

# Continent-wide risk assessment for the establishment of nonindigenous species in Antarctica

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**Invasive alien species are among the primary causes of biodiversity change globally, with the risks thereof broadly understood for most regions of the world. They are similarly thought to be among the most significant conservation threats to Antarctica, especially as climate change proceeds in the region. However, no comprehensive, continent-wide evaluation of the risks to Antarctica posed by such species has been undertaken. Here we do so by sampling, identifying, and mapping the vascular plant propagules carried by all categories of visitors to Antarctica during the International Polar Year's first season (2007–2008) and assessing propagule establishment likelihood based on their identity and origins and on spatial variation in Antarctica's climate. For an evaluation of the situation in 2100, we use modeled climates based on the Intergovernmental Panel on Climate Change's Special Report on Emissions Scenarios Scenario A1B [Nakićenović N, Swart R, eds (2000) *Special Report on Emissions Scenarios: A Special Report of Working Group III of the Intergovernmental Panel on Climate Change* (Cambridge University Press, Cambridge, UK)]. Visitors carrying seeds average 9.5 seeds per person, although as vectors, scientists carry greater propagule loads than tourists. Annual tourist numbers (~33,054) are higher than those of scientists (~7,085), thus tempering these differences in propagule load. Alien species establishment is currently most likely for the Western Antarctic Peninsula. Recent founder populations of several alien species in this area corroborate these findings. With climate change, risks will grow in the Antarctic Peninsula, Ross Sea, and East Antarctic coastal regions. Our evidence-based assessment demonstrates which parts of Antarctica are at growing risk from alien species that may become invasive and provides the means to mitigate this threat now and into the future as the continent's climate changes.**

biological invasions | biosecurity | mitigation | propagule pressure | unintentional introductions

Terrestrial Antarctica remains one of the most pristine environments on Earth. However, much concern now exists that the combination of accelerating climate change and the rapidly growing scope and extent of scientific and tourist activities will lead to substantial environmental degradation (1–3). One of the primary drivers of this change is thought to be the increasing prospect of the establishment of terrestrial, invasive, nonindigenous (or alien) species (4–7). The likelihood of such invasions depends on the numbers of propagules of alien species entering the region, their probability of establishment, and the extent to which these established species are able to spread and alter local ecosystems (8–10). Understanding the initial phases of dispersal and establishment is especially significant for managing the risks posed by invasive alien species because the process of invasion is contingent (11); that is, a species cannot spread into a new area if its propagules have not arrived and become established.

Some evidence now exists that alien vascular plants and other taxa can successfully colonize both the maritime and continental Antarctic (4, 5, 12, 13), and it is clear from similar environments in the sub-Antarctic that, once established, such species can spread and have substantial impacts (5). However, no comprehensive, quantitative assessment of propagule pressure and the likelihood of establishment of alien species has been undertaken for Antarctica, despite the prominence that the potential threats posed by invasive alien species—and the steps required to mitigate them—have been accorded within the Antarctic Treaty System (14, 15).

Globally, most broad-scale assessments of the initial phases of biological invasions focus on intentionally introduced species because of the available data (16). In contrast, much less is known about inadvertent introductions, although they are just as significant a source of biological invasions (17). When such studies are undertaken, they are frequently based on vector numbers (such as human, shipping, or aircraft traffic) as a proxy for propagule pressure and establishment risk (18, 19), rather than on the spatially explicit quantification of the numbers of vectors, the propagule size of each individual vector, and the origins and establishment likelihood of the propagules carried. Thus, inadvertent introductions are far more poorly understood than others (10, 17, 20).

Therefore, in this study we provide a spatially differentiated risk assessment for the introduction and establishment of alien species to Antarctica. We do so based on an assessment of the following factors: (i) Vascular plant propagules (seeds) carried inadvertently by the main categories of visitors to the region—i.e., scientists, tourists, and their support personnel (4, 5, 21)—during the first summer season of the 2007–2008 International Polar Year (IPY); (ii) the characteristics of the species introduced; and (iii) spatial variation in the climate of the continent. Accidental introductions are most significant because intentional introductions are generally prohibited by the Protocol on Environmental Protection to the Antarctic Treaty (14). Previous work elsewhere

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in the broader Antarctic region, on a more limited scale, indicated that an assessment of vascular plant propagules carried by visitors provides a reasonable approximation of inadvertent introductions by other vectors, such as cargo, and of other terrestrial taxa, such as invertebrates (4, 5, 22).

