

# Proso Millet Nutraceutomics for Human Health and Nutritional Security

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#### Abstract

Proso millet (*Panicum miliaceum L*.) is a climate-resilient, ancient, and glutenfree cereal. This allotetraploid crop is healthy for humans and the environment. Its use as human food is steadily increasing, especially for people with diabetes and celiac disease due to its exceptional nutritional properties and gluten-free starch. There is no comprehensive review on proso millet seed nutraceuticals quantity, quality, characteristics, genetics, genomics (omics), and genetic improvement strategies. This review article aims to summarize published research on these aspects of proso millet seed nutrients and nutraceuticals. There are lots of reports on proso millet seed nutrients (macro, micro, and secondary metabolites) and their health benefits. There are a significant number of resources of "omics" tools for proso millet overall genetic improvement. However, no or very little genetic and genomic information (e.g., genes and genetic control mechanisms) and biosynthesis of majority of the nutraceuticals of proso millet seed are available. It may take years to see the full potential of "omics" for proso millet nutraceutomics. Phytochemical analyses and omics technologies are getting more efficient, faster, and cheaper. With this new opportunity, it is essential that proso millet scientists around the world especially food technologists, plant breeders, and geneticists of both public and private sectors work collaboratively for the genetic improvement of proso millet for nutraceutical. This will stimulate industries to use more proso millet in food products for human health and nutritional security under global climate change.

#### Keywords

Climate-resilient · Gluten-free · Health-promoting · Omics · GWAS · Genomic selection · Nutraceuticals

#### 1 Introduction

Proso millet (*Panicum miliaceum L.*), a small-grain, annual cereal, belongs to the Panicoideae subfamily of the Poaceae family. It is one of the earliest cereal crops domesticated by mankind. It was reported that proso millet was domesticated around 8000 BC in the semi-arid regions of northern China (Lu et al. [2009\)](#page-29-0). This minor millet is known by different names in different geographical locations. The word "proso" is a pan-Slavik name for millet (Santra et al. [2019](#page-30-0)). In the USA, it is

commonly referred to as common millet or hog millet. Proso millet is also known as broomcorn millet in China; common millet in Japan, Korea, and other Asia-Pacific countries; Gijang in Korea; Barri in India; Mijo in Spain; Hersey millet in Germany; and French white or panic millet in France (Santra et al. [2019;](#page-30-0) Das et al. [2019\)](#page-27-0). This millet is globally distributed owing to its wide adaptability to different climatic zones. The most notable countries producing proso millet are China, the USA, India, Ukraine, Russia, Nepal, Belarus, Turkey, and Romania (Das et al. [2019\)](#page-27-0) (Fig. [1\)](#page-2-0). Proso millet seeds were brought to the USA in 1875 by German-Russian immigrants who first cultivated this cereal along the eastern Atlantic coast of the country. Its cultivation later spread westward into the interior of the North American continent (Wietgrefe [1990;](#page-30-1) Santra [2013](#page-29-1); Habiyaremye et al. [2017\)](#page-28-0).

Proso millet plants are erect, 30–100 cm tall with hollow stems (known as *culm*) and an adventitious root system (Baltensperger [2002](#page-27-1)). Proso millet plants develop 10–45 cm long, drooping panicles which can be either open  $(lax)$  or compact. The grains (botanically known as caryopsis) are normally 3 mm long and 2 mm wide. A great deal of variation is observed in the panicle's shape and grain color. The panicle morphology can vary widely from its shape (e.g., compact, open, semi-open), attitude (e.g., erect, semi-erect, dropping), and branches (e.g., lax, medium, and dense). The grains can be white, cream, yellow, red, orange, brown, green, black, or tan (Santra et al. [2019\)](#page-30-0). Proso millet is predominantly self-pollinated with  $\sim10\%$ cross-pollination. It is considered an allotetraploid with nine basic sets of chromosomes ( $2n = 4x = 36$ ). The proso millet genome is estimated to be 930 megabase pairs (Mbp) (Zou et al. [2019\)](#page-30-2). Hunt et al. [\(2014](#page-28-1)) studied the evolution of proso millet species. Proso millet was believed to have evolved through the natural hybridization of two diploid progenitors followed by the natural polyploidization. Hunt et al. reported that diploid witchgrass (Panicum capillare L.) and one diploid parent of the

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Fig. 1 Major proso millet growing countries in the world. (The map was created on mapchart.net (<https://www.mapchart.net/world.html>))

tetraploid torpedo grass  $(P.$  repens) are the probable diploid parents of proso millet (Hunt et al. [2014\)](#page-28-1).

Proso millet is primarily cultivated in the predominantly winter wheat-growing semi-arid areas of the High Plains of the USA (Rajput et al. [2016](#page-29-2)). This region receives an average annual precipitation of ~400 mm. Conserving soil by minimizing water loss and maintaining high organic matter is paramount to sustaining agriculture in this dry region. The usual practice of summer fallow to preserve soil moisture often leads to depletion of soil organic matter (Nielsen and Calderón [2011\)](#page-29-3). Planting wheat following corn and millet and only millet reportedly doubled the productivity in comparison with the wheat-fallow system (Anderson et al. [1999\)](#page-27-2). Even though a wide selection of crops, such as corn, teff, millets, soybean, and peas, are available for crop rotation, proso millet stands out as a rotational crop for the dryland production system. This is because proso millet, being a C4 crop, has exceptional water-use efficiency and can survive harsh conditions like drought, high temperatures, and limited available nutrients (Habiyaremye et al. [2017](#page-28-0)). This cereal has a short-growing season (60–90) days, which allows it to avoid prolonged exposure to drought conditions. Besides, the shallow root system (90–120 cm) conserves deep soil moisture for the next crop (Das et al. [2019\)](#page-27-0). Cultivation of proso millet lowers weed, disease, and insect pressure on wheat (Habiyaremye et al. [2017\)](#page-28-0). All these attributes make proso millet an excellent choice as a rotation crop in rainfed agricultural systems under water-stress situation.

