± 0.0
Geocaulon lividum	0	-	1	0.1 ± 0.0	0	-
<i>Hieracium</i> species *	1	0.3 ± 0.0	5	0.8 ± 0.5	2	0.4 ± 0.2
Hordeum jubatum*	0	-	1	0.5 ± 0.0	5	1.8 ± 0.6
Hypericum virginicum*	1	4.3 ± 0.0	0	-	1	0.1 ± 0.0
Juncus brevicaudatus	3	4.6 ± 4.4	15	1.0 ± 0.4	25	3.4 ± 0.8
Juncus bufonius	4	6.8 ± 6.1	3	0.3 ± 0.1	3	0.8 ± 0.2
Juncus effusus	1	0.5 ± 0.0	1	8.3 ± 0.0	0	-
Juncus nodosus	0	-	0	-	1	0.1 ± 0.0
Lycopus uniflorus	2	0.5 ± 0.0	5	0.5 ± 0.1	8	0.4 ± 0.2
Phleum pratense*	0	-	0	-	1	4.4 ± 0.0
Phragmites australis*	0	-	0	-	6	3.3 ± 2.6
Poa palustris*	0	-	1	0.1 ± 0.0	3	0.9 ± 0.4
Poa other than P. palustris*	0	-	1	2.4 ± 0.0	0	-
Potentilla nivea*	0	-	3	0.3 ± 0.0	1	0.1 ± 0.0
Potentilla norvegica*	0	-	1	0.3 ± 0.0	5	0.2 ± 0.1
Ranunculus acris*	1	0.4 ± 0.0	0	-	1	0.3 ± 0.0
Rhynchospora alba	1	0.1 ± 0.0	0	-	21	5.7 ± 1.2
Rumex acetosella*	0	-	3	0.1 ± 0.0	0	-
Rumex occidentalis*	0	-	1	2.8 ± 0.0	2	0.2 ± 0.1
Sarracenia purpurea	19	0.7 ± 0.1	9	1.0 ± 0.7	8	0.3 ± 0.1
Scirpus atrovirens	2	0.8 ± 0.6	1	1.9 ± 0.0	0	-
Scirpus cyperinus	23	10.1 ± 2.5	27	6.1 ± 2.1	16	4.7 ± 2.6
Solidago rugosa	5	0.7 ± 0.4	5	1.8 ± 1.0	1	0.3 ± 0.0
Solidago other than S. rugosa	0	-	3	0.4 ± 0.1	0	-
Sonchus arvensis*	0	-	1	0.1 ± 0.0	0	-
Sonchus asper*	0	-	1	0.6 ± 0.0	8	1.7 ± 0.7
Symphyotrichum boreale*	0	-	0	-	2	0.3 ± 0.1
Symphyotrichum falcatum*	0	-	0	-	1	1.8 ± 0.0
Symphyotrichum novae-angliae*	0	-	0	-	3	1.1 ± 0.7
Taraxacum officinale*	0	-	0	-	2	0.3 ± 0.2
Triglochin palustris	0	-	0	-	1	0.3 ± 0.0
Typha latifolia*	3	2.5 ± 2.4	0	-	20	2.8 ± 1.0
Vaccinium vitis-idaea	0	-	3	1.7 ± 0.6	2	2.4 ± 0.6
Other herbs	12	2.3 ± 1.7	15	2.2 ± 1.7	3	0.3 ± 0.0