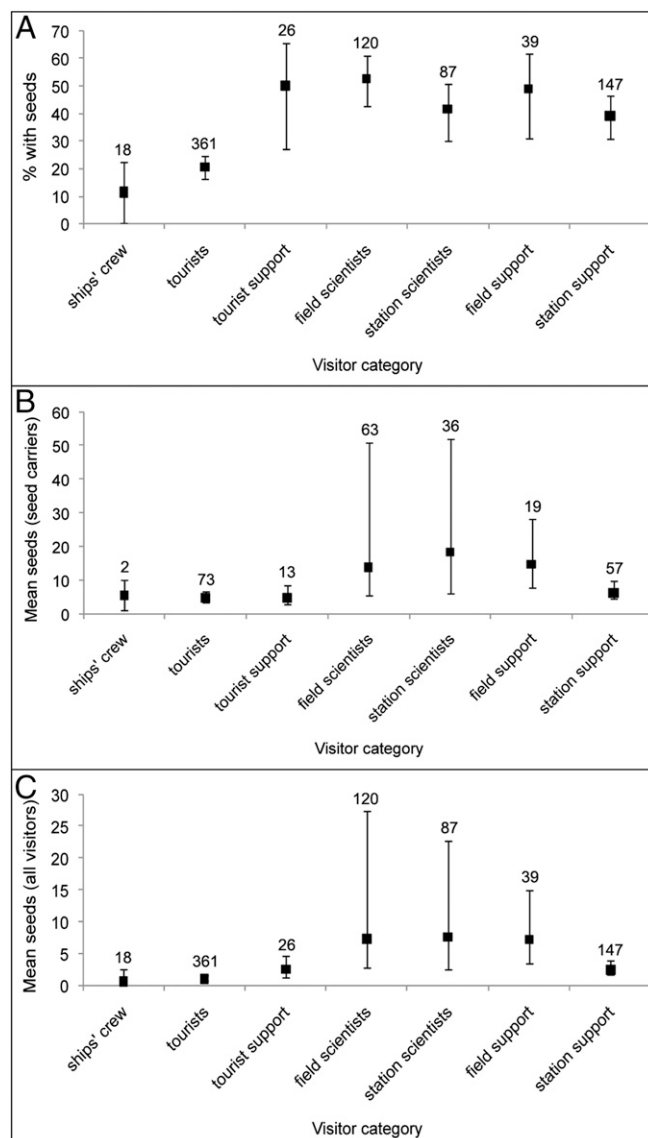
The risk assessment undertaken here involves four major steps. First, the number of seeds on the clothing and bags of visitors traveling to the Antarctic must be quantified. Second, to provide a spatially explicit assessment of propagule pressure, the product of the number of seeds per visitor category and number of visitors from each category must be calculated for each of 81 grid cells representing ice-free areas of Antarctica in which landings occurred during the 2007–2008 IPY season. Third, to assess establishment probability, the proportion of propagules that are from species capable of surviving low-temperature environments must be determined. Here, the most conservative estimate is obtained by identifying the seeds collected from the visitors and estimating the proportion of species whose range includes the sub-Antarctic or Arctic. More liberal estimates of risk are obtained by calculating, from a larger, questionnaire-based survey of visitors, the numbers of visitors from each category that had in the previous 12 mo traveled to an alpine or polar location. The propagule pressure value must then be constrained downward by the median of these two values for each visitor category. Finally, the location of ice-free environments and data on terrestrial climates must be used to identify ice-free areas that might have temperatures suitable for cold-climate vascular plant species based on cumulative degree days (a measure of growing season length). The normalized product of the constrained propagule pressure and the environmental suitability provides a risk index for each grid cell. To estimate how this risk might change into the future, current climates in the preceding analysis are replaced with climates forecast for 2100 using the Intergovernmental Panel on Climate Change (IPCC) Special Report on Emissions Scenarios (SRES), Scenario A1B (7, 23, 24).

## Results

Our sampling, which is representative of the range of visitors to the region, demonstrates that the likelihood of propagule transfer varies with category of visitor (Fig. 1A): Tourists and ships' crews are less likely to transport propagules to the region than are scientists, science support personnel, and tourist support personnel. For those visitors carrying seeds, the number per visitor is similarly variable among categories and averages 9.5 seeds per person (Fig. 1B). In combination, the data show that the largest risk of propagule transfer per visitor is associated with science programs and tourist support personnel, rather than with tourists themselves (Fig. 1C).

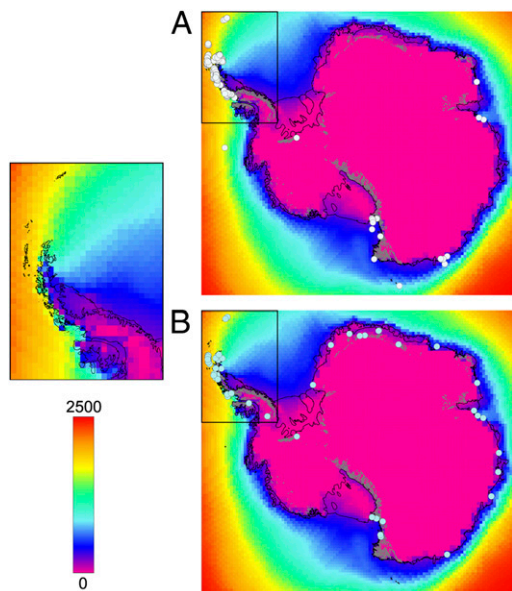
Differences in the numbers of science and tourist visitors temper this among-category variation. Simplifying visitors to these categories, the largest number of visitors to the Antarctic was tourists (including support personnel) (33,054), making 223,095 landings (on average 6.7 landings per visitor) on ice-free areas (Fig. 2A and Table S1). Over the same period, an estimated 7,085 scientists (including support personnel) landed at ice-free areas, concentrated primarily in the McMurdo Sound region of the Ross Sea and the Antarctic Peninsula (Fig. 2B and Table S1). Based on the proportion of visitors per category carrying propagules, the numbers of propagules per individual in each visitor category, and the visitor landings, the probability of propagule transport to the region is highest for the Antarctic Peninsula, followed by the Ross Sea region and then by several sites in East Antarctica. These data also indicate that an estimated 31,732 [95% confidence interval (CI): 8,885–51,021] seeds entered the Antarctic on tourists and 38,897 seeds (95% CI: 24,089–74,534) on scientists during the first summer of the IPY.

