Developing core collections to optimize the management and the exploitation of diversity of the coffee Coffea canephora

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Abstract The management of diversity for conservation and breeding is of great importance for all plant species and is particularly true in perennial species, such as the coffee Coffea canephora. This species exhibits a large genetic and phenotypic diversity with six different diversity groups. Large field collections are available in the Ivory Coast, Uganda and other Asian, American and African countries but are very expensive and time consuming to establish and maintain in large areas. We propose to improve coffee germplasm management through the construction of genetic core collections derived from a set of 565 accessions that are characterized with 13 microsatellite markers.

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Core collections of 12, 24 and 48 accessions were defined using two methods aimed to maximize the allelic diversity (Maximization strategy) or genetic distance (Maximum-Length Sub-Tree method). A composite core collection of 77 accessions is proposed for both objectives of an optimal management of diversity and breeding. This core collection presents a gene diversity value of 0.8 and exhibits the totality of the major alleles (i.e., 184) that are present in the initial set. The seven proposed core collections constitute a valuable tool for diversity management and a foundation for breeding programs. The use of these collections for collection management in research centers and breeding perspectives for coffee improvement are discussed.

Keywords Coffea canephora · SSR markers · Genetic diversity - Core collection - Association study

Introduction

The genus Coffea (Rubiaceae) is mainly endemic to the tropical forests of Africa and Madagascar. The genus consists of approximately 124 species (Davis et al. [2011](#page-13-0)), two of which are of commercial importance: Coffea arabica L., which produces Arabica coffee and Coffea canephora Pierre ex A. Froehner, which produces Robusta coffee. Robusta accounts for one-third of the world coffee trade in volume and approximately US\$ 5 billion (ICO [2013](#page-13-0)).

Coffea canephoraoriginated from lowland tropical African forests that stretch from Guinea to Uganda. Since 1980, the genetic diversity of C. *canephora* has been described in numerous studies (Berthaud [1986;](#page-13-0) Montagnon et al. [1992;](#page-14-0) Dussert et al. [1999;](#page-13-0) Montagnon [2000](#page-13-0); Gomez et al. [2009](#page-13-0); Musoli et al. [2009;](#page-14-0) Cubry et al. [2013a](#page-13-0)). These studies revealed the presence of two main diversity groups:

the Congolese group and the Guinean group. The Congolese group is subdivided into five subgroups: SG1, SG2, B, C and UW. The SG1 genotypes originate from Coastal Atlantic Africa. The SG2 accessions originate from the Congo Basin, mainly from the Democratic Republic of the Congo (DRC). The B genotypes come from the Central African Republic (CAR) and the DRC. The C genotypes come from the CAR and Cameroon (Cubry et al. [2013a](#page-13-0)). The UW genotypes are found in the forests of eastern Uganda (Musoli et al. [2009\)](#page-14-0). Only a small portion of this large diversity is used in past and current breeding programs, with the exception of the recurrent selection program in the Ivory Coast (IC) in the 1990s (Leroy et al. [1993;](#page-13-0) Montagnon et al. [1998](#page-14-0); Montagnon [2000\)](#page-13-0).

Davis et al. ([2011\)](#page-13-0) highlighted the serious threat of a loss of genetic diversity of Coffea species mainly due to a decrease in the quality and quantity of the species' natural habitat. Despite its economic importance, no effective in situ conservation strategy exists. Coffea canephora is an allogamous perennial species, and consequently, its genotypes must be reproduced by cloning (cuttings) and conserved *ex situ* in the form of living collections.

The *ex situ* gene banks of *C. canephora* were established from biological material that was gathered during collecting missions (Montagnon et al. [2012](#page-14-0)) or created while implementing breeding programs. The richest field collection in terms of the number of accessions and diversity is located at the Centre National de la Recherche Agronomique (CNRA) in the Ivory Coast, with more than 1,000 genotypes of C. canephora that were collected throughout Africa (Berthaud and Charrier [1988](#page-13-0), Anthony [1992\)](#page-12-0). Another large field collection is present at the Coffee Research Centre (COREC) in Uganda, with a mix of local genotypes and genotypes that were introduced from the former Belgian Congo (Thomas [1947;](#page-14-0) Musoli et al. [2009](#page-14-0)). Other collections of importance can be found in Brazil (genotypes from the SG1 group, as confirmed by Cubry [\(2008b](#page-13-0))), Ecuador (introduced genotypes from the SG1 and SG2 groups, Leroy, pers. com.), the DRC, Guinea, Madagascar, Cameroon and the CAR.

