

TECHNOLOGY REPORT published: 27 June 2016 doi: 10.3389/fpls.2016.00878



# PlantFuncSSR: Integrating First and Next Generation Transcriptomics for Mining of SSR-Functional Domains Markers

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### **OPEN ACCESS**

#### Edited by:

Xiaowu Wang, Chinese Academy of Agricultural Sciences, China

#### Reviewed by:

Jianjun Zhao, Hebei Agricultural University, China Kui Lin, Beijing Normal University, China

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#### Specialty section:

This article was submitted to Plant Genetics and Genomics, a section of the journal Frontiers in Plant Science

> **Received:** 08 April 2016 **Accepted:** 03 June 2016 **Published:** 27 June 2016

#### Citation:

Sablok G, Pérez-Pulido AJ, Do T, Seong TY, Casimiro-Soriguer CS, La Porta N, Ralph PJ, Squartini A, Muñoz-Merida A and Harikrishna JA (2016) PlantFuncSSR: Integrating First and Next Generation Transcriptomics for Mining of SSR-Functional Domains Markers. Front. Plant Sci. 7:878. doi: 10.3389/fpls.2016.00878 Analysis of repetitive DNA sequence content and divergence among the repetitive functional classes is a well-accepted approach for estimation of inter- and intrageneric differences in plant genomes. Among these elements, microsatellites, or Simple Sequence Repeats (SSRs), have been widely demonstrated as powerful genetic markers for species and varieties discrimination. We present PlantFuncSSRs platform having more than 364 plant species with more than 2 million functional SSRs. They are provided with detailed annotations for easy functional browsing of SSRs and with information on primer pairs and associated functional domains. PlantFuncSSRs can be leveraged to identify functional-based genic variability among the species of interest, which might be of particular interest in developing functional markers in plants. This comprehensive on-line portal unifies mining of SSRs from first and next generation sequencing datasets, corresponding primer pairs and associated in-depth functional annotation such as gene ontology annotation, gene interactions and its identification from reference protein databases. PlantFuncSSRs is freely accessible at: http://www.bioinfocabd.upo.es/plantssr.

Keywords: short tandem repeats (STRs), NGS, gene ontology (GO), inter-pro, functional domains markers

## INTRODUCTION

Identification of repetitive patterns in genomic DNA has proved to be a powerful approach to reveal diversity and to discriminate plant populations and individuals within species. Microsatellites or Simple Sequence Repeats (SSRs) formed as a result of the strand-slippage mechanism (Schlötterer and Harr, 2001) have been used widely as functional genetic markers (Studer et al., 2010), for testing genetic fidelity, genetic variability (Rahman and Rajora, 2002; Schellenbaum et al., 2008) and for population genetic studies (Sim et al., 2009). However, the previously described approaches such as by screening the small insert genomic DNA libraries (Shokeen et al., 2007) are time

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consuming and not so cost effective. Furthermore, SSRs identified by such approaches have no certainty of association to the functional domains. Leveraging the computational advances, *in silico* mining approaches using transcriptomics have filled a major gap in the development of these functional classes of markers (Sablok and Shekhawat, 2008; Sablok et al., 2011), which could be potentially used for developing the markers harboring the functional domains for marker assisted gene selection, genotyping, and anchoring quantitative trait localization (QTL; Parida et al., 2010; Kujur et al., 2013) mainly due to the associative nature of the mined SSRs to the coding region variations and the associated functional variations.

Recently, several SSRs have been linked to putative functional domains; classifying them into a new class of functional markers called simple sequence repeats functional domains markers (SSR-FDMs) in model and non-model species (Yu et al., 2010; Bhattacharyya et al., 2014). Realizing the wide importance of SSRs, several online repositories and data mining tools have been developed to address the need for on-line mining of these markers in case of nuclear genomes such as PlantMarkers (Rudd et al., 2005), SSR Biome and SSR taxonomy (Jewell et al., 2006), UgMicroSatDb (Aishwarya and Sharma, 2008), MoccaDB (Plechakova et al., 2009), CicArMiSatDB (Doddamani et al., 2014), and for Coffee expressed sequence tags (ESTs) (Poncet et al., 2006) to assist the mining of the SSRs. However, there are some limitations to the previously developed tools that have restricted, in particular, the possibility to make comparisons across different datasets from different species as they either lack integration of the browsing platform with unified annotations or they are oriented toward specific species such as CicArMiSatDB (Doddamani et al., 2014), and FmMDb (B et al., 2013). In case of organelle genomes, we previously established ChloroMitoSSRDB (Sablok et al., 2013) and ChloroMitoSSRDB 2.00 (Sablok et al., 2015) to provide the large-scale access to the organelle derived markers.