Millet is considered a nutraceutical and functional food because of its superior seed nutrients such as starch, proteins, vitamins, minerals, dietary fibers, and antioxidant activities. It also has other bioactive compounds such as resistant starch, lipids, phenolic acid, flavonoids, lignin, phytosterols, phytic acid, and tannins present in millets that have health-promoting properties (Tripathi et al. [2021\)](#page-30-3). Proso millet is gluten-free and is abundant in vitamin B, iron, calcium, potassium, zinc, and magnesium (Das et al. [2019\)](#page-27-0). Proso millet could be exploited as nutraceuticals and used in therapeutic applications for chronic diseases such as obesity, cardiovascular diseases, cancer, and diabetes (Majid and Priyadarshini [2020\)](#page-29-4). Millets are grossly neglected as human food despite being highly nutritious primarily due to a lack of awareness. The increasing number of reports on health benefits of millets in recent years generated a renewed interest in using millets for biomedical research. Proso millet grain has protective and preventive effects against old age-related diseases such as diabetes, high blood pressure, cardiovascular diseases, cancer, Parkinson's disease, and other metabolic syndromes (Kalinová [2007\)](#page-28-2).

The use of proso millet grain for human consumption predates recorded human history. This small grain was widely used for preparing traditional sweet and savory cuisines in Russia, China, and Germany thousands of years ago (Santra and Rose [2013\)](#page-29-5). Proso and other millet-based food are quite common in many countries in Asia and Africa. However, this ancient grain is largely under-utilized in developed countries in Europe and North America despite its remarkable nutritional and healthpromoting properties (Das et al. [2019\)](#page-27-0). Proso millet grains are primarily used as birdseed and animal feed in the USA and Europe (Santra et al. [2019\)](#page-30-0). Nevertheless, these grains are primarily used for human consumption in several countries including China, Korea, Japan, India, and Russia. Many traditional cuisines and commercial food products are prepared from whole millet grains. Proso millet grains are used in porridge, rice-based meals, noodles, bread, pasta, flour, pancakes, and alcoholic beverages (Santra et al. [2019](#page-30-0); Das et al. [2019\)](#page-27-0). Proso millet grains can be used for ethanol production like corn (Rose and Santra [2013\)](#page-29-6).

The term "omics" is commonly used to refer to a broad field of science and engineering focusing on the interactions among biological information objects pertaining to various "omes" (<https://omicstutorials.com/home/>). It involves collective quantification and characterization of collections of biological molecules that define the structural and functional attributes of an organism. The primary focuses of omics are on (1) mapping information objects such as genes, proteins, and ligands, (2) finding interaction relationships among the objects, (3) engineering the networks and objects to understand and manipulate the regulatory mechanisms, and (4) integrating various "omes" and "omics" subfields. The five major types of "omics" are (1) genomics, which deals with the analysis of the DNA sequence; (2) transcriptomics, which deals with the analysis of transcribed RNA; (3) proteomics, which focuses on proteins present in a sample; (4) metabolomics, which involves identification and quantification of all metabolites in a sample; and (5) miRNAomics, which studies regulatory mechanisms underlying control of transcription of genes. Here, we introduced a new term called "nutraceutomics" to describe the comprehensive study associated with all phytochemicals present in seeds of food crops (proso millet in this chapter) and their effects on human health and nutrition.

The goal of this chapter is to provide a comprehensive review of available literature for (1) proso millet seed composition and their impacts on human health, (2) variabilities of the seed compositions within proso millet germplasm available across the globe, and (3) genetic improvement for changing proso millet seed compositions through breeding (conventional and modern) and biotechnologies.

## 2 Proso Millet Seed Nutraceuticals

A nutraceutical is defined as any substance that is a food or part of a food and provides health benefits, including the prevention and treatment of disease. The term nutraceutical is the hybrid of "nutrition" and "pharmaceutical" and was coined by Stephen Defelice in 1989 (Kalra [2003](#page-28-3)). Nutraceuticals can be of two types: (1) macronutrients such as carbohydrates, proteins, lipids, and fibers (Table [1](#page-5-0)) and microel-ements such as minerals (Table [2](#page-6-0)) and vitamins (Table [3\)](#page-7-0) and  $(2)$  secondary metabolites such as polyphenols, flavonoids, etc. These nutraceuticals in proso millet are discussed below.

## 2.1 Starch

Starch, a polysaccharide, is the major portion (97.1%) of the total saccharides  $(64.5 \text{ g}/100 \text{ g})$  in proso millet (Kalinová [2007\)](#page-28-2). Like in any other cereal, there are

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Note: The data was adapted from Tripathi et al. ([2021](#page-30-3))

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<b>Vitamins</b> (mg)	Thiamine (B1)	Riboflavin (B2)	Niacin (B3)	Pyridoxin (B <sub>6</sub> )	Pantothenic acid (B5)	<b>Biotin</b> (B7)
Proso millet	0.41	0.22	1.55	0.52	$\equiv$	$\overline{\phantom{0}}$
Little millet	0.26	0.05	1.29	0.04	0.60	6.03
Pearl millet	0.25	0.20	0.86	0.27	0.50	0.64
Finger millet						
Foxtail millet	0.59	0.11	3.20		0.82	-
Kodo millet	0.29	0.20	1.49	0.07	1.49	
Barnyard millet	0.33	0.10	4.20	$\equiv$	-	-

<span id="page-7-0"></span>Table 3 Vitamin composition per 100 g of proso millet and other millets

Note: The data was adapted from Rao et al. ([2017\)](#page-29-9)

two types of starch in proso millet, namely, amylopectin and amylose. Amylose is the straight-chain polymer of glucose, whereas amylopectin is the branched-chain polymer of glucose units. In proso millet, the amylose content varies from 17.21% to 32.6% (dry basis), and amylopectin varies from 67.40% to 82.79%. The amylose content in proso millet starch is a little higher than maize  $(17–27%)$  and marginally lower than rice (28%). Native starch of proso millet has the highest digestibility (50%) in comparison to other millets (Kumari and Thayumanavan [1998\)](#page-29-8), and the starch digestibility is similar to that of maize (43%). In general, grain starch has very low solubility in water. The proso millet starch is approximately 6.89% soluble at 90 °C. Moreover, millet starch exhibit a higher water-binding capacity than wheat starch and has a higher tendency to break down (~50 Brabender units - BU). Proso and foxtail millets show lower set back values (about 330 BU)compared to other millets (Kumari and Thayumanavan [1998\)](#page-29-8).