Of the 2,686 seeds collected from sampled visitors, 88% were identified to family and 43% to species level. Species-level data show that these propagules include several species (among which are known invaders) from the sub-Antarctic or Arctic regions,



**Fig. 1.** Proportion of visitors carrying seeds, number of seeds per visitor carrying seeds, and number of seeds per visitor across all visitors. (A) Proportion of visitors (mean and 95% bootstrapped CI) carrying seeds within each of the visitor categories. (B) Mean (and 95% bootstrapped CI) number of seeds per visitor by category for those visitors carrying seeds. (C) Mean (and 95% bootstrapped CI) number of seeds per visitor by category for all visitors (i.e., those with and without seed loads). Sample sizes are given above all bars.

similar in climate to parts of the Antarctic (Table S2). The questionnaire-based surveys demonstrate that 53% of the visitors had traveled to cold-climate areas—such as alpine, cold-temperate, or polar environments—in the year before their visit to Antarctica (Table S3). Thus, the seed- and survey-based data on propagule origins suggest that 49–61% (depending on visitor category; Table S4) of propagules reaching the Antarctic are from environments that include species capable of surviving the conditions likely to be encountered in the areas of Antarctica most commonly visited. Annual cumulative degree days for plant growth, a measure of environmental suitability, further indicate those areas where establishment of the cold-climate propagules is likely (Fig. 2). A risk index, based on propagule pressure and origins, and climatic suitability of the ice-free areas of the continent, indicates that the Western Antarctic Peninsula coast and the islands off the coast of the Peninsula have the highest current



**Fig. 2.** Distribution of cumulative annual degree days for 2007–2008 in the Antarctic. These were calculated by using a  $-5^{\circ}\text{C}$  threshold and mean daily near-surface temperature data from the Modern Era Retrospective-analysis for Research and Applications Reanalysis office (provided by the NASA Global Modeling and Assimilation) (50) on a  $0.67^{\circ}$  longitude  $\times$   $0.5^{\circ}$  latitude grid, interpolated to a 50-km square grid. *Inset* shows degree day detail on the Antarctic Peninsula. Ice-free ground is shown in gray. Ice-free landing data for tourists (A) and scientists (B) are shown.

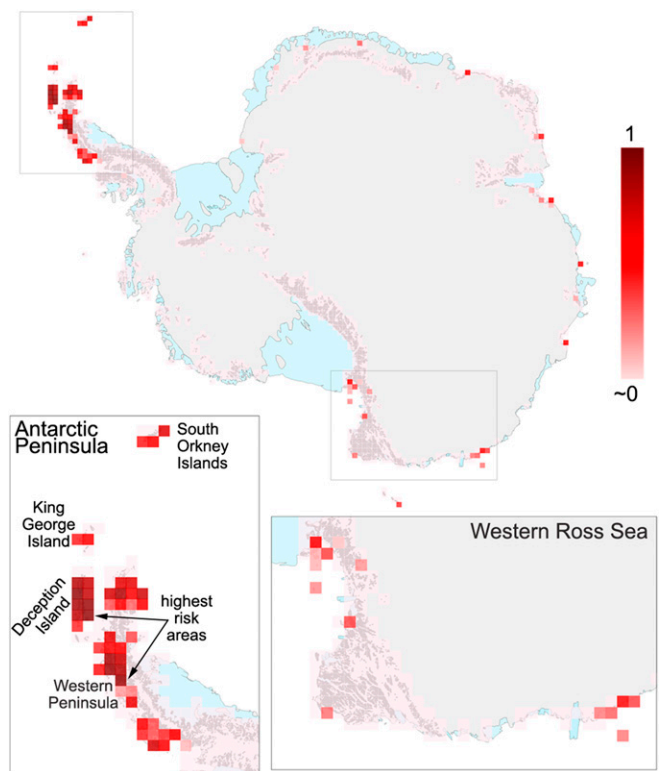
risk for the establishment of alien species (Fig. 3). Most other ice-free areas of Antarctica currently have low risk, with the possible exceptions of the western Ross Sea region and scattered sites around East Antarctica (Fig. 3).

