TRACKING THE GLOBAL SUPPLY CHAIN OF HERBAL MEDICINES WITH NOVEL GENOMIC DNA
BARCODES

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SIGNIFICANCE

Unsustainable exploitation of natural resources is a major driver of biodiversity loss. Up to a third of the world's biodiversity is considered threatened by trade, but a lack of traceability methods for traded products impedes evaluation of international supply chains and the global impacts of trade on biodiversity. In this study, we pioneer the use of target capture-based genomic DNA barcoding. We compare this with standard DNA barcodes and complete plastid genome sequences for the identification of plants species in trade and for tracing their geographic origin. The target-capture barcoding approach described here presents a major advance for tracing the geographic origin of plant-based food and medicines and establishing the identity of illegally traded species. It enables better understanding and targeting of conservation action, and enhances capacity to assess the quality, safety and authenticity of traded products.

ABSTRACT

Uncontrolled and unsustainable trade in natural resources is an increasingly important threat to global biodiversity. In recent years, molecular identification methods have been proposed as tools to monitor global supply chains, to support regulation and legislative protection of species in trade, and enhancing consumer protection by establishing whether a traded product contains the species it is supposed to contain. However, development of an effective assay that routinely provides species-level identification and information on geographical origin of plants remains elusive, with standard plant DNA barcodes often providing only 'species group' or genus-level resolution. Here, we demonstrate the efficacy of target-capture genomic DNA barcoding, based on 443 nuclear markers, for establishing the identity and geographic origin of samples traded as the red-listed medicinal plant *Anacyclus pyrethrum* (L.) Lag. We also use this approach to provide insights into product adulteration and substitution in national and international supply chains. Compared with standard plant DNA barcodes and entire plastid genome sequences, the target capture approach outperforms other methods, and works with DNA from degraded samples. This approach offers the potential to meet the 'holy-grail' of plant DNA barcoding, namely routine species-level DNA-based identification, and also providing insights into geographic origin. This represents a major development for biodiversity conservation and for supporting the regulation and monitoring of trade in natural plant products.

Keywords: DNA barcoding, sustainability, hybrid-capture, genomic barcoding, endangered species, medicinal plants, supply chain, international trade

Human exploitation of natural resources is a major challenge for biodiversity conservation and sustainable development. Global trade and consumer demand for natural products provide increasing threats to species (1, 2), and at the same time lead to markets where regulation and authentication is extremely difficult (3–5). Most traded plant products are from wild populations and over-harvested: increasing scarcity results in higher prices, and incentivises adulteration, substitution and poaching (6–9). In recent decades, international conventions including the Convention on Biological Diversity (CBD) and the Convention on International Trade in Endangered Species (CITES) have sought to regulate the trade of threatened species. In parallel, the World Health Organisation has developed guidelines for safety monitoring of herbal medicines in pharmacovigilance systems (4) and the Food and Agriculture Organisation regulates international trade of cultivated plant products (10). However, implementing these regulations and guidelines is hampered by difficulties identifying plant products in trade. Multiple, complex and interacting supply chains can co-exist for a single plant product (11, 12). Traded plants are often not identifiable to species by their morphology or chemistry, as they may be dried, powdered, processed, or commercialised in mixtures with other products. In addition, the design, implementation and enforcement of successful conservation actions, and/or assessments of product quality and authenticity, often require the identification of the geographic origin of species in trade. This is difficult as the development of efficient methods to trace and identify traded products to their geographical area of origin are still in their infancy.

DNA barcoding is highly effective for species-level identification in animals using a portion of the mitochondrial marker Cytochome Oxidase 1 (COI). In plants, standard DNA barcoding involve using varying combinations of one to four plastid DNA regions (*rbcL, matK, trnH-psbA, trnL*) and/or the internal transcribed spacers of nuclear ribosomal DNA (nrDNA ITS). Although these markers are very informative in many cases, no single marker or combination of these markers routinely provides complete species-level resolution, especially in species-rich groups (13, 14), let alone provide population level assignment.