The dietary patterns of many people concerned about healthy eating habit are changing across the world. Proso millet is gradually gaining attention owing to its impressive nutrient profile and gluten-free property. The eating quality and cooking parameters of proso millet grains are attributable to the starch properties. The starch granules in proso millet vary greatly in size and shape. The size of the granules range between 0.3 and 17 μm and can be round or polygonal in shape. Proso millet varieties are categorized as waxy  $\left(\sim 1\%$  amylose) and non-waxy  $\left(\sim 25\%$  amylose) types. Another important reason for consuming the proso millet is its high resistant starch content, which causes slow starch digestion, particularly in non-waxy varieties. Because of these reasons, the non-waxy starch varieties of proso-millet are widely used in food processing. The variation in amylose content and structural integrity contribute to the pasting and thermal behavior of proso millet starch. The starch of proso millet showed some promising functional properties that make it a suitable alternative to commercially available starch for food and non-food

applications. There are several reports on the use of proso millet seeds in the preparation of different food products like gluten-free bread, porridge, pasta, ready-to-eat breakfast cereals, infant foods, and distilleries (Das et al. [2019\)](#page-27-0). It can be concluded that proso millet is an alternative source of starch considering its quality characteristics (Bangar et al. [2021\)](#page-27-3).

#### 2.2 Protein

The seed protein content of proso millet is comparable to maize and wheat. Proso millet seeds contain higher amount of protein than any other millets (Geervani and Eggum [1989\)](#page-28-4). The protein content depends on the variety, environmental conditions, soil nutrients, and weather conditions during grain formation. The average seed protein in proso millet ranges from 11.5% to 13.0% with a maximum of about 17% (Kalinova and Moudry [2006](#page-28-5)). Varieties with a red seed coat have the lowest quantity and quality of protein (Essential Amino Acid Index, or EAAI) than light-colored grains. Dehulled grains have a little bit higher protein content (12.3–16.3%) due to the removal of the seed coat (hull) that is poor in proteins (Jones et al. [1970;](#page-28-6) Ravindran [1992](#page-29-10)). The protein quality (EAAI) of proso millet grain (51–67%) is higher than that in maize.

Proteins are complex biomolecules as they may sometimes comprise several subunits with various physicochemical and functional properties. On the basis of solubility, plant storage proteins are classified as albumin (water-soluble), globulin (saline-soluble), prolamin (alcohol-soluble), and glutelin (alkaline-soluble). Prolamin (31–50%) is the major storage protein in proso millet like in most cereals (Jones et al. [1970](#page-28-6); Dendy [1995\)](#page-27-4). Glutinous (waxy) proso millet contains a higher proportion of albumins and globulins  $(18-31\%)$  than non-glutinous types  $(13-16\%)$  (Parameswaran and Thayumanavan [1995\)](#page-29-11). Similar to other cereals, proso millet grain protein has inadequate amount of content (3.68%). However, proso millet protein is rich of some essential amino acids (leucine, isoleucine, methionine) compared to wheat protein. Millet protein is believed to have beneficial influence on cholesterol metabolism. Proso millet is well-suited for patients on a gluten-free diet as its grains contain the specific prolamin fraction under the permitted level (Kalinova and Moudry [2006\)](#page-28-5).

The proximate analysis of seed storage proteins is essential for understanding the basic physical and functional properties of proso millet cultivars to form the foundation for developing value-added products. Nine US proso millet varieties were characterized for proximate analysis by Singh et al. ([2018\)](#page-30-4). They observed a wide range of values for the physical properties, such as sphericity (0.86–0.91), volume 3.94 to 5.14 mm<sup>3</sup>, bulk density (765.49–809.67 kg m<sup>-3</sup>), porosity (42.49–44.20%), and angle of repose  $(22.98-25.74^{\circ})$ . The varieties were also evaluated for their pasting and gelatinization properties. A high correlation was observed between amylose content and onset temperature  $(r = -0.94)$ , peak gelatinization temperature  $(r = -0.92)$ , peak viscosity  $(r = 0.84)$ , final viscosity  $(r = 0.91)$ , and setback viscosity ( $r = 0.90$ ) (Singh et al. [2018\)](#page-30-4).

The knowledge of the protein structure-function relationship is necessary to understand the nutritional properties of seed storage proteins. The physicochemical, functional, and structural properties of the storage protein fraction from two defatted proso millet cultivars, viz., Dawn and Plateau, were determined by Akharume et al. [\(2020](#page-27-5)). The protein recovery efficiency for the two varieties were determined to be 53.5% (Dawn) and 60.1% (Plateau). The average denaturation temperature of all fractions was  $82.1 \pm 3.5$  °C. Surface hydrophobicity values of Dawn were 11,781, 10,594, 316, and 2225 for albumin, globulin, and glutelin, respectively, and 3415, 2865, 353, and 456 of Plateau fractions, respectively. Most of the protein fractions exhibited the highest solubility at pH 9 and lowest solubilities at pH  $\leq$  7. The solubility varied from 5.7% to 100%. Emulsifying activity index (EAI) of less than 0.25  $\text{m}^2/\text{g}$  was estimated for most fractions, while the highest emulsion stability index (ESI) was about 60 min. Prolamin fraction showed three major peptide bands of 11, 14, and 24 kDa, while glutelin fraction revealed only a major band of 15 kDa and several minor bands of 11, 22, 24, 78, and 209 kDa. No differences in the electrophoresis pattern were observed for the fraction with or without a reducing agent (Akharume et al. [2020](#page-27-5)).

Digestibility of seed proteins of proso millet and other millets is reduced significantly after cooking due to conformational changes. Panicin, zein-like, the major seed storage protein fraction in proso millet, produced hydrophobic aggregates upon heating that are extremely resistant to protease digestion (Gulati et al. [2017](#page-28-7)). Using in vitro digestion as a measure of digestibility, aggregation reduces digestibility from about  $80\%$  to  $\langle 40\% \rangle$ . The recalcitrant hydrophobic protein aggregates that form as a result of heating are resistant to both aspartic proteases (pepsin) and serine proteases (chymotrypsin/trypsin). To estimate variation in "digestibility" as a trait, in vitro digestibility across 33 accessions of proso millet from different countries was measured and observed significant variation, ranging from 26% to 57% digestibility after heating (Gulati et al. [2018](#page-28-8)). Thus, there appears to be ample trait variation for selective breeding.