Cumulative degree days across ice-free Antarctica calculated by using climates forecast for 2100 suggest that the risk of alien species establishment continues to be highest in the Antarctic Peninsula area (Fig. 4). However, the number of degree days will also increase substantially in the coastal, ice-free areas to the west of the Amery Ice Shelf and to a lesser extent in the Ross Sea region.

## Discussion

Despite the increased scientific interest in the Antarctic over the period of the IPY and a peak in tourist numbers, the total visitor number was not especially unusual (25), suggesting that the estimate for 2007–2008 is reasonable for calculating visitor-associated, annual anthropogenic propagule pressure on the continent for vascular plants. The propagule identifications also show that the seeds reaching Antarctica represent families known to contain the largest numbers of species that are invasive elsewhere on the planet (26) (Table S5), including species that are known invaders of cold-climate regions such as the Arctic and sub-Antarctic (5, 27). Visitors have also routinely traveled to cold-climate areas before their travel to the Antarctic. Given this propagule pressure, the provenance of many of the seeds, the geographic distribution of visitor landings, and current spatial variation in Antarctic climates, it is clear that several areas of Antarctica are at considerable risk from the establishment of nonindigenous species and that the highest risk sites are those along the Western Antarctic Peninsula.

Substantiation of this assessment is provided by several recent findings. The invasive grass species *Poa annua* is spreading at King George Island from the Arctowski research station to areas much less subject to human traffic (12). Its independent establishment has also recently been documented at three other research stations (namely, General Bernardo O'Higgins, Gabriel Gonzalez



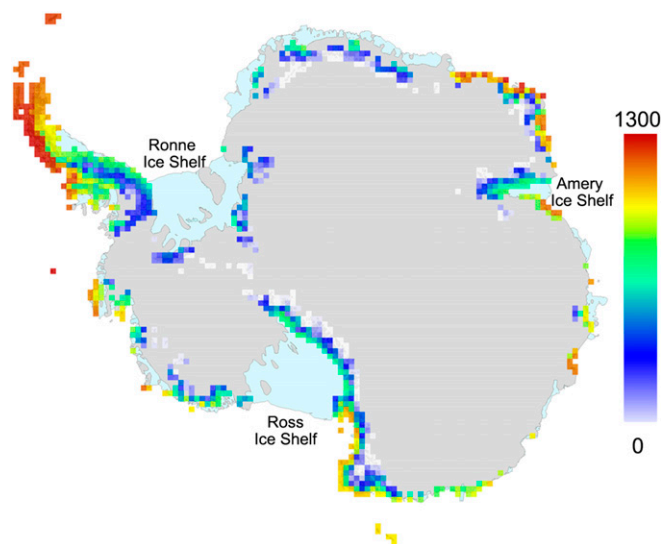
**Fig. 3.** Relative risk of alien vascular plants establishing in Antarctica. Visitor-free, ice-free areas are allocated a small value to represent the minor chance of establishment in the absence of visitor landings. *Insets* show risk index detail for the Antarctic Peninsula and the western Ross Sea. Ice-free areas are shown in dark gray, continental areas in light gray, and ice shelf/ice-tongue areas in light blue.

Videla, and Almirante Brown) along the western margin of the Peninsula.\* These areas coincide with those predicted by our assessment to have the highest risk of alien establishment (Fig. 3). Experimental work has shown that *P. annua* can outcompete other temperate plant species (28), and it dominates lowland, disturbed areas on Southern Ocean islands (5). Consequently, it is recognized as an important invasive species in the broader region. Deception Island (included in the highest risk cell identified; Fig. 3) has also recently been colonized by two vascular plant species of South American origin (13), and two alien springtail species have established at the same site, at least one of which has substantial impacts on some sub-Antarctic systems (29).

In the case of the South American plants on Deception Island, both are wind-dispersed, cold temperate species but were found in an area that has a high visitor frequency. Determining whether the colonization was natural or a direct result of human activity therefore proved particularly problematic (13). Thus, it is clear that as climates change and visitor activity increases and diversifies across the continent, distinguishing natural colonization events associated with warming from inadvertent introductions will become progressively difficult, reflecting similar challenges elsewhere (30). Where such conservation challenges are most likely to grow in significance is made clear by the assessment of conditions in the future under SRES Scenario A1B (24).

Climate change over the next 100 y in Antarctica is expected to be spatially variable, with most regions of the continent cooling at first and then warming as the ozone hole recovers, but with areas

\*Molina-Montenegro MA, Carrasco-Urra F, Rodrigo C, Valladares F, Poster, Scientific Committee on Antarctic Research Open Science Conference, August 3–6, 2010, Buenos Aires, Argentina.