Next generation sequencing (NGS) provides a cost-efficient way of transcript identification and facilitates the development of transcript based SSRs markers for model and non-model species, which has resulted in rapid increases in the data made available online. However, much of this data is scattered across numerous websites and has not been mined or annotated for the identification of functional SSRs. Recently, there have been some efforts to consolidate such data for example TropiTree<sup>1</sup> is a repository displaying the mined SSRs from NGS transcript assemblies for 24 tropical plants (Russell et al., 2014). Taking into account the limitations mentioned, we were motivated to develop PlantFuncSSRs, available at http://www.bioinfocabd.upo.es/plantssr, which is a unified functional SSRs portal displaying mined functional SSRs from 274 ESTs based transcript assemblies, and more than 100 NGS transcripts assemblies. PlantFuncSSRs also provides detailed primer pair information, functional annotations, and putative homologs to the transcript assemblies in Uniprot and curated SSR-FDMs in a single unified platform. We believe that the availability of the above resource will aid the rapid development of functional SSRs in non-model plant species.

## MATERIALS AND METHODS

### Data Resources for PlantFuncSSRs

To integrate previously published plant EST data, all Putative Unique Transcripts (PUT) representing 273 transcript assemblies were downloaded from PlantGDB (Version release 187) available from http://www.plantgdb.org/ (Dong et al., 2004). Additionally, version control 74 NGS transcriptomes available at PhytoMetaSync<sup>2</sup> (Facchini et al., 2012; Xiao et al., 2013), 14 medicinal plant transcriptomes available from medicinal plant genomics resource (MPGR)<sup>3</sup> (Góngora-Castillo et al., 2012; Góngora-Castillo and Buell, 2013) and 3 *Brachypodium sylvaticum* transcriptomes available from http://jaiswallab.cgrb.oregonstate.edu/genomics (Fox et al., 2013) were downloaded, representing a total of 364 plant species.

# SSRs Identification and Functional Assignments

For systematic identification of SSR, all the transcripts (ESTs as well as NGS) assemblies were first scanned for the presence of the homopolymer errors and sequence ambiguity was removed using the est\_trimmer tool available at: http://pgrc.ipk-gatersleben.de/misa/download/est\_trimmer.pl with the following settings: -amb = 2.50 -tr5 = T, 5.50 -tr3 = A, 5.50. Following the transcript ambiguity removal and trimming of the homopolymer runs, MISA (MIcroSAtellite identification tool) (Thiel et al., 2003) was deployed to identify the microsatellites. In the present version of the PlantFuncSSRs, we classified microsatellites as repetitive stretches of motifs of a minimum and 12-mer repetitive stretches as di, 4-mer

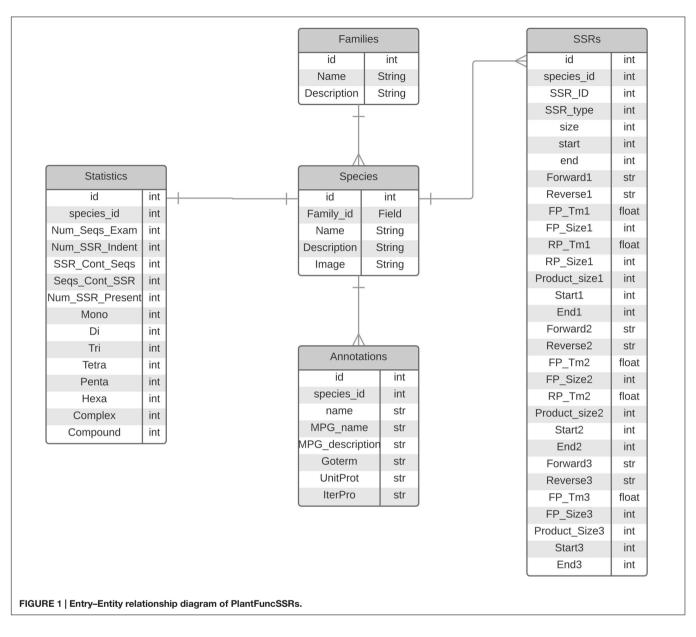
<sup>2</sup>http://www.phytometasyn.ca

<sup>3</sup>http://medicinalplantgenomics.msu.edu

TABLE 1 | Table describing the classified repeats types and embedded functional categories in PlantFuncSSRs.