The development of high throughput sequencing (HTS) using new sequencing chemistries and platforms offer opportunities to extend the concept of DNA barcoding in plants (15–17). In addition to sequencing standard barcoding loci in a more cost-effective fashion, two major approaches have been proposed for increasing the resolution (and coverage) of plant DNA barcoding. Shallow pass shotgun sequencing (genome skimming) is now frequently used to recover organellar genomes and nuclear ribosomal DNA sequences, increasing the amount of data per sample, leading to some increases in resolution (18–22), and workflows and bioinformatic pipelines are becoming increasing refined for this approach (23–25). However, at present, cost constraints mean that most genome skimming barcoding projects only have sufficient sequencing depth to recover comparative data from multiple samples for multi-copy regions such as plastid genomes and ribosomal DNA; these regions represent a limited number of independent loci, ultimately constraining resolving power (26–28). Target capture sequencing offers the potential to overcome this, by efficiently targeting hundreds of low-copy nuclear markers providing access to a much greater number of independent data points per unit of sequencing effort (29). Like genome skimming, target capture is successful in sequencing degraded DNA samples (30, 31), and can be used to sequence hundreds of samples at the same time (32). It can also be designed to recover standard DNA barcodes in the same assay (33).

Although target capture has been advocated as a powerful tool for molecular identification of
plants, its utility in a barcoding context remains untested to-date (16, 22, 34).

We evaluated the power of target-capture DNA barcoding with an investigation of the
traceability of plant products, focusing on an internationally traded and vulnerable medicinal
plant species, *Anacyclus pyrethrum* (L.) Lag., widely used in traditional Arabic and Ayurvedic
medicine. This exemplar case includes a well-established international trade chain (35), and
classic challenge for plant molecular identification such as a recent radiation, frequent
hybridization (36, 37) and a large genome size (38, 39).
The genus *Anacyclus* (Asteraceae) comprises 12 species of annual and perennial weedy
herbs with partly overlapping geographic ranges around the Mediterranean basin (36, 40, 41).
Some species are abundant and have wide geographical ranges (for example, *A. clavatus*
(Desf.) Pers. and *A. radiatus* Loisel.), whereas others are rare and have restricted ranges (for
example, *A. maroccanus* (Ball) Ball and *A. pyrethrum* (L.) Lag.). Only *A. pyrethrum* is used in
traditional herbal medicine.
Anacyclus pyrethrum is endemic to Morocco, Algeria and southern Spain (36, 41), and
has a long history of use in Islamo-Arabic, European, and Indian Ayurvedic medicine (42–45).
In the 13th century, Ibn al-Baytār wrote that the plant was "*known across the world*" and traded
from the Maghreb to *all* other areas (46). Its popularity as a medicinal plant stems from the
many pharmacological activities of its roots (47). In Morocco, two varieties of *A. pyrethrum*
are distinguished, var. *pyrethrum* and var. *depressus*, the first being more potent and up to ten
times more expensive than the second (48). Today, both varieties are harvested from the wild
and used extensively for the treatment of pain and inflammatory disorders across Morocco (48–
52) and Algeria (53–55), as well as the Middle East (42) and the Indian sub-continent (56, 57).
A. pyrethrum is still traded today from the Maghreb to India (58, 59) and Nepal (56), and is
known to be over-harvested and is increasingly difficult to find in local markets in Morocco
(48, 50, 52, 60). Collectors are proficient in identifying the plant and its two varieties, but
material is possibly misidentified and adulterated along the chain of commercialisation (48, 50,
61, 62).

Here we apply target-capture genomic barcoding to distinguish *Anacylus* species and
geographical races, to identify traded *Anacylus* root samples in the national and international
supply chains, and compare this novel approach with plastid genome and nrDNA ITS barcodes.