To further understand the nature of this digestibility trait, liquid chromatographymass spectrometry (LC-MS)/MS analysis was done on the lines with high and low protein digestibility and identified three peptide sequences from the panicin fraction that were correlated with low digestibility and two that were associated with high digestibility (Gulati et al.  $2018$ ). Three peptide sequences of Gulati et al.  $(2018)$  were used to query annotated genes Panicum miliaceum genome (Zou et al. [2019](#page-30-2)). Seven different genes were identified belonging to the alpha family of zein proteins, the major seed storage proteins of maize. BLAST alignments identified a total of 14 members of the zein-alpha family in proso millet based on alignments showing >35% identity to the query. Phylogenetic analysis (Fig. [2a\)](#page-10-0) further divided these zein-like genes into five subfamilies that are related to the PMS-1, P22.1/22A-1, and ZA1/M1 members of the 19 KDa and 22KDa zein alpha family and two members of the 10KDa prolamin-like protein family. The arrangement of the 14 zein-like proteins and the prolamin proteins on the proso millet genome (Fig. [2b](#page-10-0)) revealed an architecture suggesting that two pairs of highly related zein-like genes have arisen through chromosome duplications (Chr3-Chr4 and Chr9-Chr10), while a combination of five highly related 22 KDa zein-like genes on Chr17-Chr18 appears to have arisen from a

<span id="page-10-0"></span>

Fig. 2 Panicin (zein-like), prolamin gene family in proso millet (*Panicum miliaceum*). (a) Genes identified using three peptide sequences of prolamin fraction (Gulati et al. [2017\)](#page-28-7) in BLAST alignment of proso millet genome sequence (Zou et al. [2019](#page-30-2)). Fourteen zein-line genes are divided into five sub-families. Chromosome number is indicated on top of each gene (unpublished). (b) The proso millet genome sequence assembly reported by Zou et al. [\(2019](#page-30-2)). This image, licensed under a Creative Commons Attribution 4.0 International License [\(http://creativecommons.org/licenses/by/](http://creativecommons.org/licenses/by/4.0/) [4.0/\)](http://creativecommons.org/licenses/by/4.0/), was used with minor modifications.

combination of ancestral gene duplications within the progenitor of the Chr17/Chr18 chromosomes, followed by duplication of the ancestral chromosome. The four remaining genes across Chr2, Chr8, Chr14, and Chr18 form distinct families that are more distantly related. Structurally, the amino acid composition of predicted proteins from each of these zein-like subfamilies shares features common to zein proteins, including enrichment in polar amino acids, and 9–10 different stretches of repeated sequence containing poly-glutamine (QQQ) separated on average by 11 residues. Structural analysis of the maize zeins has shown the repeated sequences form alpha helices with the polar amino acids (including glutamine residues) interacting with residues on adjacent anti-parallel helices to form a bundle of multiple alpha helices in a compact structure (Argos et al. [1982;](#page-27-6) Matsushima et al. [1997](#page-29-12)).

#### 2.3 Lipids

Dehulled grains of proso millet contain 3.5% to 6.7% of lipid (Jones et al. [1970;](#page-28-6) Ravindran [1992](#page-29-10); Kalinová [2007\)](#page-28-2). Among cereals, only oats have a higher (7.14%) lipid than that in proso millet. The germ contains about 25% of the total lipids. Proso millet gains contain 62.2% of free, 27.8% of bound, and 10% of structural lipids. Unsaturated fatty acids make up 85–89% of proso millet lipids of which 42% are polyunsaturated acids (Kalinová [2007](#page-28-2)). Polyunsaturated lipids (particularly linoleic acid) play an essential role in cholesterol metabolism. The major fatty acids of proso

millet are linolenic (38.4–66.68%), oleic (21.4–22.7%), and palmitic (6.61–11.3%) acids. The physicochemical characteristics of proso millet lipids (consistence, setting point, acid number) are similar to the lipid content of sunflower, maize, and soya (Kalinová [2007](#page-28-2)).

## 2.4 Fiber

Cereal grains serve as the most significant source of dietary fiber for the human diet. The fiber content in the human diet is critical for the prevention and treatment of high blood pressure and high cholesterol. The fiber content in dehulled grains of proso millet is like that of oat  $(0.8-1.2\%)$ . The composition of cell wall in proso millet grains is similar to that of tissues of other grass species. The cell wall comprises xyloglucan, arabinoxylan, uronic acid, arabi-nosyl, galactosyl residues, arabinogalactan, and β-D-glucans (Kalinová [2007\)](#page-28-2). The β-D-glucans (glucose units linked to a long polymer chain) play an important role in human nutrition by decreasing total blood cholesterol. The β-glucans content in proso millet (0.5–1.0%) is at the same level of lentils  $(0.4–1.1\%)$ , maize  $(0.5–1.3\%)$ , rice  $(0.4–0.9\%)$ , spelt  $(0.6-1.2\%)$ , or wheat  $(0.5-1.0\%)$  (Demirbas [2005\)](#page-27-7).

#### 2.5 Minerals

The majority of proso millet seed mineral is present in its pericarp, aleurone layer, and germ. The mineral content varies from 1.5% to 4.2% (Ravindran [1992](#page-29-10); Kalinová [2007\)](#page-28-2), which is higher than that in wheat grain (1.5–2.0%). The majority of minerals in proso millet are slightly higher or similar to those of other cereals (Table [2\)](#page-6-0). The common food processing and dehulling reduces the mineral content to around 27–53% (Kalinová [2007](#page-28-2)). This reduction commensurate with the dehulling intensity. Proso millet is deficient in calcium, but the grain contains a high amount of phosphorus. However, the bondage of phosphorus with phytates considerably interferes with its bioavailability. Proso millet is abundant in potassium, iron, and manganese (19.5–20.6 mg/100 g) (Ravindran [1992\)](#page-29-10). Its grain is almost devoid  $(0.01 \text{ g}/100 \text{ g})$  of sodium. Proso millet is an excellent source of zinc, copper, and boron as well (11.6 mg/kg) (Kalinová [2007](#page-28-2)).

## 2.6 Vitamins

The dehulled grain of proso millet is rich in vitamin B1, thiamine  $(0.42-0.80 \text{ mg}/100 \text{ g})$ ; B2, riboflavin (0.22–0.40 mg/100 g); B3, niacin (1.55–3.7 mg/100 g); B6, pyridoxin  $(0.52-0.80 \text{ mg}/100 \text{ g})$ ; and E, tocopherol  $(0.1-2.60 \text{ mg}/100 \text{ g})$  (Table [3](#page-7-0)). The levels of vitamins B1 and B2 are twice that of rice, wheat, or barley. Most of the vitamins are deposited in the germ and aleurone layer and therefore, decortication considerably decreases their content. The color of dehulled grains is correlated to carotene and xanthophyll content. The carotene content is relatively stable and does not vary due to

growing conditions such as soil type, level of fertilization, and interannual weather changes (Kalinová [2007](#page-28-2)). The unrefined fat extract of proso millet grain contains 8.3 to 10.5 mg of vitamin A and 87 to 96 mg of vitamin E per 100 g (Tripathi et al. [2021](#page-30-3)).