Type of SSRs	Number of SSRs
P1 SSRs-FDMs	221008
P2 SSRs-FDMs	200702
P3 SSRs-FDMs	1067949
P4 SSRs-FDMs	358245
P5 SSRs-FDMs	102593
P6 SSRs-FDMs	142452
Compound SSRs-FDMs (C and C*)	292472
Functionally embedded SSRs annotations	
Gene names	2278574
Descriptions	2332906
Gene ontologies	1986736
Uniprot (keywords)	2122976
InterPro domains	2172553

<sup>&</sup>lt;sup>1</sup>http://bioinf.hutton.ac.uk/tropiTree

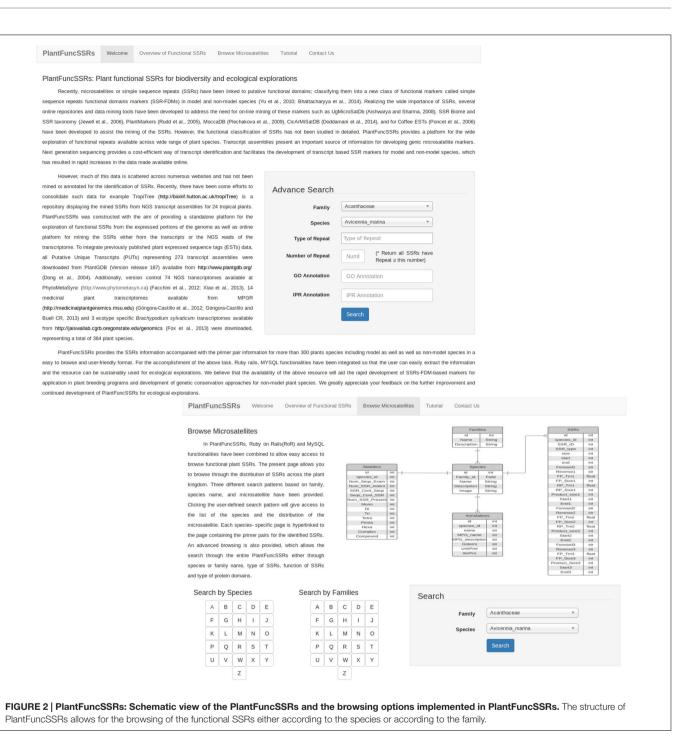


repetitive stretches of tri- and tetra-, and a minimum of 3-mer repetitive stretch as penta- and hexa-nucleotide. Additionally, the identified SSRs have been classified into perfect and compound repeats, with compound repeats interrupted by a minimum of 100 bp as previously described (Victoria et al., 2011). Primer pairs were designed for all of the identified SSRs using primer3 available from primer3.sourceforge.net (Untergasser et al., 2012) using the settings as described in MISA (Thiel et al., 2003).

Following SSRs identification, in-depth functional annotation of the identified SSRs was carried out using the standalone annotator Sma3s (Muñoz-Mérida et al., 2014), which uses the plant taxonomic division set in the Uniprot database<sup>4</sup>, including both Swiss-Prot and TrEMBL sections to enrich the final

<sup>4</sup>http://www.uniprot.org

annotation. The annotations gave the found Gene Ontology (GO) terms which were subsequently linked to their GO\_SLIM terms using the plant GO slim available from www.geneontology.org, in order to simplify the GO terms and allow cross-comparison. In this way, each SSRs sequence was identified with the more probable gene name and description, as well as both GO terms from the existing three categories and Swiss-Prot keywords, all of them for cataloging the SSRs and assigning functional domains. The IntAct annotations and Interactions were crosslinked using the IntAct resources available from EBI at: http://ww w.ebi.ac.uk/intact/. The functional SSRs annotation also includes putative InterPro domains (Quevillon et al., 2005, pathways from UniProt to have more details of the involved biological processes. PlantFuncSSRs presents only those SSRs, which have functional annotations appended to them and are thus termed as SSR-functional markers.