For most crop species, the genetic diversity that is conserved in *ex situ* gene banks is underutilized and frequently redundant. A small proportion of this diversity is actually used in breeding programs (Van Hintum et al. [2000](#page-14-0)). The core collection concept was introduced in the 1980s to define subsets from the whole collection that capture, with minimum redundancy, most of the genetic diversity of the target species (Frankel and Brown [1984;](#page-13-0) Brown [1989\)](#page-13-0). The first core collections in plants were based on passport and phenotypic quantitative data (Upadhyaya et al. [2001\)](#page-14-0). DNA markers, such as microsatellites (SSR), have been further used to construct core collections (Volk et al. [2005;](#page-14-0) Ronfort et al. [2006](#page-14-0); Balfourier et al. [2007](#page-12-0)) either alone or in association with phenotypic traits (Volk et al. [2005](#page-14-0); Belaj et al. [2012\)](#page-13-0).

Different approaches have been compared for the construction of core collections in annual (Franco et al. [2006\)](#page-13-0) and perennial species (Escribano et al. [2008\)](#page-13-0), leading to the conclusion that the maximization (M) method, which maximizes the number of alleles, is highly suitable for constructing core collections (Schoen and Brown [1993](#page-14-0)). Reports on the construction and quality of core collections for their effective use in diversity management have recently been published (Pessoa-Filho et al. [2010](#page-14-0); El Bakkali et al. [2013](#page-13-0); Odong et al. [2013\)](#page-14-0).

For most perennial crops, numerous teams are working on different germplasm collections throughout the world. A common subset of genotypes representing the global diversity of the species is therefore of high interest for sharing data and research results. Such core collections have been constructed for grapes (Le Cunff et al. [2008](#page-13-0); Laucou et al. [2011\)](#page-13-0) and olives (Belaj et al. [2012;](#page-13-0) Haouane et al. [2011\)](#page-13-0).

The first coffee core collection was proposed by Hamon et al. [\(1995](#page-13-0)) for the whole genus using the principal components score strategy with quantitative data, including isozymes. Until now, no other core collection has been proposed for the genus Coffea or for the species C. canephora in particular.

Considering the great genetic diversity of C. canephora, the geographic structure of its diversity, the high number of ex situ collections worldwide and the cost of maintenance of field collections, it is important to improve the management strategy of these collections. Among other applications, small core collections are particularly pertinent and could be used for gene discovery, Genotyping by Sequencing (GbS) or massive resequencing. The core collections could also be the first step in genetic association studies (Le Cunff et al. [2008](#page-13-0); El Bakkali et al. [2013](#page-13-0)), complementing Linkage Disequilibrium (LD) studies (Barnaud et al. [2006](#page-13-0); Cubry et al. [2013b](#page-13-0)).

The purpose of the present study was (1) to propose different core collections for the C. canephora species using genetic diversity analyses of genotypes that were collected and maintained in field collections in the IC, Uganda, the DRC and French Guyana and (2) to determine the consequences of medium- and long-term strategies for the conservation and improvement of this species.

Materials and methods

Plant material

An initial set of 565 genotypes was used for our study (Table [1\)](#page-2-0). These genotypes were planted under different field collections in the IC (Cubry et al. [2013a\)](#page-13-0), Uganda (Musoli et al. [2009\)](#page-14-0), the DRC (Luki origin) and French Guyana. Some additional genotypes were collected from

^a This accession is a hybrid between the existing diversity groups and shall not be considered as a diversity group per se

the collection of the Institut de Recherche Pour le Développement (IRD) in Montpellier (France). For a complete description of the material, see Supplementary material 1.