Species	Freq.	Cover	Freq.	Cover	Freq.	Cover
Ericaceae	99	14.7 <i>±</i> 1.3	100	9.1 ± 0.9	84	6.4 <i>±</i> 1.1
Andromeda polifolia var. latifolia	17	1.6 ± 0.6	26	0.9 ± 0.2	23	1.0 ± 0.2
Chamaedaphne calyculata	94	7.6 ± 0.8	92	4.9 ± 0.7	71	4.1 ± 0.7
Empetrum nigrum	10	1.4 ± 0.3	4	0.9 ± 0.2	3	0.2 ± 0.0
Gaultheria hispidula	4	0.5 ± 0.0	0	-	0	-
Gaylussacia baccata	0		- 3	0.7 ± 0.1	7	1.4 ± 0.4
Kalmia angustifolia	77	1.9 ± 0.3	65	1.4 ± 0.2	30	1.2 ± 0.4
Kalmia polifolia	60	0.8 ± 0.1	73	0.7 ± 0.1	52	0.8 ± 0.1
Rhododendron canadense	47	0.6 ± 0.1	10	0.6 ± 0.1	9	0.9 ± 0.5
Rhododendron groenlandicum	79	3.4 ± 0.6	81	1.8 ± 0.3	45	1.3 ± 0.4
Rhododendron other than R. canadense and R. groenlandicum	2	0.6 ± 0.3	4	0.4 ± 0.1	0	-
Vaccinium angustifolium	25	1.1 ± 0.3	27	1.1 ± 0.2	5	0.9 ± 0.8
Vaccinium macrocarpon	6	0.8 ± 0.2	3	0.2 ± 0.1	1	0.1 ± 0.0
Vaccinium myrtilloides	4	1.8 ± 0.8	8	0.2 ± 0.1	0	-
Vaccinium oxycoccos	89	1.8 ± 0.3	83	1.2 ± 0.2	64	1.0 ± 0.2
Shrubs	29	4.0 ± 1.0	28	3.8 ± 1.3	37	6.9 <i>±</i> 1.8
Aronia melanocarpa	11	0.9 ± 0.3	3	0.3 ± 0.2	5	0.2 ± 0.1
llex mucronata	1	2.0 ± 0.0	0	-	0	-
Mvrica gale	14	5.1 ± 1.6	0	-	2	0.4 ± 0.1
Rubus chamaemorus	0	-	3	0.1 ± 0.0	0	-
Rubus idaeus*	1	2.3 ± 0.0	- 0	-	0	-
Rubus other than R. chamaemorus and R. idaeus	3	1.0 ± 0.5	1	5.0 ± 0.0	0	-
Salix species	6	5.1 ± 2.8	19	4.6 ± 1.8	31	8.0 ± 2.0
Spiraea alba var. latifolia	1	2.0 ± 0.0	10	0.9 ± 0.3	1	3.0 ± 0.0
Trees	69	5.6 ±0.9	62	3.3 ± 0.7	43	2.9 ± 0.7
Abies balsamea	1	0.5 ± 0.0	0	-	0	
Alnus species	14	$2.5 \pm 0.6$	6	1.3 ± 0.5	0	-
Betula species *	54	5.8 + 1.0	42	$2.4 \pm 0.6$	24	2.8 + 0.7
Larix laricina	18	$1.0 \pm 0.3$	13	$0.5 \pm 0.2$	8	$0.6 \pm 0.3$
Picea mariana	19	$0.8 \pm 0.1$	14	$2.9 \pm 1.4$	15	$1.5 \pm 0.3$
Picea other than P. mariana	3	$0.6 \pm 0.2$	8	$1.4 \pm 0.7$	1	$0.5 \pm 0.0$
Pinus banksiana*	0 0	-	3	$0.6 \pm 0.4$	1	$0.1 \pm 0.0$
Populus species *	4	0.6 ± 0.2	15	2.0 ± 0.9	14	2.0 ± 0.8
Prunus species *	1	0.5 ± 0.0	0	-	0	-

the visual estimates in the permanent plots; while the last two were the sums of all Sphagnum spp. and Polytrichum spp. identified in the 12 quadrats of  $25 \text{ cm}^2$ , transformed to the seven-point scale used for the plant strata data to improve normality and homogeneity of the within-group covariance matrices (Legendre & Legendre 2012, Borcard et al. 2011). The choice of descriptors was based on differences between restoration outcome categories and previous research (González et al. 2013, 2014; González & Rochefort 2014). The 'bare peat and litter' stratum was not used as one of the descriptors to avoid circularity, as it was already used in the kmeans clustering. Having a low number of descriptors will also facilitate the task of the restoration practitioner when evaluating the success of restoration, by reducing the amount of information to be collected in the field. A sixth descriptor (6: time since restoration in years) was added when running the LDA models because it was shown to have an effect on vegetation composition in the previous step (RDA) and, therefore, we anticipated that it could also have some effect on the plant strata.