### **RESULTS AND DISCUSSION**

# PlantFuncSSRs Architecture and Visualization

Expressed sequence tags and NGS based Transcriptome reconstruction represent the functional portion of the genome and have been widely used as resources to mine and develop functional markers. Developing an efficient browsing system for the mining of repeats is an important task, as this can be widely applied to a wide range of on-going plant breeding and crop improvement research. To develop an efficient browsing system, PlantFuncSSRs architecture has been developed using Ruby Rails and MySQL, which provides faster integration and query based searches to the users. The current version of the PlantFuncSSRs presents more than 2 million SSRs and SSR-FDMs from 364 species for easy access and browsing of transcript derived plant SSRs across the plant kingdom (**Table 1**). These species are ranging from important crops to wild species, from

PlantFu	ncSSRs	Welcome	Overview of Funct	ional SSRs Brow	vse Microsatell	ites Tuto	rial Contact Us						
Search by Sp	ecies:	АВ	C D E F	G H I J	K L M	N O	PQRS	T U V	W X	Y Z			
Copy Excel	CSV Sh	ow 10 •	entries										
Specie Name			Num Seqs Exam ↓	Size Exam Seqs	Num SS	iR ↓↑	SSR Cont Seqs	Seqs Con SSR	t ↓†	Num SSR Present	Į:	Get Repeat	11
Abies_balsame	a_B1		82816	78979398	13201		10521	1959		923		Get Repe	at
Acacia_victoria	e_RI1		139945	97632297	20324		16796	2719		1603		Get Repe	at
Actinidia_chiner	nsis		18734	11687951	7289		5408	1401		1112		Get Repe	at
Total size o	er of sequence	equences (bp):	atistics	82816 789793 13201	398	C		Compound: 0.0 %	<b>16</b> )				=
		ig sequences:		10521			Complex: 1.9 %						-
		ntaining more t	nan 1 SSR:	1959		Pe	Hexa: 3.5 %						
		in compound for		923			n: 9.8 %				1	Mono: 31.7 9	6
		ary Perfect											
SSR Type		Numbers	Details										
Mono		130	Click for F			Tri: 2	7.3 %						
Di		361	Click for F										
Tri		3210	Click for F										
Tetra Penta		481	Click for F							Di: 2	3.2 %		
Hexa		733	Click for F										
Complex		446	Click for F										
Compound		22	Click for F										
Total		7077	Click for I										
	Copy Ex	cel CSV S	how 50 🔹 e	entries									
	SI_No 1	SSR ID		lt.	SSR Type ↓↑	SSR	ļţ	SSR Size ↓↑	SSR Start	SSR End	11	Primer ↓↑	Annotation
	1	gnl MAGPIE ab comp100101_c	a.ABB1JB_Trinity 0_seq4		Hexa	(AGGAGC	)3	18	98	115		Primers	Annotation
	2	gnl MAGPIE ab comp101010_c	a.ABB1JB_Trinity 2_seq2		Tri	(TTA)4		12	364	375		Primers	Annotation
	3	gnl MAGPIE ab comp101917_c	a.ABB1JB_Trinity 0_seq2		Hexa	(ATGGCA)	4	24	502	525		Primers	Annotation
	4	gnl MAGPIE ab comp101972_c	a.ABB1JB_Trinity 0_seq1		Hexa	(CAGCAA)	3	18	6327	6344		Primers	Annotation
	5	gnl MAGPIE ab comp102029_c	a.ABB1JB_Trinity 0_seq1		Tri	(TCT)4		12	780	791		Primers	Annotation
	6	comp106177_c			Tri	(AGA)4		12	413	424		Primers	Annotation
	7	comp106177_c			Tri	(GAG)5		15	714	728		Primers	Annotation
	8	comp108456_c			Tetra	(AATA)3		12	1442	1453		Primers	Annotation
	9	gnl MAGPIE ab comp40044_c0	a.ABB1JB_Trinity _seq1		Tetra	(TGCC)3		12	1337	1348		Primers	Annotation
	10		a.ABB1JB_Trinity		Tetra	(GGAT)3		12	3664	3675		Primers	Annotation

FIGURE 3 | Alphabet sorting of the species names and search patterns (A); Species specific page showing the information on the identified Simple Sequence Repeats (SSRs) and also the functional SSRs. "Click for repeats" pages are directly hyperlinked to the functional SSRs (B); Weblayout describing the functional repeats identified in the respective plant species with information on type of repeat, classification of repeat, size, motif, start, and end coordinates and associated primers and functional annotation (C).