**Fig. 4.** Increase in annual cumulative degree days under SRES Scenario A1B (24) indicating increasing risk of alien species establishment. Increase in annual cumulative degree days, on ice-free areas of Antarctica, using 2090–2100 temperature means to estimate future degree days and annual cumulative degree days from 2007 to 2008 based on a lower temperature threshold of  $-5^{\circ}\text{C}$  for plant establishment. Ice-free areas are shown in dark gray, continental areas in light gray, and ice shelf areas in light blue.

of the Peninsula continuing to warm (7). Thus, although the risk of alien species establishment continues to be highest—and growing—along the Antarctic Peninsula, establishment risks will also rise substantially in the coastal, ice-free areas of the Ross Sea area and in parts of coastal East Antarctica (Fig. 4). The former already has relatively high visitor numbers, indicating that future risks to the area may prove to be considerable. Establishment of alien species will also be promoted by the exposure of new, disturbed ground following glacial retreat. Disturbance is a notable driver of the establishment of such species (31), and elsewhere in the broader Antarctic region, newly exposed glacial forelands are readily colonized by them (5, 12, 32). To some extent, these projections must be considered a current best, evidence-based estimate because they take no account of trends that are more difficult to forecast, such as those in visitor numbers to and areas visited in Antarctica, the range of activities science and tourist visitors might undertake in the future (1), and the impacts of further efforts by the Committee for Environmental Protection of the Antarctic Treaty System to reduce propagule pressure to the region (14). As information on the realized outcomes of these trends and actions becomes available, the assessments of risk posed by inadvertent introductions can be adapted.

By delivering comprehensive evaluations of human-associated propagule pressure and establishment likelihood, differentiated by spatial location and visitor category, our study offers an effective basis for management interventions to mitigate the risks of establishment of nonindigenous species across the entire Antarctic continent, a region of growing international political and biological interest (3, 6, 15, 33, 34). It indicates those visitor groups and areas for which biosecurity measures should be most stringent, those where controls might be less pronounced, and how the spatial arrangement of these areas is likely to change through time. The assessment also offers guidance for planning early detection surveys (35, 36) and support for management decisions about whether new species occurrences are the consequence of anthropogenic transport or natural colonization (30). Such decision-making can be further informed by identifying natural colonization paths at appropriate spatial and temporal resolutions. These include wind trajectories for wind-dispersed species (37), satellite tracks of seabirds (38) that are considered important natural

dispersal agents (39), and genetic data on colonists and populations from elsewhere in the broader region (4, 40). Thus, our study provides an evidence-based, continent-wide risk assessment for the establishment of terrestrial alien species in Antarctica and the understanding required to mitigate this risk, one of the primary conservation goals of the Antarctic Treaty System (14). In so doing, it also demonstrates how a combination of information-rich and modeling approaches can be used to understand and moderate the risks of inadvertent introductions, which are among invasion biology's most significant challenges (10, 17, 20).

## Materials and Methods

**Ethics Statement.** Our study was not on humans but did involve anonymous questionnaires put to human visitors to Antarctica and/or sampling of their outer clothing and bags. In all cases, the intent of the work and onward use of the data were carefully explained by researchers or volunteers in advance of the distribution of the questionnaires and sampling. Any person then not wishing to participate could decline, and samples and/or questionnaires were only taken from individuals who consented fully by completing the questionnaires and/or presenting their gear for sampling. No data identifying individuals by name or any other means were collected at any point (i.e., all samples are anonymous), and none of the sampling was intrusive.

**Propagule Pressure.** We estimated the number of propagules per visitor for  $\sim 2\%$  of all visitors (853 individual scientists, science-support personnel, tourists, tourist support personnel, and ships' crew) to all major areas of the Antarctic during the first summer season of the IPY (2007–2008) by collecting seeds from their outer clothing, footwear, walking poles, day packs, and camera bags (21, 41) (Table S6) using Philips FC9154/01 vacuum cleaners. For most sampled visitors, the material collected from clothing and equipment was retained in a single bag, but for 349 visitors, the material from each item was kept separately (Table S6). Approximately half of the sampled visitors were involved in national Antarctic programs (14 ships/aircraft; 18 voyages) and half in tourist operations (13 ships; 37 voyages).

The plant seeds per sample were counted and sorted into morphologically similar groups (generally corresponding to species). Seeds were identified by comparing them with photographs of seeds in seed atlases (42–45) and online databases (e.g., the Seed Information Database, <http://www.kew.org/msbp/scitech/SIDoverview.htm>; Seedimages.com, [www.seedimages.com](http://www.seedimages.com)). The proportion of visitors carrying seeds was estimated with 95% CI for each visitor category with bias-corrected and accelerated bootstrap methods by using GenStat 13 and R [library(boot); <http://www.r-project.org>]. Similarly, mean number of seeds per visitor was estimated, again with 95% CI, for each visitor category. Sampling was considered to capture the large majority of seeds, although this somewhat underestimated propagule pressure (21). The number of seeds that would drop off a visitor was considered proportional to the number of seeds found during sampling, and propagule viability was considered high (41, 46).