LDA models were calibrated using 75 % of the restoration sites (49 restoration sites), which were randomly chosen within each region and year since restoration and included 205 plots. The remaining 25 % (17 restoration sites including 69 plots) were used to validate the model. Calibration and validation were performed by comparing the observed vs. the predicted restoration outcome categories of the respective (75 % and 25 %) sets of plots. The accuracy of the calibration and validation datasets was defined as the percentage of objects correctly classified by the classification functions.

All analyses were carried out using R (version 3.2.4) software (R Development Core Team 2017). More precisely, RDA and k-means partitioning were run using the functions "rda" and "cascadeKM" of the "vegan" package (Oksanen *et al.* 2011); and LDA was computed using the function "Ida" in the "MASS" package (Venables & Ripley 2002).

#### RESULTS

## Classification of restoration sites into restoration outcome categories

The "time since restoration" of the restored peatlands had a significant but small effect on vegetation composition, as time since restoration explained only 1.6% of the variability in the species composition of the vegetation matrix (RDA, permutation test, 9999 runs, F = 5.424, P < 0.001). With at least five years since restoration, differences in the plant communities between restoration sites outweighed differences within restoration sites due to change over time. The small percentage of variability in vegetation explained by time since restoration was probably due to differences in architecture and growth rate between species. Woody species with slow growth rates such as Chamaedaphne calyculata and Rhododendron groenlandicum, and hummock species that usually expand more slowly such as Sphagnum fuscum (Pouliot et al. 2011, Rochefort et al. 2013, Poulin et al. 2013, González et al. 2014), were most positively correlated to time since restoration. The 'bare peat and litter' component and Eriophorum vaginatum, one of the few species that can spontaneously colonise peatlands after peat extraction activities (Tuittila et al. 2000, Campbell et al. 2003), occupied more surface area at the more recently restored sites.

The k-means partitioning performed on the residuals of the RDA separated the 274 plots into three restoration outcome plant categories, namely 'Sphagnum-cottongrass', 'Polytrichum-Sphagnum' and 'Low cover-diverse peatland plants'. Overall, differences in frequency and cover of the species present could be subtle across restoration outcomes plant categories (Table 1; González et al. 2013). This underscores the importance of combining species when assessing restoration outcomes (González et al. 2014). The first category included 109 plots and was characterised by a dense moss carpet having a cover of 46 % on average for all plots (frq. = 100 %), with 78 % of the carpet dominated by Sphagnum mosses (36% cover). The Sphagnum moss carpet was dominated by species of the subgenus Acutifolia where Sphagnum rubellum was the most common species for practically all plots (frequency of occurrence = 98%; mean cover = 24%). The dominating Sphagnum moss carpet was often associated with the cottongrass species Eriophorum vaginatum (frq. = 94 %; cov. = 32 %) and Eriophorum angustifolium (frq. = 48 %; cov. = 18 %), and with a lower but relatively constant presence of Polytrichum strictum (frq. = 85 %; cov. = 9 %). This category was defined as the 'Sphagnum-cottongrass' community (Table 1). A second category of 78 plots was characterised by a dense moss carpet of 68 % cover on average with 60 % of the carpet dominated by P. strictum (frq. = 100 %; cov. = 41 %) and a good presence of Sphagnum species (34 % of the moss carpet), again dominated by the Acutifolia sub-genus (frq. = 94 %; cov. = 21 %). This category was defined 'Polytrichum-Sphagnum' community as the (Table 1). A third category of 87 plots was mainly bare of vegetation ('Bare peat and litter': median cover = 51-75 %), but with *E. vaginatum*, *P. strictum* 

and *S. rubellum* present in more than half of the plots at a cover 8 %, 7 % and 5 % respectively. This category was defined as 'Low cover-diverse peatland plants' community (Table 1). The restoration sites did not group by region but, rather, by restoration outcome categories. However, there were small regional differences in the proportion of restoration sites and plots corresponding to each restoration outcome. For example, there was higher occurrence of 'Low cover-diverse peatland plants' in the western region.