RESULTS

We constructed a reference database of DNA sequences from fresh and herbarium specimens,
consisting of 83 individuals of 10 *Anacyclus* species, and 5 individuals representing outgroup
species. Four datasets were retrieved from our shotgun and target capture sequencing methods,
standard barcode markers (*matK*, *trnH-psbA*, the *trnL* intron and *rbcL*), nrDNA (ITS), along
with complete plastid genomes (from shotgun genome skimming) and hundreds of nuclear
markers (from target capture). We then used this reference database to assess the identity and
geographic origins of 110 root samples acquired from traded materials. We show that the target
capture approach is the most powerful method to identify plant species in trade and their
geographic origin.

Data recovery for plastome, standard barcode loci, nrDNA and skimming and target capture data

The data recovery based on target capture outperforms shotgun sequencing (Figure 1). On average, 2.3 million reads were obtained from shotgun sequencing per sample after quality control filtering and 1.6 million reads for target capture. The shotgun data produced, ITS, plastome and standard barcodes, with retrieval rates of 93% of samples for ITS, 56% for the plastid genomes and 46% to 55% for the standard barcodes (Figure 1); 73% of the samples were retrieved using target capture with 303X coverage for the targeted nuclear loci (Table S3). The resulting aligned matrices for each of the datasets were 633 bp from ITS (including 5.8S), 4408 bp from the standard barcoding markers (1523 bp *matK,* 1438 bp *rbcL,* 500 bp *trnH*-psbA, 947 bp *trnL*), and 289,236 bp from 443 nuclear loci recovered from the target capture approach (for the standard barcodes, we included the full length of the coding regions of *rbcL* and *matK*). The bioinformatics workflow for data analyses is described in Figure S1.

Comparative levels of species discrimination using different approaches

The data from shotgun sequencing (nrDNA, plastome phylogenies, standard barcodes) highlight the complex evolutionary history of *Anacyclus*. The nrDNA phylogeny lacks resolution in general (Figure S2-3). The outgroups *Tanacetum, Matricaria, Achillea, Othanthus* and *Tripleurospermum* have well-supported bootstrap values, but within the genus *Anacyclus,* only *A. atlanticus* Litard. & Maire, *A. maroccanus* and *A. radiatus* are highly supported. The plastome phylogeny shows very good support at genus level for the *Anacyclus* node, and at species level for the outgroups. The lack of variation in the plastid genome within the genus *Anacyclus* results in little phylogenetic support with no species-specific clusters recovered (Figure S4-5). The standard barcode markers, *matK, rbcL, trnH-psbA* and *trnL* (Figure S6-9) displayed low levels of resolution at the species level.

The 443 loci recovered by target capture, led to a well-resolved phylogeny and high levels of species discrimination: all the genera in the Matricariinae tribe and all interspecific relationships are well-supported, with most nodes showing posterior probabilities (PP) of 1 (Figure S10-11). Within *Anacyclus,* all species, sub-species and varieties are well supported. PP are lower for *A. monanthos* (PP = 0.75). The complex of hybrid species composed of *A. clavatus*, *A. homogamos*, and *A. valentinus* is polyphyletic and shows signs of hybridization and incomplete lineage sorting. Intraspecific nodes have PP varying between 0.27 and 1, mostly depending on species population structure.

Assessment of *Anacyclus* trade

Interviews with 39 harvesters, middlemen, retailers, and wholesalers in various Moroccan cities, indicate that the national and international trade of *Anacyclus pyrethrum*

follow two separate supply chains. Retailer herbalists in Moroccan cities are supplied by middlemen who acquire the plant from local harvesters from rural communities. These retailers typical hold between a few hundred grams to one kilogram of the plant material in their shops. In contrast, wholesalers who export the plant internationally, hire professional harvesters who travel across the species geographical range to collect plant material. Harvested roots are brought directly from the wild to the export companies in Rabat, Casablanca and Tangier, from where they enter the international market, including supply of samples to India. According to informants from export companies, between 3-10 tons of the plant product can be stocked at a time.