In addition, 118 genotypes from breeding collections outside of Africa (Brazil and Ecuador) and from feral populations (Uganda) were included for comparison purposes (Table 1).

DNA preparation and genotyping

Genomic DNA extractions and PCR reactions were performed according to Cubry et al. [\(2008](#page-13-0)). The PCR products were analyzed by electrophoresis on a 6.5 % polyacrylamide gel using a $LI-COR^*$ 4300 automated sequencer (LI-COR Biosciences, Nebraska, USA). Size calling was automatic and manually checked using the manufacturer's program SAGA^{GT}.

Data analysis

Validation and relevance of the set of markers

Previous studies on the field collections of the IC (Cubry et al. [2013a](#page-13-0), [b\)](#page-13-0) and Uganda (Musoli et al. [2009](#page-14-0)) led us to select a set of 13 SSR markers (Table [2](#page-3-0)). These markers were shared between these studies, easy to analyze and pertinent

for diversity studies. These markers were located in eight of the 11 different linkage groups of a C. canephora genetic map (Leroy et al. [2011\)](#page-13-0). We verified the relevance and the good discrimination of accessions with this set of 13 markers using a correlation test between the Rst diversity statistics (Slatkin [1995](#page-14-0)) for 356 accessions using a large set of 101 makers (data from Cubry et al. [2013b](#page-13-0)) compared with our 13 markers using Arlequin 3.5.1.2 software (Excoffier et al. [2005](#page-13-0)). This set of 356 accessions was used for linkage disequilibrium studies (Cubry et al. [2013b\)](#page-13-0) and divided into seven groups of diversity. We generated two Rst matrices, one from our set of 13 markers and another one from the set of 101 SSR markers. A Mantel correlation test using Gen-AlEx software (Peakall and Smouse [2006](#page-14-0)) was performed to compare both of the Rst matrices after 999 permutations.

Genetic diversity representation

We computed a dissimilarity matrix between individuals using a simple matching index for the entire dataset (DARwin. v. 5.0.137, Perrier and Jacquemoud-Collet [2006](#page-14-0)). The level of dissimilarity between individuals can be used to assess the uniqueness of the genotypes. We inferred diversity trees from this matrix using the Neighbor-Joining (NJ) method (Saitou and Nei [1987](#page-14-0)). Two hundred bootstrap iterations were calculated to test the robustness of the nodes.

Construction of the core collections

We first defined a compulsory subset of five genotypes considering their specific interests:

- The accession "126" from the Ivory Coast, which is a natural hybrid between Congolese and Guinean, is considered as best C. canephora genotype regarding its agronomic characteristics and the quality of the coffee produced (Montagnon et al. [1992\)](#page-14-0).
- The accession "200" has been used for genome sequencing.
- The accessions "410", "466" and "A03" were the best progenitors of the intergroup hybrids between Congolese and Guinean from the Reciprocal Recurrent Selection program on *C. canephora* breeding in the Ivory Coast (Leroy et al. [1997\)](#page-13-0).

We used this set as a kernel for the core collection construction. We removed the rare alleles with a frequency $<$ 0.05 % to limit their impact on further analyses. Then, we used two different sampling methods:

1. Using the M strategy (Schoen and Brown [1993\)](#page-14-0) as implemented in the MStrat program (Gouesnard et al. [2001\)](#page-13-0), we evaluated the efficiency of this approach and

Core set	Size	No. of common individuals MStrat/MLST	Number of alleles	$%$ of total SSR diversity	Heterozygosity (Ho)	Gene diversity (GD)	Diversity groups						
							B	C	G	Hybrids	SG ₁	SG ₂	UW
Available_565i	565	$\overline{}$	202	-	0.37	0.73	29	83	167		42	76	167
565i-RareAlleles	565	$\overline{}$	184	100	0.37	0.73	29	83	167		42	76	167
Core12 MStrat	12	7	126	68	0.51	0.81	Ω	2	3		3	2	
Core12 MLST	12		109	59	0.43	0.76				$2 \quad 1$	3	$\overline{4}$	$\mathbf{0}$
Core24 MStrat	24	- 9	161	88	0.53	0.81	3	3	6		5	$\overline{4}$	2
Core24 MLST	24		142	77	0.40	0.78		\mathfrak{D}		7 ₁	4	τ	2
Core48 MStrat	48	19	184	100	0.44	0.79	3	8	11		8	9	8
Core48 MLST	48		160	87	0.40	0.80	4		12		9	10	5
Core77 composite	77		184	100	0.41	0.79	6	11	19		13	15	12