rs with Primer a_B1 csv_Show_50 GPIEJaba_ABB1JB_Trint, 00101_c0_seq4 GPIEJaba_ABB1JB_Trint;	Primer gnl MAGPIE aba.ABB Primer-I GAGCAACAAGCAAG Tm 59.967		10_c2_seq2 Reverse Primer TGCGCCATGACAAT Tm	CTCACT	×			Q Search			
a_B1	Primer-I Forward Primer GAGCAACAAGCAAG	GTTGGGG Size	Reverse Primer	CTCACT				Q Search			
GPIEJaba.ABB1J8_Trinit, 00101_c0_seq4 GPIEJaba.ABB1J8_Trinit,	Forward Primer GAGCAACAAGCAAG Tm	Size	TGCGCCATGACAAT	CTCACT							
GPIEJaba.AB81JB_Trinity 00101_c0_seq4 GPIEJaba.AB81JB_Trinity	GAGCAACAAGCAA	Size	TGCGCCATGACAAT	CTCACT							
GPIEJaba.AB81JB_Trinity 00101_c0_seq4 GPIEJaba.AB81JB_Trinity	Tm	Size		CTCACT							
GPIE aba.ABB1JB_Trinit) 00101_c0_seq4 GPIE aba.ABB1JB_Trinit)			Tm								
00101_c0_seq4 GPIE[aba.ABB1JB_Trinit)	59.967	20		Size		SSR End It	Primer 1	Annotation 1			
			60.036	20		115	Primers	Annotation			
01010_c2_seq2	Primer-II					375	Primers	Annotation			
GPIE aba.ABB1JB_Trinity	Forward Primer		Reverse Primer			525	Primers	Annotation			
01917_c0_seq2	GAGCAACAAGCAA	GTTGGGG	TATCTGCCTTTGCG	CCATGA							
GPIE aba.ABB1JB_Trinity 01972_c0_seq1	Tm	Size	Tm	Size		3344	Primers	Annotation			
GPIE[aba.ABB1JB_Trinit) 02029_c0_seq1	59.967	20	60.107	20		791	Primers	Annotation			
GPIE aba.ABB1JB_Trinity 06177 c0 seq1						124	Primers	Annotation			
GPIE aba.ABB1JB_Trinit)						728	Primers	Annotation			
GPIE aba.ABB1JB_Trinity 08456_c0_seq1						1453	Primers	Annotation			
GPIE aba.ABB1JB_Trinit) 0044_c0_seq1	60.108	20	60.036	20		1348	Primers	Annotation			
GPIE aba.ABB1JB_Trinit) 7326_c0_seq1	Tm: Optimumn m	nelting temprature(°C)			Close	3675	Primers	Annotation			
GPIE aba.ABB1JB_Trinity 2236_c0_seq1	Size: Optimumn leng	th of a Primer(bases)									
0: G0: G0: G0: G0: G0: G0: G0: G0: G0: G	1917_c0_seq2 PIE[aba.ABB1J8_Trinh, 1972_c0_seq1 PIE[aba.ABB1J8_Trinh, 2029_c0_seq1 PIE[aba.ABB1J8_Trinh, 3177_c0_seq1 PIE[aba.ABB1J8_Trinh, 3456_c0_seq1 PIE[aba.ABB1J8_Trinh, 344_c0_seq1 PIE[aba.ABB1J8_Trinh, 326_c0_seq1 PIE[aba.ABB1J8_TRINH, 326_c0_seq1 PIE[aba.ABB1J8_TRINH, 326_c0_seq1 PIE[aba.ABB1J8_TRINH, 326_c0_seq1 PIE[aba.ABB1J8_TRINH, 326_c0_seq1 PIE[aba.ABB1	1917_c0_seq1     GAGCAACAAGCAA       PIE[aba.ABB1JB_Trint]     Tm       1972_c0_seq1     59.967       PIE[aba.ABB1JB_Trint]     Frimer-III       PIE[aba.ABB1JB_Trint]     Forward Primer       PIE[aba.ABB1JB_Trint]     Forward Primer       PIE[aba.ABB1JB_Trint]     CAAGTTGGGGTAG       PIE[aba.ABB1JB_Trint]     Tm       PIE[aba.ABB1JB_Trint]     CAAGTTGGGGTAG       PIE[aba.ABB1JB_Trint]     Tm       60.108     GAGCAACAAGCAA       PIE[aba.ABB1JB_Trint]     Tm       PIE[aba.ABB1JB_Trint]     Tm       PIE[aba.ABB1JB_Trint]     Size: Optimumn Ing       PIE[aba.ABB1JB_Trint]     Size: Optimumn Ing	1917_c0_seq2     GAGCAACAAGCAAGTTGGGG       PIEJaba ABB1JB_Trimp     Tm     Size       91972_00_seq1     59.967     20       PIEJaba ABB1JB_Trimp     Primer-III     Primer-III       9177_c0_seq1     Forward Primer     CAAGTTGGGGTAGAGAGCCG       PIEJaba ABB1JB_Trimp     CAAGTTGGGGTAGAGAGCCG       PIEJaba ABB1JB_Trimp     Tm     Size       60.108     20       PIEJaba ABB1JB_Trimp     Tm     Size       60.108     20       PIEJaba ABB1JB_Trimp     Tm     Size       60.108     20     CAGTTGGGGTAGAGAGCCG	1917_c0_seq2     GAGCAACAAGCAAGTGGGG     TATCTGCCTTTGGG       PIEJaba ABB1JB_Trimp     Tm     Size     Tm       PIEJaba ABB1JB_Trimp     59.967     20     60.107       PIEJaba ABB1JB_Trimp     Primer-III     Primer-III       PIEJaba ABB1JB_Trimp     Forward Primer     Reverse Primer       PIEJaba ABB1JB_Trimp     CAAGTTGGGGTAGAGAGCCG     TGCGCCATGACAAT       PIEJaba ABB1JB_Trimp     Tm     Size       PIEJaba ABB1JB_Trimp     60.108     20     60.036       PIEJaba ABB1JB_Trimp     Tm     Size     Tm       PIEJaba ABB1JB_Trimp     Tm     Size     Tm       PIEJaba ABB1JB_Trimp     Tm     Size     Tm       PIEJaba ABB1JB_Trimp     Forward Primer     Forward Primer     Size       PIEJaba ABB1JB_Trimp     Forward Primer     Size     Tm       PIEJaba ABB1JB_Trimp     Forward Primer     Size     Tm       PIEJaba ABB1JB_Trimp     Forward Primer     Size     Tm       PIEJaba ABB1JB_Trimp     Tm     Size     Tm       PIEJaba ABB1JB_Trimp     Forword Primer     Size     Tm       PIEJaba ABB1JB_Trimp     Forword Primer     Size     Tm       PIEJaba ABB1JB_Trimp     