# 2.7 Antinutritional Factors

Knowledge of antinutritional factors such as tannins, phytates, oxalates, and enzyme inhibitors is essential to predict the nutritional value of products. Phytates affect the bioavailability of certain minerals, particularly multivalent cations including P, Ca, Mg Fe, and Zn, by binding with them. Phytic acid forms a complex with most of the free P  $(-67.3\%)$  in the millets (Ravindran [1992](#page-29-10)). The phytic acid content in proso millet varies from 0.17 to 0.61 g/100 g, which is higher than that in polished rice but lower than that in wheat. Dehulling reduces the phytate content by 17–24% and thus makes more P bioavailable (Lorenz [1983](#page-29-13)).

# 3 Secondary Metabolites in Proso Millet

Like other millets and cereals, proso millet grain contains many secondary metabolites, which reportedly have beneficial effects on human health. The following section summarizes the secondary metabolites in proso millet.

# 3.1 Phenolic Compounds

Polyphenols are the major group of phytochemicals in plants, and they have numerous health benefits. Polyphenols in cereals have an adverse influence on color, flavor, and nutritional quality. These compounds are mostly localized in the aleurone layers of the grain. The polyphenol content in plants is influenced by factors such as plant part, developmental stage, and environment. Total phenolic compounds in proso millet are about 0.05–0.10 mg per 100 g of catechin equivalents, on dry basis. The bound polyphenols (1% HCl extractable) in proso millet were (2.21  $\pm$  0.01), which was significantly lower than that in other millets such as kodo millet (81.64  $\pm$  0.15), foxtail millet (11.59  $\pm$  0.23), little millet (9.64  $\pm$  0.28), pearl millet (9.14  $\pm$  0.17), and finger millet  $(3.83 \pm 0.18)$ . Bound phenolic compounds have antioxidant, anti-obesity, antidiabetic, antimutagenic, anticarcinogenic, antimicrobial, and antiviral properties (Tripathi et al. [2021\)](#page-30-3).

# 3.2 Flavonoids

Flavonoids are a group of plant secondary metabolites with a general structure of a 15-carbon skeleton. Flavonoids such as catechin, quercetin, anthocyanin, tannin, etc. have human health-promoting properties, owing to their pharmacological activities

such as radical scavenging. There are no reports of flavonoids in proso millet. However, a few reports are there for other millets. Finger millet leaves are known to contain eight types of flavones: vitexin, isovitexin, saponarin, violanthin, orientin, iso-orientin, lucenin-1, and tricin. Pearl millet contains glucosylvitexin, glucosylorientin, and vitexin in a ratio of 29:11:4 (Kalinová [2007](#page-28-2)). Finger millet is reportedly the only millet that contains condensed tannins.

## 3.3 Carotenoids

Carotenoids are well-known for their provitamin A activity. Carotenoids prevent various diseases because they act as antioxidants. A recent report showed that the carotenoid content in edible millet flour varied from 78 to 366  $\mu$ g/100 g with an average of 366, 199, 78, 173, and 366  $\mu$ g/100 g in proso, finger, little, and foxtail millets, respectively (Asharani et al. [2010](#page-27-8)). The carotenoid contents of millets were comparable to that of wheat  $(150-200 \,\mu g/100 \,g)$  and sorghum  $(180-230 \,\mu g/100 \,g)$  but significantly lower than that in maize  $(1800-5500 \mu g/100 g)$  (Tripathi et al. [2021](#page-30-3)).

## 3.4 Phytosterols

Phytosterols, which are desmethyl sterols, are essential structural and functional components of plant cells. Phytosterol esters can potentially reduce the blood serum LDL (low-density lipoprotein) cholesterol levels down to 14% but do not affect HDL (high-density lipoprotein) levels. The risk of heart disease can be reduced by up to 40% by including proso millet in the regular diet depending on age and some other factors. Other than finger millet, there are no reports of phytosterols in proso and other millets. The sterol content of finger millet was reported to be 0.149% on a seed weight basis, whereas other millets contain only a trace amount. Phytosterol content of sorghum and corn was estimated to be 0.5 mg/g and 0.9 mg/g (Singh et al. [2003](#page-30-5)).

# 4 Proso Millet Grain for Human Health

Proso millet confer many beneficial effects to human health. Some of these effects are backed by more scientific evidence than others. Several epidemiological studies have shown that regular consumption of millets and their products can ameliorate the affect of chronic diseases such as diabetes, cardiovascular disease, cancers, and all-cause mortality (Table [4](#page-14-0)).

# 4.1 Antioxidant

Millets including proso millet are abundant in both soluble and insoluble bound polyphenols, which have high antioxidant potential with metal chelating and

Human health benefits	Nutraceutical (s)		
Treating diabetes	Low glycemic index starch		
Helps in anemia by increasing hemoglobin	High iron and zinc concentration		
Alleviates constipation	High fiber		
Anti-cancer inhibiting tumor formation	Vanillin (antioxidant)		
Bone growth, development, and repair	High phosphorus $(P)$		
Prevents stomach ulcers, preventing formation of excess acidity	Gastroprotective effect of antioxidant in millet		
Helps alleviating high blood pressure and heart stress	Polyphenols, lignin, high magnesium (Mg)		
Reduces respiratory problems in asthma patients and reduce migraine attacks	High magnesium (Mg)		
Reduces the overall consumption of food	High fiber content		
Reduces the risk of gall bladder stone and production of excessive bile juice	High fiber content		
Highly digestible and low allergic response (Reduces allergy in celiac patients)	Gluten-free starch		

<span id="page-14-0"></span>Table 4 Human health benefits and contributing nutraceuticals of proso millet

Note: The data was adapted from Malik [\(2015](#page-29-15))

reducing powers (Saleh et al. [2013](#page-29-14)). Several antioxidants present in millets neutralize free radicals (reactive oxygen species) and boost overall immunity and human health. The free radicals can lead to oxidative stress, which in turn are associated with conditions like cancer, arthritis, respiratory, and compromised immunity. Thus, consumption of millets can improve human health by scavenging free radicals from the liver and kidney.