Table 3 SSR diversity among the different defined core collections: the number of alleles, heterozygosity, gene diversity and repartition of the selected accessions through the diversity groups

the optimal range size of the coffee core collection. For this purpose, we compared the number of alleles that were captured in core collections of increasing size using both the M strategy and a random sampling (200 replicates by core size and 15 iterations) and located the inflection point of the M-strategy redundancy curve. Using the same software settings, we successively built core collections from 12 accessions to the optimal size, selecting as kernels the accessions that were retained in the previous step. We named these core collections CoreXX_MStrat, with XX representing the number of accessions in the core.

2. The maximum length sub-tree method (MLST strategy) as implemented in the DARwin program was used to define core collections that were the same size as those that were generated with MStrat. This iterative method is based on resampling from an initial diversity tree that was constructed using the NJ method. From this tree, at each step, a maximum length sub-tree is constructed by the successive pruning of most of the redundant units. We named the resulting core collections CoreXX_MLST.

Genetic parameters

The number of alleles, the observed heterozygosity (H_o) , the gene diversity (GD) and the number of accessions within each diversity group for the different core collections were calculated with PowerMarker v. 3.25 (Liu and Muse [2005](#page-13-0)).

Results

Validation of the marker set

The Rst matrices were compared for both sets of markers using the Mantel correlation test. The results of the significance of relationships between the matrices are presented in Fig. [1.](#page-5-0) With an \mathbb{R}^2 value of 0.782 ($\mathbb{R} = 0.884$, $p\lt0.005$, we accept the strong relationship between both of the matrices, which validates our set of 13 markers for diversity analyses within our species. Thus, the proposed set of 13 markers is adequate for evaluating the global diversity within our species.

Genetic structure of C. canephora accessions

The first diversity tree was constructed with 565 accessions and 13 markers (Fig. [2\)](#page-5-0). The high degree of stratification within the species is clearly illustrated by this tree. A total of 24 pairs of genotypes presented no significant dissimilarity.

The 118 additional genotypes from Ecuador and Brazil and from the feral populations of Uganda did not exhibit additional genetic diversity when included in the initial set (data not shown). Therefore, these genotypes were not used for the construction of the core collections as their diversity appeared to be redundant with the reference collections for the SG1 and SG2 groups.

Construction of the core collections

A total of 202 alleles were detected in the 565 genotypes, of which 184 alleles with a frequency > 0.05 % and that occurred at least two times were retained for the analysis. The efficiency of the M strategy versus the random sampling was visually checked by constructing random sampling (dotted line, Fig. [3](#page-6-0)) and M strategy (plane line, Fig. [3](#page-6-0)) redundancy curves. The optimal size for the core collection to avoid redundancy was between 24 and 48 accessions, leading us to construct core collections of up to 48 accessions.

The core collections were identified using MStrat software and the MLST stategy for nested core collections of Fig. 1 Plot of the Mantel test between the distance matrices of population differentiation using Rst statistics for our set of 13 markers compared to a set of 101 markers for a common set of 356 accessions