# Building the LDA model to declare restoration success in a time window of 5–10 years post-restoration

The LDA model correctly classified 91 % of the calibration data: 93, 86 and 93 % of the 'Sphagnumcottongrass', 'Polytrichum-Sphagnum' and 'Low cover-diverse peatland plants' plot categories, respectively (Figure 1a); and 93 % of the validation data: 93, 91 and 95 % of plots per category in the same sequence (Figure 1b). For example, from the 23 plots predicted as 'Polytrichum-Sphagnum' in the validation dataset (dotted black polygon, Figure 1b), 21 were correctly classified (triangles in Figure 1b) and only one of the 'Sphagnum-cottongrass' and one of the 'Low cover-diverse peatland plants' plots were incorrectly predicted (circle and cross, respectively, in Figure 1b). The first LDA axis divided 'Low cover-diverse peatland plants' plots from 'Sphagnumcottongrass' and 'Polytrichum-Sphagnum' plots, while the second axis mainly divided 'Sphagnumcottongrass' from 'Polytrichum-Sphagnum' plots (Figure 1a, b). Not surprisingly, the total cover of Polytrichum and Sphagnum spp. contributed most to the discrimination between the two categories dominated by peatland mosses and the 'Low coverdiverse peatland plants' category (arrows in Figure 1). Herbs and ericaceous shrubs were also coupled to moss-dominated plots, while only trees and time since restoration ("age" in Figure 1) discriminated plots in the direction of 'Low cover-diverse peatland plants' communities. Polytrichum and Sphagnum spp. helped to discriminate Sphagnum-cottongrass from Polytrichum-Sphagnum plots along the second axis (red arrows in Figure 1) but the total cover of herbs (positively related to Sphagnum-cottongrass plots) was even more important. This was not surprising, as Eriophorum species were much more abundant in Sphagnum-cottongrass plots than in Polytrichum-Sphagnum plots as explained above. The structure of the LDA model is provided in the Appendix: discriminant functions (Table A1) and classification functions (Table A2).

#### DISCUSSION

# Defining success from restoration outcome categories

Once a surveyed plot from a restored peatland has been assigned to a restoration outcome category, as would be done using the declaration tool developed in this project, how do you declare success? To answer this question we must examine the plant communities of the restoration outcome categories using two approaches. The first approach is to rely on the criteria proposed by regulating agencies, which usually stem from knowledge developed by experts having wide field experience of natural, degraded or restored peatlands. The second approach is to conduct a comparison with reference ecosystems of the region, but this does not take into account the notion of trajectory - the comparison is more static in time. Nevertheless, there are still some principles that need to be met to launch a degraded peatland towards successful recovery. From Chirino et al. (2006), for instance, we learn that if Sphagnum moss establishment is very low (less than 4 %) after the first growing season, recovery will remain very slow in subsequent years. On the other hand, if at least 5 % cover of Sphagnum mosses associated with Polytrichum strictum (around 15 to 20 % cover) is reached in the first year of establishment, a good trajectory can be expected. However, it is not recommended to declare success only one year after restoration because climate can still greatly influence the outcome. Evaluation after a minimum of five years post-restoration is often best, as recommended for other types of restoration (Wortley et al. 2013, González et al. 2015).

In this study, the restored sites were evaluated 5-10 years post-restoration and outcomes were compared to 159 natural peatlands in eastern Canada (L. Rochefort, unpublished data). Among the three restoration outcome categories, the Sphagnumcottongrass category had the highest cover of Sphagnum. The overall cover was 36% for the restored sites (Table 1) whereas the average Sphagnum moss cover is 84 % in natural peatland sites. This represents a 43 % recovery of the Sphagnum layer usually found in natural peatlands. The Sphagnum carpet of the plots belonging to this restoration outcome was associated with 11 % of peatland bryophytes (Table 1). This bryophyte abundance is similar to the 9% found in natural peatlands. The co-dominant cottongrass species (Eriophorum vaginatum; 32 % cover) of the community still has a relatively high coverage value post-restoration when compared to the usually less