### 4.2 Antidiabetic

Diabetes mellitus causes several body disorders, characterized by high blood sugar levels with an imbalance in protein, carbohydrate, and lipid metabolism. Consumption of whole millet grains has been clinically proven to lower diabetic effects (Saleh et al. [2013\)](#page-29-14). Rao et al. [\(2017](#page-29-9)) reported that regular consumption of millets helps prevent diabetes due to the higher level of magnesium in these small grains, which in turn enhances the efficiency of insulin and glucose receptors. Furthermore, millet-based diets have been reported for their antioxidant potential, nerve growth factor production, and wound healing properties (Rao et al. [2017](#page-29-9)).

#### 4.3 Cardiovascular Diseases

Millets are abundant in magnesium, potassium, lignans, antioxidants, and fibers, which can reduce the risk of heart strokes, high blood pressure, low-density cholesterol, and atherosclerosis. Rao et al. ([2017\)](#page-29-9) reported that the addition of barnyard, proso, and finger millets in the diet increased the blood plasma levels of adiponectin, high-density lipoprotein (HDL), and reduced triglycerides in hyperlipidemia. Therefore, millets, including proso, finger, barnyard, foxtail, and pearl millet, can significantly lower hyperlipidemia, hyperglycemia, triglycerides, and non-HDL and reduce the risk of cardiovascular diseases (Rao et al. [2017\)](#page-29-9).

# 4.4 Anticancer

Cancer is characterized by changes at the cellular level due to uncontrolled cell growth and division. Millets generally have high levels of phenolic compounds such as tannins, fibers, and other phytonutrients than other cereals. These compounds improve health status and lower the risks of colon, breast, and esophageal cancers (Saleh et al. [2013\)](#page-29-14). It is recommended that a daily ingestion of 30 g of fiber may reduce the risk of breast cancer chances by 50% (Rao et al. [2017](#page-29-9)).

#### 4.5 Antiaging

Millets, including proso millet, are nutrient-rich functional food, enriched with high levels of micronutrients, vitamins, minerals, phenolic compounds, fibers, and antioxidants. These compounds are helpful in inhibiting glycation and cross-linking of collagen which is responsible for aging (Saleh et al. [2013](#page-29-14)).

# 4.6 Gluten Sensitivity

Celiac disease and gluten sensitivity are caused by gluten in organisms that are genetically susceptible to these conditions. The disease affects 0.6–1% of the population worldwide. Other food grains are amaranth, buckwheat, quinoa, corn, and sorghum functional and nutraceutical food. Millets have a lot of potential in the production of gluten-free food and beverages targeting people suffering from gluten sensitivity and celiac disease (Saleh et al. [2013](#page-29-14)).

#### 5 Genetic Variation of Seed Components

Genetic variation is crucial for the adaptability and survivability of any species. From a breeding perspective, genetic variation ensures the selection of superior individuals (plants or animals) with improved characteristics from a population. A very limited number of studies have been conducted to assess the variation in seed composition in proso millet. Ravindran ([1992\)](#page-29-10) studied the amino acid composition and a few other traits of six proso millet varieties. He reported small differences in amino acid content among the varieties (Ravindran [1992](#page-29-10)). Kalinova and Moudry

[\(2006](#page-28-5)) assessed the crude protein and amino acid content in seven proso millet varieties. In contrast to Ravindran's findings, they observed significant varietal differences in seed content of the amino acid lysine, valine, isoleucine, phenylalanine, aspartate, glycine, tyrosine, histidine, and arginine (Kalinova and Moudry [2006\)](#page-28-5). In another study, a varietal difference in phenolic compounds and antioxidant capacity in whole millet grains was reported (Chandrasekara and Shahidi [2011\)](#page-27-9). Vetriventhan and Upadhyaya [\(2018](#page-30-6)) studied 200 proso millet accessions to assess the diversity of grain nutritional traits including seed protein, calcium (Ca), iron (Fe), and zinc (Zn). Large variations for all four grain-nutritional traits were observed in their study. More research on the genetic variation of seed components, including secondary metabolites, needs to be conducted for generating resources for genomewide association studies (GWAS) and developing varieties with improved nutrient profiles (Vetriventhan and Upadhyaya [2018\)](#page-30-6).

## 6 Breeding for Grain Quality Improvement

Plant breeding is the process of creating and selecting superior genotypes with enhanced yield, abiotic and biotic stress tolerance, and improved nutritional quality. Breeding programs dedicated to developing genetically improved varieties of proso millet were established in several countries. China, the USA, India, Russia, and Kenya are notable countries that have been instrumental in continuing efforts for the genetic improvement of proso millet (Gomashe [2017](#page-28-9)). Considerable progress has been made in generating high-yielding varieties with desirable maturity, seed color, plant height, and other yield-related morpho-agronomic traits. However, efforts to develop superior proso millet cultivars enriched with nutrients and health-promoting metabolites are very limited. With the growing demand for proso millet in the everexpanding human healthy food market, it is imperative that breeding programs focused on improving nutrient and metabolite profiles of the high-yielding varieties are established to promote this crop as a functional food. Common breeding approaches and a couple of biotechnological tools to complement conventional breeding in accelerating variety development efforts are discussed further down.

#### 6.1 Conventional and Wide Hybridization

The majority of proso millet varieties of North America were developed through conventional breeding methods (crossing followed by selection of progenies) using a limited pool of parental lines through conventional hybridization. The resulting narrow genetic base may lead to diminished performance of the varieties in terms of resistance to abiotic and biotic stresses over time. Besides, the variation of seed quality traits is not very large, which makes genetic improvement of seed composition through conventional breeding approaches even tougher. Nevertheless, the conventional method was still useful in developing specialty proso millet varieties

for human food uses. One such example was 'Plateau', the first and only waxy proso millet variety in North America (Santra et al. [2015](#page-30-7)). The variety was developed via artificial pollination between PI 436626 (Lung Shu 18), a Chinese waxy accession, and 'Huntsman', a high-yielding US variety. Similar market-driven strategies can be adopted to develop new high-yielding cultivars enriched with essential nutrients and healthy metabolites to market them as nutraceuticals.