12, 24 and 48 accessions. The genotypes in Core12, Core24 and Core48 for both of the strategies are presented in (Tables [3](#page-4-0)) (M strategy) and [4](#page-7-0) (MLST strategy). The number of alleles, the observed heterozygosity (H_o) , the gene diversity (GD) and the number of accessions within each diversity group for the different core collections are presented in Table [5.](#page-8-0) The number of alleles was constantly higher in the core collections that were constructed with the M strategy than in those that were constructed with the MLST strategy for either size. In Core48_MStrat, all of the alleles were present, while only 87 % of the alleles were present using the MLST strategy. The H_o increased in Core12_MStrat (0.51) and Core24_MStrat (0.53) and decreased in Core48_MStrat (0.45). The H_o was always lower when using the MLST strategy, with the highest value of 0.43 in Core12_MLST. The GD increased in all the core collections using the MLST strategy, reaching a value of 0.80 in Core48_MLST, but decreased in Core48_MStrat, with a value of 0.79. The GD was slightly higher in Core48_MLST than in Core48_MStrat. The number of accessions per diversity group was different in both of the approaches, illustrating the differences in the strategies when constructing core collections. Regarding Core12, five out of the six diversity groups were retained by both of the methods; the B diversity group was missing in Core12_MStrat and the UW group was missing in Core12_MLST. For the Core48 collections, 19 accessions were common to both of the methods.

Definition of a composite core collection

For both of the Core48 collections, we constructed the diversity trees using DARwin software (Fig. [4\)](#page-9-0). By comparison with the tree in Fig. 2 with 565 genotypes, the diversity of the species was well represented in both of the core collections (Fig. [4\)](#page-9-0). The percentage of present alleles was slightly higher for the M strategy, but the

Fig. 2 Neighbor-joining diversity tree based on the dissimilarity matrices for the set of 565 accessions that were used for the construction of the core collections. The diversity groups are indicated on the tree

tree had longer branches for the MLST strategy because it was based on the pruning of the edges that presented the minimal length, thus maximizing the interleaf distances.

Because both of the strategies had different purposes and gave complementary results, we proposed to merge both of the Core48 collections, leading to a composite core collection of 77 accessions (Table [6\)](#page-10-0). We observed values of 0.41 for the H_0 and 0.79 for the GD, with the presence of all of the alleles from the original set of accessions.

Fig. 3 Redundancy curves that were obtained with MStrat software for the determination of the optimal size of our core collection. The plane line represents the curve using the Maximization strategy, and the dotted line represents the curve using random sampling. The box indicates the location around the inflection point, which determines the optimal size of the core collection

Discussion

General consideration for building nested corecollections for Coffea canephora

We constructed core collections for the C. canephora germplasm from the available genetic diversity within the species using a set of 13 SSR markers that were validated as relevant for our analysis. To address a wide variety of purposes and projects, we choose to construct collections of 12, 24 and 48 accessions (i.e., up to the optimal size as assessed with the M Strategy) using both the MStrat and MLST strategies. The construction of core collections in a highly structured species such as C. *canephora* is possible with a good representation of the diversity in terms of alleles using 48 genotypes.

For perennial tropical crops such as coffee, constructing these core collections is of great interest. Field collections cover large areas and are costly to manage for research centers worldwide. It will be easier to manage and characterize smaller core collections. These core collections could be associated with ''reference'' general collections, such as those from the Ivory Coast and Uganda, which cover a high variability within C. canephora and other coffee species. For coffee germplasm management, we should consider both germplasm conservation and breeding perspectives.

These core collections are useful for a variety of purposes: gene discovery, Genotyping by Sequencing and the massive sequencing of selected genotypes. The construction of these collections could also be used as the first step of association studies on the whole diversity or on a specific diversity group. These core collections can also be used for the detection of signature of adaptive selection and the detection of genomic regions that are submitted to selective pressure such as abiotic stress.

Different strategies for constructing core collections lead to different results

Both of the strategies for core collection construction were based on different finalities for germplasm management and valorization. With the M strategy, the number of alleles was maximized, meaning that the main objective of this strategy was to preserve the highest number of alleles, leading to a ''conservation''-oriented strategy in core collection construction. The MLST strategy differs because the aim was to maintain most of the diverse combinations of alleles in specific genotypes. We could state that this strategy was more orientated toward ''breeding'' to maintain the most diverse combinations of alleles within selected genotypes. Comparing both of the Core48 collections, the difference in the sampling strategies is well illustrated by the higher conservation of diversity groups in Core48MStrat with higher bootstraps values.