Our examination of material in trade involved screening a total of 62 bags each containing an average of 25g of dry roots. Initial morphological examination of these samples identified obvious non-*Anacyclus* adulterants in 39/66 batches. The adulterants were present with a proportion from 3% to 100% with an average of 42%. The non-*Anacyclus* adulterants were found at high frequency in collections from traditional healers and herbalists, less so from collectors, wholesalers and export companies (Figures 2-3).

We selected at random 110 individual roots for DNA analysis from the 62 root batches. Of these 98 had a morphology consistent with *Anacyclus,* and 12 which were classed as similar to *Anacyclus* but likely to be non-*Anacyclus* based on their morphology. We recovered shotgun sequence data from nine of these 12 non-*Anacylus* roots and using sequences queries against GenBank, the ITS and plastid sequences obtained a genus-level identification (= *Plantago sp.*).

Of the 98 *Anacyclus* roots, 18 had no recoverable DNA sequences via any of our methods, with 80/80 of the remaining samples working for target capture vs 61/80 for shotgun sequencing). Extracting plastome sequences from the shotgun sequencing enabled identification of 7 roots to the species level, with the remainder identified as *Anacyclus* sp. (Figure 1). Neither ITS nor any of the standard barcodes were able to discriminate any of these samples below the genus level (Figure S6-9).

The target capture data gave much higher resolution within *Anacyclus*. In our investigation of the national market in Morocco, our analyses of six individual root samples from four rural community collectors identified three *Anacyclus* var. *pyrethrum* and three var. *depressus*. Our analysis of five samples from three wholesaler 'middle-men' in Morocco identified two *Anacyclus* var. *pyrethrum* and three var. *depressus*. Our sequences from 18 samples from 8 herbalists revealed 11 *Anacyclus* var. *pyrethrum* and seven var. *depressus*. Likewise, our seven samples from four traditional healer sources identified four *Anacyclus* var. *pyrethrum*, and three var. *depressus*. In the international market, our 16 sequenced samples from three export companies in Morocco identified eight *Anacyclus* var. *pyrethrum*, six var. *depressus*, and two *A. homogamous*. Our analysis of 28 samples from 17 herbalists in India identified three *Anacyclus* var. *pyrethrum* and 25 var. *depressus*.

Geographical source

Market samples in Morocco originate both from various Moroccan areas as well as Algeria, and material from all of these populations of origin can be found in Indian market samples

(Table S3, Figure S11). Of the 80 non-adulterated roots which we identified to species level
using target capture, we were able to associate 58% to a specific geographic region (Figure 2,
Table S2). Using phylogenetic analysis, root samples of *A. pyrethrum* var. *pyrethrum* clustered
with reference material from the High Atlas, and *A. pyrethrum* var. *depressus* roots clustered
with reference material from different regions in Morocco, including the Rif Mountains, the
High Atlas and the Middle Atlas. Evidence for the international trade from Algeria to Morocco
is highlighted by a distinctive clade that includes traded roots collected from west Algeria
(Figure S12). The geographic origin was only resolvable with target capture data; standard
barcoding markers, nrDNA and plastome data lacked variation, resolution or both.

DISCUSSION

This study illustrates the potential for target-capture based DNA barcoding to form the next
wave of standard plant DNA-barcoding tools and provide the greatly needed species-level
resolution. A key rate limiting step for the standard plant barcodes is that they are
fundamentally recovering data from just one or two independent loci (plastid DNA and
nrDNA), which often show trans-specific polymorphism and barcode sharing among related
species (63). Even using complete plastid genome sequences suffers from the same problem,
as the data are all physically linked in a single non-recombinant uni-parentally inherited locus
(22). In this study, using entire plastid genomes or plastid barcode markers, and/or ITS we
recovered very limited resolution below the genus level (Figure 1, Figure S4). In contrast, our
target capture approach using hundreds of nuclear loci yields significantly higher molecular
identification success and more accurate resolution to species and even population level (Figure
1).