The gene pool of wild relatives of proso millet can be a large repository of novel traits or genes that can be transferred via introgression into the existing cultivars (Santra et al. [2019](#page-30-0)). Wide hybridization is a promising prospect for improving grain nutritional quality by introducing genes from the wild relatives such as P. sumatrense and *P. repens* to improve the metabolic profile of the cultivars.

#### 6.2 Mutation Breeding

Mutation breeding involves deliberate induction of mutation by artificial mutagenesis and breeding for genetic variations that do not exist in the gene pool. Mutationinducing agents (mutagens) can be physical, ionizing (X-rays and  $\gamma$ -rays), and non-ionizing radiations (ultraviolet rays) or chemical agents such as ethylmethane sulfonate (EMS), methyl methane sulfonate (MMS), diethylsulfate (DES), and nitrosoguanidine (NS). EMS is the most widely used chemical mutagen due to its effectiveness and ease of use. Proso millet seeds treated with 0.2% EMS was found to improve panicle filling, grain shattering tolerance, and grain yield in the M2 progeny (Singode et al. [2018\)](#page-30-8). Recently, Francis et al. [\(2022](#page-27-10)) used different doses of gamma radiation to develop phenotypic mutations for various traits, including plant height, panicle shape, compactness, seed color, and lodging resistance. They were able to isolate eight high-yielding mutant families with significantly improved grain yield (GY) and fodder yield (FY) (Francis et al. [2022](#page-27-10)). More research on artificial mutagenesis is absolutely required in proso millet. Mutation breeding is a viable technique to overcome poor combining ability and narrow genetic based for improving grain nutrient and metabolite profile (Santra et al. [2019](#page-30-0)).

## 6.3 Doubled Haploids and Transgenics

Doubled haploid (DH) and transgenic technologies are two commonly used tissue culture-based biotechnology tools for the genetic improvement of crops. The DH technology produces 100% homozygous genotypes using haploid gametes (pollen or egg). Transgenic technology uses genetic engineering to insert one or two specific genes from other plants. Conventional plant breeding via pure-line selection normally takes 11–13 years to develop a new variety as it usually involves 5–6 generations of inbreeding to generate homogeneous breeding lines with >98% homozygosity before multi-year yield assessment at multiple sites. The desirable 100% homozygosity can be achieved in a much shorter time by implementing doubled haploid technology (Khound et al. [2013](#page-28-10); Santra et al. [2019\)](#page-30-0). Only a few

reports on successful tissue regeneration have been reported in proso millet. In 1982, Heyser and Nobors reported successful callus induction and shoot regeneration from a variety of explants by manipulating auxin levels in Linsmaier and Skoog (L and S) medium (Heyser and Nabors [1982\)](#page-28-11). Bobkov and Suvorova [\(2012\)](#page-27-11) studied the efficiency of anther culture technique in proso millet for embryogenic callus induction and regeneration. Heat  $(32 \text{ °C})$  and cold  $(4 \text{ °C})$  were observed to successfully induce callus formation and regeneration of the explants (Bobkov and Suvorova [2012\)](#page-27-11). For several decades, genetic engineering has been used to introduce foreign genes expressing novel traits into a host genome or to knock out genes with deleterious effects. Genetic improvement of crops through genetic engineering relies on the development of an efficient regeneration method and a robust transformation system (Kumar et al. [2016](#page-28-12)). There has been no report on the generation of transgenic proso millet via genetic transformation so far. The DH and genetic engineering technologies can be used for developing proso millet varieties enriched with health-promoting bioactive compounds and no or minimum antinutrients. Therefore, more studies on efficient tissue culture and transformation systems are warranted for facilitating genetic engineering-assisted genetic improvement of proso millet.

# 7 Omics for Improving Grain Nutritional Quality

Biology works as a "system" rather than as an individual part separately. All the parts of biology work together in harmony to manifest overall biological functions. Many biochemical compounds are involved in this intrinsic process. Similarly, all the nutrients and antinutrients in food work together in harmony to manifest their effect on human health and nutrition. Therefore, it is very important to study proso millet seed nutrients quality and quantity, genes, biosynthesis pathways, regulation, and interactions together rather than separately. That means all aspects of proso millet seed nutraceuticals must be studied following the "omics" approach. The term "neutrocetomics" is used to indicate the combined study of nutraceuticals and omics. Proso millet being a minor crop, its "omics" areas of research are not as rich as other major crops such as corn, wheat, rice, and soybean. However, in recent years a lot of omics research has been done in proso millet, and more is being conducted due to its increasing importance for human health. Details of proso millet "omics" research were published in a recent comprehensive review paper (Khound and Santra [2020](#page-28-13)). The following section summarizes various fields of "omics" in proso millet and their relevance to its "nutraceutomics" (Fig. [3\)](#page-19-0).

# 7.1 Genomics

Genomics is the branch of omics that tackles large-scale studies on the structural and functional aspects of the genome to understand the genetic and molecular underpinning of various biological processes. Initial genomic studies were primarily focused on genome size and physical as well as genetic mapping of organisms. Next-

<span id="page-19-0"></span>

Fig. 3 Schematic representation of the applications of traditional breeding methods and tools, as well as omics-based and post-genomic breeding strategies to the genetic improvement of proso millet

generation sequencing (NGS) marked a new era of genomics by enabling researchers to sequence, assemble, and analyze the genomes of important crops at lower costs and in a shorter time (Khound and Santra [2020](#page-28-13)).

#### 7.1.1 Molecular Markers

Molecular markers are important genomic resources that have been widely used in genetic mapping, genetic diversity, and taxonomic and population genetic studies of crops. A limited number of molecular markers were developed in proso millet as this crop is grossly under-researched. The molecular markers identified in proso millet so far include amplified fragment length polymorphism (AFLP), random amplified polymorphic DNA (RAPD), inter-simple sequence repeat (ISSR), cleaved amplified polymorphic DNA (CAP), simple sequence repeat (SSR), and single nucleotide polymorphism (SNP) markers. These molecular markers were primarily used for evaluating the genetic diversity of the proso millet germplasm (Santra et al. [2019\)](#page-30-0).

SSRs are preferable for genetic studies as they are abundant, evenly distributed, multi-allelic, codominant, highly polymorphic, easy to score, and highly reproducible (Khound and Santra [2020](#page-28-13)). The earliest SSR-based genetic studies were conducted using SSRs from other species such as rice, wheat, oat, barley, and switchgrass. The first proso millet-specific SSRs were identified by Cho and coworkers (Cho et al. [2010](#page-27-12)). Twenty-five polymorphic SSRs were developed from the genomic DNA of 50 diverse proso millet genotypes. These SSRs were used to evaluate the genetic diversity of Chinese proso millet accessions (Liu et al. [2016\)](#page-29-16).