For conservation purposes, the M strategy is the most adapted. Core12_MStrat will be a valuable and affordable tool for targeted resequencing. The Core24_MStrat collection could be a good equilibrium for a first core collection to be shared by most researchers because it gathers 88 % of the alleles with a gene diversity of 0.81 and a good representation of all of the diversity groups. Core48_MStrat is more complete and should be considered in a second step when the material exchange will be more comfortable for all researchers.

Table 4 List of the selected genotypes for the 12, 24 and 48 core collections using the MStrat strategy: name, population of origin, diversity group and country of collection

Compulsory accessions are shown in bold

Table 5 List of the selected genotypes for the 12, 24 and 48 core collections using the MLST strategy: name, population of origin, diversity group and country of collection

Compulsory accessions are shown in bold

Fig. 4 Neighbor-joining diversity trees based on dissimilarity matrices for the Core48_MStrat and Core48_MLST accessions. Each accession is identified by its name on the tree, and the diversity groups are indicated

In a breeding strategy, MLST appears to be more adapted because this methodology maximizes the combination of allele diversity at the genome level. Breeders managing diversity in long-term breeding programs, such as those in the Ivory Coast and Uganda, could prefer to use and exchange accessions from the Core48_MLST collection, which gathers 87 % of the alleles for a gene diversity of 0.80 and displays a complete representation of the diversity groups.

Combining the best of two worlds, proposing a composite core collection that is built with different approaches and objectives

Regarding the specificity and different objectives of the two methods that were used, we propose a global core collection of 77 accessions that should be adapted for both germplasm conservation and breeding perspectives.

The composite Core77 collection gathered genotypes representing both the maximum number of alleles and the most diverse allelic combinations. This ''optimal'' core collection could be considered as the basic C. canephora collection that allows for all possible uses, from the simple choice of genotypes for specific aims (tolerance to a specific pest or specific characteristics of the coffee bean) to long-term breeding strategies using a large diversity panel to improve populations and select specifically adapted high-yielding genotypes that are tolerant to biotic and abiotic stress and that produce a high-quality coffee.

Limitations of phenotypic information

Our core collections were constructed considering the marker diversity without reference to the phenotypic diversity as reliable phenotypic data are not available for all of the accessions. We only have partial data from the field collections, mainly in the Ivory Coast and Uganda, under different edaphoclimatic conditions. These data provide some indications of the yield components, quality traits and tolerance to biotic and abiotic stresses. The choice of the five mandatory genotypes was based on the phenotypic or genotypic values of the genotypes. For example, the accession "126" is presents the best organoleptic quality associated with a high agronomic value. This accession has been widely distributed in a high number of African countries, including Togo, Guinea and Cameroon, as a reference for the yield and quality. The accessions "410", "A03" and "466" have specific genotypic values by crossing with genotypes from other diversity groups in the Reciprocal Recurrent Selection program in the Ivory Coast. These accessions are progenitors of the best hybrids in the Ivory Coast and have been distributed all over the world through improved seeds. The use of our proposed core collections will facilitate the construction of a multilocal phenotypic evaluation of the proposed accessions under the different edaphoclimatic conditions from the Ivory Coast to Brazil and from Uganda to Ecuador with different levels of biotic and abiotic stresses.

Table 6 List of the 77 accessions for the composite core collection: name, population of origin, diversity group, country of collection and core origin

Potential for enhancing Coffea canephora breeding programs and research networks

Beyond the limited number of genotypes, core collections are of great interest for facilitating and promoting material exchange between research centers. The exchange of genotypes for strictly allogamous perennial species such as C. canephora should be based on cuttings. As far as we know, all of the genotypes that are described in the 565 set are available from each field collection manager. This exchange will then allow breeders and collection managers to build an international network of coffee conservation and breeding. The diverse climatic conditions, the diversity of stresses and the specific selection criteria will allow breeders from all countries to use this core collection for their specific interest and to share their results with other research teams. These exchanges are currently quite infrequent due mainly to the lack of knowledge about the collections that are available elsewhere and their diversity. Our work will contribute to a better mutual knowledge of the available diversity throughout the ''canephora world'' and of the potential to construct a common set of diversity analyses through producing countries.