We mapped the numbers of visitors to Antarctica differentiated by their participation in either science (one category) or tourism (two categories: tourists and tourist support personnel), as reported by the International Association of Antarctica Tour Operators (<http://iaato.org>) and the Council of Managers of National Antarctic Programs (47) (Table S1) onto a regular spatial framework of 81 grid cells of  $50 \times 50$  km representing ice-free areas of the continent where visitors have landed (ice-free land data provided by the Australian Antarctic Data Centre from the Antarctic Digital Database V5; © Scientific Committee on Antarctic Research 1993–2006) (48). Before doing so, duplicates, spurious records, and landings on ice-covered areas were removed from the dataset. Propagule pressure per  $50 \times 50$ -km grid cell was calculated per visitor category by multiplying the number of visitor landings ( $N$ ) by the estimated probability of each visitor category carrying seeds ( $P$ ) and by the mean numbers of seeds per visitor from this category [seed carriers only ( $X$ )] (Table S7).

**Establishment Likelihood.** To estimate establishment likelihood, we used information on the origin of the seeds and on the environment they would experience on arrival. For the former, we adopted two approaches. First, for the seeds of species identified to species level that were collected from the visitors, we determined whether or not these species occur in the Arctic/sub-Antarctic (5, 27, 49) and are thus capable of growing in cold environments (Table S2). We assumed that the same proportion of species was able to establish in cold climate areas for identified seeds as for seeds that could not be identified to species level. We estimated that 47% of all seeds carried into the Antarctic by visitors can establish, forming a conservative estimate of establishment. A liberal estimate was determined from a larger, questionnaire-based survey

(available in 10 languages) of 5,659 visitors (i.e., verified questionnaires) to determine what proportion thereof had visited regions with climates similar to those they might encounter in Antarctica (Arctic/alpine/sub-Antarctic/Antarctic) in the 12 mo before their travel to Antarctica (Table S3). A median was then calculated as the value lying between 0.47 (the proportion of viable seeds from the species-level seed analyses) and the proportion of each visitor category that had been to a cold-climate environment (range 0.49–0.61) (Table S4). This median risk proportion ( $R_i$ ) was used to constrain the propagule pressure downward in calculating the risk index.

The most current information on the location of ice-free environments in Antarctica (Antarctic Digital Database V5) (48) and on Antarctic climate (<http://gmao.gsfc.nasa.gov/research/merra/faq.php>) (50) was used to identify ice-free areas that might have climates suitable for low-temperature vascular plant species based on cumulative degree days, assuming that these species can germinate, survive, and grow above  $-5^\circ\text{C}$  (51–54). We used mean daily 2-m air temperatures from the Modern Era Retrospective-analysis for Research and Applications Reanalysis (provided by the NASA Global Modeling and Assimilation Office) (50) on a  $0.67^\circ$  longitude  $\times$   $0.5^\circ$  latitude grid. These data were then spatially interpolated onto the  $50 \times 50$ -km grid.

**Risk Index.** The risk index (RI) for each visitor class ( $i$ ) for each  $50 \times 50$ -km cell ( $j$ ) was calculated as:

$$RI_{ij} = N_{ij} \times P_i \times X_i \times R_i \times DD_j, \quad [1]$$

where  $N_{ij}$  is the number of landings of the  $i$ th visitor class in the  $j$ th cell;  $P_i$  is the proportion of the  $i$ th visitor class that is likely to be carrying seeds;  $X_i$  is the mean number of seeds (for seed carrying visitors) for the  $i$ th visitor class;  $R_i$  is the median of the proportion of seeds from Arctic or sub-Antarctic

areas and proportion of visitors to Arctic, alpine, or sub-Antarctic sites for the  $i$ th visitor category; and  $DD_j$  is the annual cumulative degree days in the  $j$ th cell.

Then, to calculate the overall risk index (ORI) for the  $j$ th  $50 \times 50$  km cell the risk indices of each visitor class (T, tourist; TS, tourist support; S, scientist) were summed:

$$ORI_j = RI_{Tj} + RI_{TSj} + RI_{Sj}. \quad [2]$$

The ORI was then normalized to provide a probability of risk from 0 to 1. Ice-free areas with no visitor landings were assigned a very low risk.

**Future Climate and Risks.** To estimate future risks based on a changing climate, we used the CSIRO Mk3.5 Climate Model ([http://www.cawcr.gov.au/publications/technicalreports/CTR\\_021.pdf](http://www.cawcr.gov.au/publications/technicalreports/CTR_021.pdf)) (55) under Scenario A1B (IPCC SRES) (24) to arrive at a spatially explicit prediction of temperatures in 2100. The degree day values under this climate scenario were calculated as before. All spatial analyses and climate modeling were conducted by using MATLAB 7.12 (Mathworks, Natick, MA) and Manifold System Professional (Version 8.00, Manifold Software Limited, Hong Kong).

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# Supporting Information

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**Table S1. Summary of data obtained from the International Association of Antarctica Tour Operators and the Council of Managers of National Antarctic Programs on visitor landings to ice-free areas of Antarctica**

Visitor class and activity	No. of landings
National program activities*	
Station	6,548
Airfield	493
Refuge	44
Total	7,085
Tourist activities†	
Walking/adventure activity	19,476
Small boat landing	172,904
Station visit	28,511
Science support	1,938
Aircraft landing	266
Total	223,095

\*National Program data represents visitors only, not multiple landings (only data available).