Figure 1. Linear discriminant analysis (LDA) of restoration outcome categories based on a set of readily measurable vegetation descriptors (seven-point ordinal scale) and years since the end of restoration work (Age). Vector length has been multiplied by 4.5 to improve visual clarity. All vegetation plots within the limits of each polygon were depicted in the bidimensional space using the discriminant functions (Table A1 in Appendix) and assigned to the corresponding restoration outcome category using the classification functions (Table A2). (a) Calibration step (75 % of the restoration sites; 49 restoration sites including 205 plots) and (b) Validation step (25 % of the restoration sites; 17 restoration sites including 69 plots). Note that the accuracy of the model was assessed on the basis of the percentages of these plots that it classified correctly (91 % for calibration data and 93 % for validation data).

than 15 % cover in natural peatlands. This is not of much concern as E. vaginatum is known to flower readily in recently restored Sphagnum peatlands, to dominate between five and eight years postrestoration, then to decline as the Sphagnum carpet develops (Rochefort et al. 2013). Consequently, we regard the Sphagnum-cottongrass community as one of the most successful scenarios given that these restored plots follow the vegetation recovery of Boisdes-Bel (BDB) research station, where it is known that a positive carbon sequestration function had returned 14 years post-restoration (Nugent et al. 2018). The Polytrichum-Sphagnum category is also declared a good restoration outcome because of its excellent total bryophyte cover (68 % on restored plots, see Table 1, compared to 92 % in natural sites), which is dominated by *Polytrichum strictum* (41 %) and Sphagnum mosses (23 %) and represents a 74 % recovery of the bryophyte layer compared to natural peatlands. The dominance of Polytrichum strictum over Sphagnum mosses in the early stages of recovery post-restoration or after fire is well known (Groeneveld et al. 2007, Benscoter & Vitt 2008, Rochefort et al. 2013). The third restoration outcome, Low cover-diverse peatland plant category, was the least successful of the three, having recovered only 14 % of the bryophyte layer (including 8 % of the Sphagna, Table 1) compared to natural peatlands (92%). Nevertheless, sites belonging to this category can still lead to a peatland ecosystem given enough time, as shown by Gonzalez & Rochefort (2014), for two reasons: first, because the category is well recolonised with diverse taxa present in the other two categories and in natural peatlands; and secondly because of the absence of invasive species and the low presence of ruderal species not typical of peatland ecosystems (Total non-peatland species frq. = 60 % and cov. = 5 %, Table 1). However, when a site falls into this category, it should be viewed as a warning (raising a flag) to do a more comprehensive assessment of the site to evaluate whether some landscape constraints to the restoration process are evident and could be rectified (failed dams or berms for rewetting the sites, erosion, gullying, water ponding, beaver activity, etc.).

#### Is restoration meeting expectations?

In evaluating restoration projects, restoration practitioners are increasingly adopting goals that are morally valuable and pragmatic rather than ones that strictly reproduce historical pre-disturbance states (Rohwer & Marris 2016). Therefore, declaring success depends on the goals of the restoration project and is highly context dependent. In Canada, a general goal has been to return the characteristic function of carbon sequestration to peatlands that have been degraded by the extraction of either peat (Rochefort 2001, Nugent *et al.* 2018) or oil (wellsites and associated facilities; Environment & Parks 2015).

The restoration outcome categories would together rate the restoration success, 5-10 years postrestoration, for disturbed extracted peatlands in Canada at close to 70%. The 70% value is the combination of all plots from both 'Sphagnumcottongrass' and 'Polytrichum-Sphagnum' categories (109 + 78) compared to all plots surveyed across Canada (274). Furthermore, even the third category defined by this study ('Low cover-diverse peatland plants' community) may be judged a relatively positive restoration outcome if the goal is to exclude invasive exotic and non-peatland plants, and knowing that the target community can still develop slowly (Gonzalez & Rochefort 2014). Nevertheless, this restoration outcome needs further investigation in terms of the factors impeding recovery.