Species identification, species in trade, and geographic origins of Anacyclus

These data provide new insights into trade of *A. pyrethrum* and highlight the extent of
adulteration and the scarcity of *A. pyrethrum* var. *pyrethrum* (Figures 2-3). Only a small
proportion of the tested samples from herbalists and traditional healers were the potent *A.*
pyrethrum var. *pyrethrum,* with the Indian market in particular dominated by var. *depressus.*
In both Morocco and India some individual sellers had entirely or almost entirely adulterated
product. All of the non-*Anacyclus* roots we sequenced were identified as *Plantago* spp. by shot-
gun sequencing, despite being sampled from six different localities including Morocco and
India. As *Plantago* roots are similar in appearance to *Anacyclus,* it is possible that they are
deliberately added as a 'difficult to identify' adulterant which may go unnoticed by non-
specialists.

Our analysis of samples from collectors, wholesalers and export companies detected
much less adulteration at this point in the supply chain. Collection of *A. pyrethrum* var.
pyrethrum is carried out by professional harvesters employed by export companies who travel
across the country and are considered poachers by local communities (64). Local harvesters
have increasing difficulty to supply local trade chains (48, 64), which may finally result in
increased adulteration rates in the poorly-governed, national value chains (Figure 2), as has

also been observed elsewhere (11, 12). Our results also identify previously unreported
international trade in North Africa prior to export to the Indian sub-continent (Figure 2,3, S11).
We provide evidence that export companies in Morocco source material not only in this
country, but also from neighbouring Algeria. Applying this molecular identification approach
enables us to distinguish samples at population level and uncover these hidden international
sourcing channels.

High national and international demand for *A. pyrethrum* likely encourages its
overharvesting and adulteration. As the plant is a remedy of the Indian pharmacopoeia, its
demand is likely to increase along with that of other Ayurvedic medicines (65). Although *A.*
pyrethrum has been assessed to be vulnerable internationally (35) and endangered in Morocco
on the IUCN Red List, the plant is not listed in the CITES appendices and its international trade
is not regulated. Nonetheless, continued overharvesting is driving wild populations to critical
levels and conservation policies are necessary. Common strategies to conserve overharvested
medicinal plants often include collection and trade restrictions as well as cultivation (6).
Cultivation is often proposed as a solution to both conservation issues and sourcing high
quality, appropriately identified material (6, 7, 66). However, trade of cultivated plants has not
been as successful as expected due to beliefs that plants harvested from the wild are more
potent and thus preferable (67). This kind of demand requirements necessitate trade monitoring
and restrictions. Only with fine-grained mapping of sourcing areas and supply chains, as our
results highlight for *A. pyrethrum*, trade monitoring and conservation can be achieved.

Future prospects for plant DNA barcoding

Key criteria for developing new DNA barcoding approaches include resolving power (telling
species apart), recoverability (enabling use on a wide diversity of tissue sources), and cost and
efficiency (enabling scaling over very large sample sets).

In terms of resolving power, the target capture approach used here provides a step-
change over plant barcodes based on plastid sequences and ITS. The key enabling step is access
to multiple nuclear markers, removing the sensitivity of the identification to introgression of
one or two loci as is the case for barcodes from rDNA or the plastid genome.

In terms of recoverability, the successful recovery of sequences via target capture
depends on how closely related the sampled species are to the reference set on which the baits
were designed, and/or the level of variation in the loci that form the bait set (68, 69). In the
current study, the baits were designed from *Anacyclus* and related genera. This optimizes their
specificity to our study group and enabled their successful high-resolution application for
assessing trade. A clear challenge for wider use in DNA barcoding, is applicability over much
greater phylogenetic distances. The recently published universal angiosperm baits (70, 71),
designed to recover 353 loci from a wide diversity of flowering plants offer great potential
here. An immediate priority is to assess the degree to which this universal bait set (71) is
variable enough to routinely provide species-level resolution. In addition, there is a need for a
more general evaluation of when / how and at what scale to most effectively to combine taxon-

specific bait sets (as used here) with universal bait sets, to simultaneously obtain very high
resolution and sequencing success over wide phylogenetic distances.