Forword Primer     Size     Tm	IBIT c0_seq2     GAGCAACAAGCAAGTGGGG     TATCTGCCTTTGCGCCATGA       PIEJaba ABBJB_Timin     Tm     Size     Tm     Size       PIEJaba ABBJB_Timin     59.967     20     60.107     20       PIEJaba ABBJB_Timin     Tm     Size     Tm     Size       PIEJaba ABBJB_Timin     Forward Primer     Reverse Primer     Imm       PIEJaba ABBJB_Timin     Forward Primer     Reverse Primer     Imm       PIEJaba ABBJB_Timin     GAGTTGGGGTAGGGGCCG     TGCGCCATGACAATCTCACT       PIEJaba ABBJB_Timin     Size     Tm     Size       PIEJaba ABBJB_Timin     60.108     20     60.036     20       PIEJaba ABBJB_Timin     Tm: Optimumn melting temprature(°C)     Tmi: Optimumn melting temprature(°C)     Size	Tan     Size       PElaba ABBJB_Trima     59.967     20     60.107     20       PElaba ABBJB_Trima     Primer-III     Forward Primer     Reverse Primer       PElaba ABBJB_Trima     Forward Primer     Reverse Primer       PElaba ABBJB_Trima     Tan     Size       PElaba ABBJB_Trima     Forward Primer     Reverse Primer       PElaba ABBJB_Trima     Forward Primer     Reverse Primer       PElaba ABBJB_Trima     Tan     Size       PElaba ABBJB_Trima     Size     Size	1917_c0_seq2     GAGCAACAAGCAAGTGGGG     TATCTGCCTTTGCGCCATGA     344       PE[aba ABBJB_Tinn]     Tm     Size     71       PE[aba ABBJB_Tinn]     Primer-III     20     00.107     20     71       PE[aba ABBJB_Tinn]     Primer-III     Forward Primer     24     24       PE[aba ABBJB_Tinn]     Primer-III     517     C0.seq1     517     517       PE[aba ABBJB_Tinn]     Tm     Size     TGCGCCATGACAATCTCACT     25       PE[aba ABBJB_Tinn]     Tm     Size     76     343       PE[aba ABBJB_Tinn]     Tm     Size     76     343       PE[aba ABBJB_Tinn]     CAAGTTGGGGTAGAGAGCCG     60.036     20     343       PE[aba ABBJB_Tinn]     Size     Tm     Size     343       PE[aba ABBJB_Tinn]     C0.108     20     60.036     20     343	1917_co_seq2     GAGCAACAAGCAAGTIGGGG     TATCTGCCTTTGCGCCATGA     344     Primers       1972_co_seq1     Tm     Size     70     20     60.107     20     91     Primers       PE[aba ABBJB_Timp     59.967     20     60.107     20     91     Primers       PE[aba ABBJB_Timp     Primer-III     Forward Primer     Reverse Primer     24     Primers       PE[aba ABBJB_Timp     Primer-IIII     Forward Primer     Reverse Primer     28     Primers       PE[aba ABBJB_Timp     Tm     Size     TGCGCCATGACAATCTCACT     28     Primers       PE[aba ABBJB_Timp     Tm     Size     TGCGCCATGACAATCTCACT     28     Primers       PE[aba ABBJB_Timp     Tm     Size     60.036     20     348     Primers       PE[aba ABBJB_Timp     Tm     Size     348     Primers       PE[aba ABBJB_Timp     Tm     Size     348     Primers       PE[aba ABBJB_Timp     60.108     20     60.036     20     348     Primers       PE[aba ABBJB_Timp     Tm     Size     348     Primers     348     Primers	Bill Propised     GAGCAACAAGCAAGTGGGG     TATCTGCCTTTGCGCCATGA     Image: Constraint of the state of the	IB17_c0_seq2     GAGCAACAAGCAAGTGGGG     TATCTGCCTTTGCCCCATGA       PIEJaba ABBJB_Tinin 1972_c0_seq1     Tm     Size     Nation       PIEJaba ABBJB_Tinin 1972_c0_seq1     Tm     Size     Nation       PIEJaba ABBJB_Tinin 1972_c0_seq1     Primer-III     Primer-III     Primers     Annotation       PIEJaba ABBJB_Tinin 1972_c0_seq1     Primer-III     Reverse Primer     14     Primers     Annotation       PIEJaba ABBJB_Tinin 1972_c0_seq1     Primer-III     Forward Primer     CAAGTTGGGGTAGAGAGCCG     TGCGCCATGACAATCTCACT     14     Primers     Annotation       PIEJaba ABBJB_Tinin 1974_c0_seq1     Tm     Size     Tm     Size     Annotation       PIEJaba ABBJB_Tinin 204_c0_seq1     Collo8     20     60.036     20     143     Primers     Annotation       PIEJaba ABBJB_Tinin 204_c0_seq1     Tm     Size     Tm     Size     Annotation       PIEJaba ABBJB_Tinin     Tm     Size     Annotation     143     Primers     Annotation       PIEJaba ABBJB_Tinin     Tm     Size     Annotation     143     Primers     Annotation       PIEJaba ABBJB_Tinin     Tm     Size     Size     145     Primers     Annotation       PIEJaba ABBJB_Tinin     Tm     Size     Primers     Annotation     145	BBL7_c0_seq2     GAGCAACAAGCAAGGCAAGTGGGG     TATCTGCCTTTGCCCCATGA     Image: Constraint of the second of the se