In Canada, only two provinces so far have official guidelines for assessing the efficiency of restoration projects: New Brunswick (Government of New-Brunswick 2001) and Alberta (Environment & Parks 2015). In both cases, they demand that a mix of bryophytes, Sphagna and vascular plant strata must dominate the system, and they consider the notions of species richness and desirable versus undesirable species. When our dataset is evaluated in terms of these criteria, around 70 % of the plots (again, the 'Sphagnum-cottongrass' and 'Polytrichum-Sphagnum' categories) meet the efficiency criteria whereas, as when using natural peatlands as a reference, the plots from the 'Low cover-diverse peatland plants' category raise questions.

From an applied perspective, our work will allow local stakeholders, peatland managers and provincial regulators to establish their desired levels of success and gauge the effectiveness of industrial restoration actions 5–10 years post-restoration by means of a tool that is readily applicable. Indeed, by considering only plant strata and number of years since restoration, restoration outcome categories can be determined unequivocally. We believe our experimental approach could be applied to other ecosystem types as well.

#### How to apply the declaration tool?

The LDA model can be used to assign a restoration outcome category to a plot that was not used in calibration or validation of the model by feeding the LDA classification functions (Table A2) with the plant strata descriptors and the time since restoration. The classification function that obtains the highest

score determines the restoration outcome category for the plot under examination. The LDA discriminant functions (Table A1) are also fed with the plant strata descriptors and the time since restoration, to predict the position of the plot along the gradients given by the LDA axes (Figure 1). Depicting the plot position in the bi-dimensional space helps in determining how close the plot is to the other restoration outcome categories. This is important as it can offer clues to any adaptive management that may be needed. For example, two new plots may be predicted as "Sphagnumcottongrass" but one may be located closer to the 'Low cover-diverse peatland plants' predicted area (solid black polygons, Figure 1) than the other. This may indicate that the vegetation recovery of the former plot needs to be monitored more closely than the latter, as there is a higher risk that it will deviate from the desired trajectory.

It is worth mentioning that a large number of sites was used to build our LDA model. Monitoring of a large number of sites is not frequent in restoration ecology because of budgeting and logistic constraints (González *et al.* 2015). LDA is sensitive to a lack of normality, which is common in species cover data, and for this reason we recommend working only with dominant species or plant groups.

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## Appendix

Table A1. Scores of linear discriminant functions. In order to find the positions of the plots (including newly-restored plots) within the canonical space of our LDA model (Figure 1), subtracting the mean value of each vegetation descriptor before multiplying by each coefficient is necessary. Means were obtained from the calibration dataset. Vegetation descriptors data must be entered in a seven-point ordinal scale: 0 - absence, 0.5 - presence, 1 - 1 - 10%, 2 - 11 - 25%, 3 - 26 - 50%, 4 - 51 - 75% and 5 - 76 - 100%.

	LDA1	LDA2	Means
Trees	0.04633	-0.01722	0.83
Ericaceous shrubs	-0.14144	0.47994	1.34
Herbs	-0.33957	0.69836	2.60
Polytrichum spp.	-0.88398	-0.52980	1.55
Sphagnum spp.	-0.50353	0.10415	1.74
Time since restoration (years)	0.06143	0.03403	7.21

Table A2. Scores of classification functions to predict the restoration outcome categories of plots. Each plot is assigned to the restoration outcome category corresponding to the function receiving the highest score. Vegetation data must be transformed to a seven-point ordinal scale (0=absent, 0.5=present, 1=1-10 %, 2=11-25 %, 3=26-50 %, 4=51-75 % and 5=76-100 %) before being multiplied by the appropriate score.

	Sphagnum- cottongrass	Polytrichum- Sphagnum	Low cover-diverse peatland plants
Constant	-20.97470	-17.7811	-11.19025
Trees	0.99760	1.0168	1.13553
Ericaceous shrubs	-0.51513	-1.8529	-1.69992
Herbs	4.45949	2.6065	2.42625
Polytrichum spp.	2.22077	4.4256	1.12400
Sphagnum spp.	1.19484	1.2355	-0.15544
Time since restoration (years)	2.48899	2.3441	2.57019