†Tourist data includes multiple landings ( $n = 33,054$  tourists and tourist support personnel).

**Table S2. Species identified in the visitor samples that occur in the Arctic and/or sub-Antarctic**

Family	Genus	Species	Present in Arctic	Present in sub-Antarctic	No. of seeds	No. of samples (visitors)
Amaranthaceae	<i>Atriplex</i>	<i>prostrata</i>	Indigenous	—	1	1
Amaranthaceae	<i>Chenopodium</i>	<i>album</i>	Alien	—	1	1
Araliaceae	<i>Stilbocarpa</i>	<i>polaris</i>	—	Indigenous	1	1
Asteraceae	<i>Achillea</i>	<i>millefolium</i>	Indigenous	Alien	10	1
Asteraceae	<i>Bellis</i>	<i>perennis</i>	Alien	Alien	2	1
Asteraceae	<i>Lapsana</i>	<i>communis</i>	Alien	—	2	1
Asteraceae	<i>Leontodon</i>	<i>autumnalis</i>	Indigenous	—	8	1
Asteraceae	<i>Pleurophyllum</i>	<i>hookeri</i>	—	Indigenous	1	1
Asteraceae	<i>Sonchus</i>	<i>arvensis</i>	Alien	—	1	1
Asteraceae	<i>Sonchus</i>	<i>asper</i>	Alien	—	1	1
Asteraceae	<i>Taraxacum</i>	<i>officinale</i>	Indigenous	Alien	25	4
Betulaceae	<i>Betula</i>	<i>pendula</i>	Indigenous	—	2	2
Betulaceae	<i>Betula</i>	<i>pubescens</i>	Indigenous	—	3	3
Brassicaceae	<i>Arabidopsis</i>	<i>thaliana</i>	Alien	—	2	2
Brassicaceae	<i>Capsella</i>	<i>bursa-pastoris</i>	Alien	Alien	4	3
Caryophyllaceae	<i>Cerastium</i>	<i>fontanum</i>	Alien	Alien	4	2
Caryophyllaceae	<i>Stellaria</i>	<i>media</i>	Indigenous	Alien	3	2
Cyperaceae	<i>Carex</i>	<i>dioica</i>	Indigenous	—	6	3
Cyperaceae	<i>Uncinia</i>	<i>compacta</i>	—	Indigenous	6	3
Cyperaceae	<i>Uncinia</i>	<i>macrolepis</i>	—	Indigenous	17	9
Fabaceae	<i>Trifolium</i>	<i>arvense</i>	Alien	—	1	1
Oxalidaceae	<i>Oxalis</i>	<i>corniculata</i>	Alien	Alien	3	3
Papaveraceae	<i>Papaver</i>	<i>nudicaule</i>	Indigenous	—	308	2
Plantaginaceae	<i>Callitriche</i>	<i>brutica</i>	Indigenous	—	2	2
Plantaginaceae	<i>Plantago</i>	<i>coronopus</i>	Alien	—	1	1
Plantaginaceae	<i>Plantago</i>	<i>lanceolata</i>	Alien	Alien	11	4
Plantaginaceae	<i>Plantago</i>	<i>major</i>	Alien	—	21	1
Poaceae	<i>Arrhenatherum</i>	<i>elatius</i>	—	Alien	6	3
Poaceae	<i>Cynosurus</i>	<i>cristatus</i>	Alien	—	9	4
Poaceae	<i>Dactylis</i>	<i>glomerata</i>	Alien	Alien	2	1
Poaceae	<i>Deschampsia</i>	<i>caespitosa</i>	Indigenous	Alien	3	2
Poaceae	<i>Deschampsia</i>	<i>flexuosa</i>	Indigenous	Alien	2	1
Poaceae	<i>Elytrigia</i>	<i>repens</i>	Alien	Alien	1	1
Poaceae	<i>Festuca</i>	<i>arundinacea</i>	Alien	Alien	73	10
Poaceae	<i>Holcus</i>	<i>lanatus</i>	—	Alien	71	17
Poaceae	<i>Phalaris</i>	<i>arundinacea</i>	Indigenous	—	1	1
Poaceae	<i>Poa</i>	<i>annua</i>	Indigenous	Alien	58	18
Poaceae	<i>Poa</i>	<i>trivialis</i>	Indigenous	Alien	19	14
Poaceae	<i>Triticum</i>	<i>aestivum</i>	Alien	—	2	1
Polygonaceae	<i>Rumex</i>	<i>acetosella</i>	Indigenous	Alien	2	2
Portulacaceae	<i>Montia</i>	<i>fontana</i>	Indigenous	Indigenous	2	1
Rosaceae	<i>Acaena</i>	<i>magellanica</i>	—	Indigenous	8	6
Rosaceae	<i>Malus</i>	<i>sylvestris</i>	Alien	—	4	3

**Table S3. Proportion of 5,659 visitors completing the questionnaire who had traveled to sub-Antarctic, alpine, or Arctic areas in the 12 mo before Antarctic travel**