FIGURE 4 | Pop-up Primer display window for the user selected functional SSRs (A); Pop-up window showing high throughput functional annotation for the user selected functional SSRs (B).

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gnl|MAGPIE|aba.ABB1JB\_Trini comp101972\_c0\_seq1

gnl|MAGPIE|aba.ABB1JB\_Trinit comp102029\_c0\_seq1

gnl|MAGPIE|aba.ABB1JB\_Trinit comp106177\_c0\_seq1

gnl[MAGPIE]aba.ABB1JB\_Trini comp106177\_c0\_seq1

gnl|MAGPIE|aba.ABB1JB\_Trinit comp108456\_c0\_seq1

gnl|MAGPIE|aba.ABB1JB\_Trini comp40044\_c0\_seq1 gnl|MAGPIE|aba.ABB1JB\_Trini comp67326\_c0\_seq1

gnl|MAGPIE|aba.ABB1JB\_Trinit comp72236\_c0\_seq1 Unit Prot Keyword

Electron transport

Membrane Mitochondrion NAD

Oxidoreductase Transmembrane Ubiquinone

Inter Pro

IPR001694 IPR018086 Annotation

344

91

675

Close

mono- to di-cots, from annual to polyannual and wood species. Integration of visualization features with the rapid mining of the data is a key central feature that has been implemented in the PlantFuncSSRs. A schema of the database architecture in the form of entity-relationship is given in Figure 1. For the visualization of the SSRs and the associated information, several hierarchal levels of classified information have been inter-linked in PlantFuncSSRs (Figure 2). The front-end portal is user-friendly and allows the end-users to search SSRs as "specieswise", "family wise", or "advanced search menu" (Figure 2). A quick search implementation pattern displays the embedded species information in quick select "species" and "families", which are hyperlinked pages to the respective species and provide a quick view of the functional SSRs present in each species. Figure 3 shows the webpage browsing of PlantFuncSSRs with detailed classification of the identified SSRs for user-selected species of interest. Alphabetical classification of the species provides an additional advantage for the users to quickly look for their species of interest (Figure 3).