Considering the accessions that are currently present under the different field collections, we can already propose some exchanges between research centers based on our results. For example, it should certainly be of interest for the breeding program of recurrent selection in the Ivory Coast to integrate certain UW genotypes from the Ugandan group as a specific population. Guinean genotypes, mainly in field collections in the Ivory Coast, should be of interest for use as genitors in breeding strategies in Uganda, DRC, Brazil and Ecuador. The SG1 genotypes from the DRC seem to be highly representative from this group, and their integration in programs in other countries, in Uganda as well as the Ivory Coast, will be of interest.

The proposed CC48 and CC77 core collections should provide these research centers access to a representation of the whole genetic diversity that is currently available for C. canephora.

Paving the way for association mapping

The definition of core collections could also be the first step for further analyses such as association studies. In C. canephora, diversity studies have been complemented with genetic mapping (Leroy et al. [2011](#page-13-0); Crouzillat et al. [2013\)](#page-13-0) and Linkage Disequilibrium (LD) studies (Cubry et al. [2013b\)](#page-13-0). These two types of analyses are preliminary steps in setting up association studies.

Association studies are performed on non-structured populations to associate markers with phenotypic diversity. As has already been proposed in grapes (Barnaud et al. [2006\)](#page-13-0) and olives (El Bakkali et al. [2013](#page-13-0)), core collections can help to manage association studies for breeding complex traits within species. As a first step, LD studies in coffee populations can define the density of markers that are necessary for efficient association studies (Rafalski [2009\)](#page-14-0). In our species, the density of markers should be very different depending on the breeding populations from the six diversity groups. For example, the marker density should be far lower for the Guinean genotypes than for the SG2 genotypes (Cubry et al. [2013a](#page-13-0)). Ongoing work using GbS will allow in the short-term for a high number of markers that are well dispersed throughout the genome.

In a second step, association studies could be performed in the target populations by identifying marker alleles that are associated with favorable phenotypic traits. For example, in Guinean populations where LD is rather persistent, association studies could be initiated for certain agronomical such as bean size and certain quality traits such as caffeine content with a medium marker density (Cubry et al. [2013b](#page-13-0)). In the whole core collection that was defined in the present study (77 accessions), the structure of the genetic diversity has been erased. Therefore, association studies could be performed on this core collection for traits of high heritability, such as bean size, vigor or tolerance to biotic stresses, when a high density of markers throughout the genome will become available.

Large perspectives for purpose-oriented core collections

This study provides a foundation for building different core collections depending on the objectives of the different research programs. We provide here only a global diversity-oriented construction of a core collection as this construction appears the most appropriate for immediate material exchange. However, one should be interested in studying adaptive evolution and identifying selective marks at the diversity group level. We provide here useful information for the construction of specific, small core collections in every known diversity group. These ''groupnested'' core collections might be useful for specific purposes and research objectives. We suggest using the MStrat strategy when building these nested core-collections because this approach will better capture the whole genetic diversity of the considered genetic group. We propose such core collections in the supplementary material (Supplementary 2). In the near future, these sets will be useful for gene discovery, the study of adaptive selection, massive genome resequencing and GbS studies. From a medium- and long-term perspective, these core collections could be used as kernels for the implementation of association studies in C. canephora supplemented with genotypes regarding specific objectives.

Conclusion

In the present study, we define core collections within our working species, C. canephora, that are well-suited for different objectives and projects. Given its economic importance and new challenges to coffee growers, such as pests and the adaptation to climate changes, it appears highly important to develop such resources. These core collections are valuable tools for all researchers working on coffee diversity and breeding and should facilitate the construction of an international network for the management of coffee diversity, conservation and breeding with an active mutual exchange of material and information. These collections will enhance breeding programs worldwide and pave the way for association studies and for the global management of coffee diversity in breeding programs.

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