Area previously visited	No. of visitors to area	Proportion of visitors that visited area
Sub-Antarctic	1,228	0.217
Alpine	2,283	0.403
Arctic	512	0.091
Any of the above cold climate areas	3,001	0.530



**Table S4. Number and proportion of visitors from each visitor category that had visited alpine or polar regions in the 12 mo before traveling to Antarctica**

Visitor category	Total no. of visitors	No. of visitors that had been to alpine/polar areas	Proportion of visitors to alpine/polar areas	Proportion of seeds from species occurring in Arctic or sub-Antarctic	Median (= mean) of columns 4 and 5
Ships' crew	124	88	0.710	0.467	0.588
Tourists	4,296	2,190	0.510	0.467	<b>0.488</b>
Tourist support	134	100	0.746	0.467	<b>0.607</b>
Field scientist	355	212	0.597	0.467	0.532
Station scientist	285	136	0.477	0.467	0.472
Field scientist support	103	61	0.592	0.467	0.530
Station scientist support	362	215	0.594	0.467	0.530
Science (combined)	1,105	624	0.565	0.467	<b>0.516</b>

Numbers and proportions of visitors were determined by a questionnaire-based survey of 5,659 visitors, proportion of seeds from cold-climate areas (see also Table S2), and the median of these values by visitor category. Bold values indicate those used in the risk analysis calculations (see Table S7). The seed origin (column 5) is derived from data in Table S3.

**Table S5. Families of the seeds found on visitors to Antarctica in the first season (2007–2008) of the IPY**

Family	No. of species	No. of seeds found	Percentage of all species	Percentage of all seeds*
Poaceae	159	1,112	44.17	47.00
Asteraceae	42	132	11.67	5.58
Cyperaceae	30	311	8.33	13.14
Fabaceae	14	31	3.89	1.31
Plantaginaceae	12	55	3.33	2.32
Caryophyllaceae	11	16	3.06	0.68
Brassicaceae	8	27	2.22	1.14
Rosaceae	8	92	2.22	3.89
Apiaceae	7	25	1.94	1.06
Polygonaceae	7	48	1.94	2.03
Amaranthaceae	6	13	1.67	0.55
Juncaceae	5	43	1.39	1.82
Myrtaceae	5	7	1.39	0.30
Ranunculaceae	5	8	1.39	0.34
Betulaceae	4	33	1.11	1.39
Papaveraceae	4	323	1.11	13.65
Malvaceae	3	8	0.83	0.34
Ericaceae	2	11	0.56	0.46
Geraniaceae	2	3	0.56	0.13
Lamiaceae	2	3	0.56	0.13
Oxalidaceae	2	4	0.56	0.17
Pinaceae	2	15	0.56	0.63
Rubiaceae	2	2	0.56	0.08
Solanaceae	2	10	0.56	0.42
Acanthaceae	1	3	0.28	0.13
Alismataceae	1	1	0.28	0.04
Alliaceae	1	1	0.28	0.04
Araliaceae	1	1	0.28	0.04
Boraginaceae	1	1	0.28	0.04
Cistaceae	1	2	0.28	0.08
Coriariaceae	1	9	0.28	0.38
Iridaceae	1	1	0.28	0.04
Linaceae	1	1	0.28	0.04
Lythraceae	1	1	0.28	0.04
Onagraceae	1	5	0.28	0.21
Platanaceae	1	1	0.28	0.04
Plumbaginaceae	1	3	0.28	0.13
Polygalaceae	1	1	0.28	0.04
Portulacaceae	1	2	0.28	0.08
Ulmaceae	1	1	0.28	0.04

\*Percentage of all seeds identified to family level, not of total of all seeds found.

**Table S6. Estimated percentage of previously used items containing seeds per item category with bootstrap 95% CI**

Item	<i>N</i>	Percentage with seeds	Lower limit of 95% CI	Upper limit of 95% CI
Jacket	213	11.77	7.87	16.67
Trousers	124	16.98	11.03	24.53
Insulation layer	170	12.36	8.02	17.82
Headwear	138	2.87	0.73	6.91
Gloves	92	3.27	0.98	8.89
Footwear	163	44.21	36.36	51.81
Packs	201	34.30	27.96	41.41
Walking poles	12	8.36	0	38.69

**Table S7. Visitor classes and parameters used in the risk index calculations for each grid cell**

Visitor class ( <i>i</i> )	Total no. of landings	Proportion carrying seeds ( $P_i$ )	Mean no. of seeds on those carrying seed ( $X_i$ )	Proportion of seeds from cold climate areas ( $R_i$ )*
Tourists ( <i>T</i> )	197,616	0.202	4.8	0.488
Tourist support ( <i>TS</i> )	25,479	0.499	5.0	0.607
Scientist ( <i>S</i> )	7,085	0.445	12.3	0.516

See *Materials and Methods* for additional information on the calculations used and the meaning of high-risk areas.

\*Median of two estimates in Table S4.