Each record in the species displays the Species\_Name, Num Seqs Exam, Size Exam Seqs, Num\_SSR\_Ident, SSR\_Cont\_Seqs, Seqs\_Cont\_SSR, Num\_SSR\_Present and providing summarized information on the number of the identified SSRs for that particular species of interest lined to the primer pair information and high throughput functional annotation (Figure 3). In PlantFuncSSRs, each species page has been hyperlinked to the corresponding repeat information pages that present detailed information on several statistics such as total number of sequences examined, total size of examined sequences (bp), total number of identified SSRs, number of SSR containing sequences, number of sequences containing more than one SSR and compound SSRs (Figure 3). In addition, to this summary information, each species classified page also details the types and distribution of the repeats in tabular format, which can be sorted "on the fly". An integral part of PlantFuncSSRs is to describe the associated primer pair information for each species to facilitate the development of functional SSRs for diversity analysis. To augment such capacity, each functional SSR has been associated with primer pages and detailed functional annotations, which describes the set of the "ready to use" primers for the functional validation of the corresponding SSRs (Figure 4).

# Functional SSRs and Functional Importance of PlantFuncSSRs

Microsatellites (SSRs) have been shown to be regulators of a number of plant genes demonstrating their importance as key players in regulating plant function (Faville et al., 2004). FuncPlantSSRs offers a wide variety of functional annotations for the identified SSRs such as GO terms, GO slim categories, pathways, descriptions to identify the sequences and comparing with putative homologues, and motif and domain modules to offer the domain architecture for the sequences. Recently, increasing interest toward the functional linkage of the markers to the domain association and function can be seen from several recent reports in plants such as *Ocimum basilicum* (Gupta et al., 2010), *Seasmum indicum* (Bhattacharyya et al., 2014), Elaeis guineensis (Tranbarger et al., 2012), and Camellia sinensis (Sahu et al., 2012) suggesting the role of the functional SSRs as important markers for developing the functional genic approaches for marker enrichment in plants. Nonetheless, established reports of the functional association of the repeats with the catalytic domains (Parida et al., 2010; Yu et al., 2010) has been widely developed. For quick advanced searches, PlantFuncSSRs offer several functionalities, such as searches customized and optimized on various hierarchal levels i.e., Family, Species, Type of Repeat, Number of Repeat, Functional annotation, GO annotation, and IPR annotations (Figure 2). Availability of the curated information provides end users with the flexibility to narrow their searches to functional SSRs linked to specific categories, motif types or functional annotations. Taking into account the vast amount of the species coverage and associated functional SSRs present in the PlantFuncSSRs, we believe that the PlantFuncSSRs provides access to the most comprehensive catalog available for the functional SSRs from plant transcriptomes.

## CONCLUSION

In the present version of the PlantFuncSSRs, we bring together under a unified portal the mining of the SSRs from the publically available first and second generation datasets. PlantFunctSSRs has been designed with an aim to serve as a stand-alone single access platform for the analysis of functional SSRs from first and NGS datasets for a large number of sequenced plant transcriptomes. In addition to providing the most comprehensive available resource for exploring and validating plant functional SSRs, the built in annotation platform will allow the users to have wide access to the functional relevance of the validated SSRs thus provides a valuable functional SSRs resource to support plant diversity, population and functional marker research.

# AUTHOR CONTRIBUTIONS

GS conceived and designed the research, identified SSRs and linked the SSRs to functions, AP and AM-M provided the annotation, TD build the database and the web-interface, TYS helped in the data integration, CSCS hosted the database, GS wrote the manuscript, NP, AS, PR, and JAH provided revisions. All authors have read and approved the manuscript.

## ACKNOWLEDGMENTS

Gaurav Sablok thanks Plant Functional Biology and Climate Change Cluster (C3), University of Technology Sydney, PO Box 123, Broadway, NSW 2007, Australia, for providing the computational facilities. An internal grant number to GS (2226018) supported this work. JAH and TYS were partially supported by High Impact Research Chancellory Grant UM.C/625/1/HIR/MOHE/SCI/19 from the University of Malaya.

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**Conflict of Interest Statement:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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