Another important aspect to recoverability is efficacy with degraded DNA. Drying,
storage, and transportation affect the quality of plant material in trade and can cause extensive
DNA degradation (12, 72, 73). In consequence, traded samples have similar challenges to
working with ancient DNA, herbarium samples or archaeological remains. Target capture is
particularly well suited to this challenge (68, 69, 74). Although both shotgun sequencing can
also be very effective on degraded material (30, 75, 76), in the current study, our recovery rate
was greater for target capture than shotgun sequencing (Figure 1), and we recovered data from
100% of the samples used for establishing the reference library and over 70% of the samples
in trade. This 70% success rate for hundreds of nuclear loci providing high resolution from
suboptimal tissue of traded samples is noteworthy. The other mainstream approach for highly
degraded DNA is a portion of the chloroplast *trnL* (UAA) intron, specifically the P6 loop (10–
143 bp) (77). This has been highly successful in recovering sequence data from degraded
samples (78–84). However, this short region of the plastid genome has a low variation at the
species level and does not typically discriminate among con-generic species (77).

In terms of costs, although sequencing costs continue to fall, the current protocols for
target capture (including library construction and sequencing) are still expensive, and equate
to 70 USD per sample. This is manageable for well-resourced projects and high value
applications, but still prohibitively expensive for many large-scale biomonitoring projects or
less well-resourced projects. Ongoing work is required to optimize protocols to drive these
costs down, as has been done for standard barcoding approaches (85).

Conclusion

In plants, the frequent sharing of plastid and ribosomal sequences among con-generic
species, coupled with the difficulty of routinely accessing multiple nuclear loci, has acted as a
constraint on the resolution of DNA barcoding approaches. Current advances in sequencing
technology and bioinformatics are removing this constraint, and offer the potential for a new
wave of high-resolution identification tools for plants. These approaches, such as target capture
have the capability to distinguish species and populations, providing insights into diversity and
ecology, as well as the multitude of societal applications which require information on the
identification and provenance of biological materials.

Materials and Methods

Sample collection. Forty-two wild populations (n=72 individuals) of *Anacyclus* were sampled
in Morocco and Spain to build a reference database. The sampling was complemented with
eleven herbarium voucher specimens of species occurring elsewhere in the Mediterranean. The
outgroups included two species of *Matricaria*, two species of *Achillea*, and one species of
Otanthus. The specimen origins and vouchers number are listed in Table S4 and Figure S12.
One hundred and ten trade vouchers consisting of 50g of roots were bought from collectors,

herbal shops, middle-men, traditional healer, wholesalers, and export companies in Morocco
and India (Table S3).

Trade information. During the acquisition of samples from collectors and traders in Morocco
and India, semi-structured interviews were conducted to enquire about the trade of *Anacyclus*.
In total, 39 informants were interviewed and asked where the plant material was sourced, to
whom it was sold and in what quantities, for what price, and if there were several qualities of
this medicinal plant. The quantity of this product was weighted in herbalist shops and estimated
in export companies, estimates were given by informants. Interviews were carried out
anonymously and followed the International Society of Ethnobiology Code of Ethics (86).

Extraction and Library preparation. DNA from reference and traded vouchers was extracted
from approximately 40 mg of dry leaf or root material using the DNeasy Plant Mini Kit
(Qiagen). Total DNA (0.2-1.0 µg) was sheared to 500 bp fragments using a Covaris S220
sonicator (Woburn, MA, USA). Dual indexed libraries were prepared using the Meyer and
Kircher protocol (87) for shotgun sequencing and target capture.

Target capture. We designed 872 low-copy nuclear markers and associated RNA probes by
following the Hyb-Seq pipeline, with minor adjustments (SI). For target capture enrichment,
twelve equimolar pools were prepared with ten to 24 samples and an average 300 ng of input
DNA per pool. The RNA probes were hybridized for 16 hours before target baiting, and 14
PCR cycles were carried out after enrichment following the MyBaits v3 manual. The enriched
libraries and shotgun libraries were sequenced on two Illumina HiSeq 3000 lanes (150bp
paired-end).

Data Processing. The sequencing runs were trimmed and quality filtered using Trimmomatic
(88). Low-copy nuclear markers and their alleles were retrieved for each sample. First, the
reads were mapped against the selected low-copy nuclear loci (SI) using BWA v0.7.5a-r405
(89). Duplicate reads were removed using Picard v2.10.4 (90). Alleles were phased for each
marker and individual using SAMtools v1.3.1 (91). The last step of the pipeline combined the
retrieved alleles into single gene matrices. Plastome and nrDNA sequences were recovered by
pooling shotgun and target enrichment sequencing data. Plastid genomes were build using
MITOBim v1.8 (23). nrDNA sequences were recovered using BWA by mapping the reads to
the reference nrDNA of *Anacyclus pyrethrum* (KY397478) for *Anacyclus* species and traded
samples, to the reference nrDNA of *Achillea pyrenaica* Sibth. ex Godr. (AY603247) for
Otanthus and *Achillea*, and to the reference nrDNA of *Matricaria aurea* (Loefl.) Sch.Bip.
(KT954177) for *Matricaria* samples.

Phylogenomics. The recovered matrices (nuclear genes, nrDNA and plastomes) were aligned
with MAFFT (92), refined with MUSCLE (93) and filtered with Gblocks (94). Phylogenies
were inferred using RAxML v8.0.26 (95), with 1000 bootstrap replicates under the
GTRGAMMA model. For the low-copy nuclear genes, the species tree was inferred from the
individual nuclear gene trees under the multi-species coalescence (MSC) framework with
ASTRAL-III v5.5.9 (96). The multi-alleles option in ASTRAL-III was used for reconciliation
of the independent evolutionary histories of the alleles. The molecular identification of traded
roots was assessed from the MSC tree and posterior probabilities (PP) greater than 0.95.

Results from morphological identification of the traded roots (described in (SI)) were combined
with results from molecular identification, and samples were identified according to their
position in the supply chain (Figure 2) and geographical origin (Figure 3).
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DECLARATIONS

Authors' contributions
The project was coordinated by AK, GM, HdB and VM. VM did the design of the study and
performed data analysis. AK, HdB, ITT, PH and VM wrote the manuscript. All authors
provided useful contributions to data analysis and interpretation of the results. All authors have
read and approved the final version of the manuscript.
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389 For reproducibility purposes, all the script used during the data processing are available on the
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Figure 1: Sequencing recovery and identification success for the traded samples. The figure
shows the percentage of samples for which useful marker sequences were successfully
retrieved for molecular identification by ITS, plastid barcodes, plastomes and nuclear markers.
Where no sequence data was recovered or identification above the genus level, samples are
classed as NDR (no data recovered). For the samples that produced useable sequence data, the
proportion of samples that resulted in identification at the genus, species and population levels
is given.

Figure 2: National and international supply chains of *A. pyrethrum*. Pie charts represent the
proportion of *A. pyrethrum* (light and dark blue represent var. *depressus* and var. *pyrethrum*
respectively) and adulterated samples (orange and brown for *A. homogamos* and other
adulterants) by each stakeholder. We were unable to obtain samples from wholesalers/middle-
men in India or professional collectors in Morocco (indicated by square boxes).

Figure 3: Sample locations are shown with coloured circles according to the type of
stakeholder. A pie-chart with the proportions of adulteration and identified species is
represented for each location in (a) Morocco (native range) and (b) India (exported material),
adulterated roots are shown in orange, adulteration with *A. homogamos* in in brown, and the
two varieties of *A. pyrethrum* in blue.
681

Figure 1

	N.A.	Genus	Species	Population
rbcL	100%	0%	0%	0%
trnH	100%	0%	0%	0%
matK	45%	55%	0%	0%
trnL	54%	46%	0%	0%
ITS	7%	93%	0%	0%
Plastome	44%	56%	6%	0%
Nuclear genes	27%	73%	73%	46%

Figure 2

Moroccan national market   **International market**

Figure 3