SNP markers are ideal for genetic studies, genetic map constriction, and genomic selection as they occur abundantly in the genome (Khound and Santra [2020\)](#page-28-13). These markers are especially well suited for constructing linkage maps as they are costeffective, high-throughput, and more efficient compared to other DNA markers (Rajput et al. [2016\)](#page-29-2). Several reports on SNP identification in proso millet have been published. Rajput et al. identified 833 high-quality biallelic genotype-bysequencing (GBS)-SNPs from genotyping of 93 recombinant inbred lines (RILs). These GBS-SNPs were used for constructing the first proso millet linkage map (details later in the quantitative trait locus (QTL) mapping section) (Rajput et al. [2016\)](#page-29-2). Wang and her coworkers evaluated the allelic diversity of two waxy genes, viz., Wx-L and Wx-S, in 132 proso millet accessions from 12 provinces of China. In their study, Wang et al.  $(2018)$  $(2018)$  identified six SNPs at the *Wx-L* locus after sequencing the PCR amplicons of all the accessions. Johnson and his team used GBS to generate 1882 filtered SNPs to conduct genome-wide population genetic studies in proso millet. The SNP markers were found to accurately represent genetic variation within the population (Johnson et al. [2019\)](#page-28-14). In 2021, Boukail et al. ([2021](#page-27-13)) developed 2412 SNPs from 88 proso millet accessions with RAD-seq. The identified SNPs were used for conducting GWAS to detect marker-trait associations for several agronomic and seed morphology traits (more details are covered in Sect. [8](#page-24-0)) (Boukail et al. [2021](#page-27-13)). In another recently published report, 126,822 filtered SNPs were identified using specific-locus amplified fragment sequencing (SLAF-seq) of 106 accessions (Li et al. [2021\)](#page-29-17). More recently, Khound et al. ([2022\)](#page-28-15) developed 972,863 highquality biallelic SNPs from low-pass genome sequencing of 85diverse proso millet genotypes of the USDA gene bank. They employed those SNPs to study the population structure and phylogenetic relationships among the genotypes (Khound et al. [2022](#page-28-15)).

#### 7.1.2 QTL Mapping

Quantitative trait locus (QTL) mapping is routinely used in many crops for detecting quantitative trait loci (QTLs) associated with key traits due to the abundance of versatile DNA markers and statistical models and methods. QTLs for a wide array of traits have been reported in many major and minor crops including wheat, rice, maize, sorghum, millet, amaranth, quinoa, oat, and rye (Yabe and Iwata [2020](#page-30-10)). Among millets, pearl millet and foxtail millet have the major share of published reports on QTL mapping. In proso millet, very little research has been done on genetic mapping of QTLs compared to major crops such as rice, wheat, maize, soybean, and sorghum. This is possibly because of the minor crop status and inadequate resources available to proso millet geneticists. The first-ever genetic linkage map of proso millet was published in 2016 by Rajput et al. They used 833 GBS-SNPs and 93 RILs. Several QTLs and linked SNP markers for a few morpho-agronomic traits were identified (Rajput et al. [2016](#page-29-2)). However, no QTLs for proso millet seed components such as starch, protein, minerals, vitamins, and other bioactive compounds have been identified in proso millet to date.

#### 7.1.3 Whole-Genome Assembly

Developing a whole-genome assembly (WGA) is a crucial step in genome-wide molecular studies as this creates opportunities for exploring complex molecular structures and functions in an organism. Information on genome assembly is an invaluable resource for genomic-assisted breeding for crop improvement. Proso millet was the fourth millet to have a published whole-genome assembly after foxtail millet, pearl millet, and finger millet (Khound and Santra [2020](#page-28-13)). In 2019, Zou et al. developed the complete proso millet genome sequence using various NGS tools. They also identified 55,930 protein-coding and 339 microRNA genes (Zou et al. [2019\)](#page-30-2). In the same year, Shi et al. reported a near-complete assembly of the proso millet genome. The authors generated 18 super scaffolds covering approximately 96% of the estimated genome. Moreover, they were able to annotate 63,671 proteincoding genes in the proso millet genome (Shi et al. [2019](#page-30-11)).

#### 7.1.4 TILLING

Another modern approach that could be applied for improving grain nutritional quality of proso millet is the TILLING (targeted induced local lesions in genomes) method. This is an advanced method of detecting beneficial mutations or alleles that allows rapid identification of induced gene mutations within a mutagenized population via heteroduplex analysis. The initial step of TILLING involves creating a mutagenized population, which is subsequently assessed for detecting useful gene mutations that could be linked to important phenotypes. The mutations within the mutagenized population are usually detected by one of the three methods, viz., LI-COR method (uses CEL 1 enzyme), high-resolution melting (HRM) method, and NGS method. TILLING has been used for detecting useful mutations in a wide array of crops including wheat, rice, sorghum, and maize (Irshad et al. [2020\)](#page-28-16). Tilling has been successfully employed to identify mutations in genes associated with starch synthesis, plant architecture, and disease resistance in several crop species. Another related method, namely, EcoTILLING, is used to detect naturally occurring polymorphisms within a population. The polymorphisms identified could be used to study the phylogenetic diversity within the population. This technique can also be used to detect novel allelic variations that can be exploited for genetic improvement. EcoTILLING has been utilized in different crops including Arabidopsis, chickpea (seed weight), wheat (disease susceptibility), rice (drought tolerance, starch synthesis), and soybean (seed protein) (Irshad et al. [2020\)](#page-28-16).

#### 7.1.5 Allele Mining

A large number of beneficial alleles are present in plant genetic resources, which remain unutilized as they were abandoned during evolution and domestication. Introgression of these natural genetic variations has the potential to improve the performance of available cultivars. The recent surge of genomic data accelerated the discovery and annotation of novel genes and loci linked to essential agronomic traits in many crop species. The idea of identifying alleles in the annotated genes led to the concept of allele mining in plants. Allele mining refers to the approach of dissecting naturally occurring variations at candidate genes or loci associated with major agronomic traits with the help of modern genomic tools (Kumar et al. [2010](#page-28-17)). Two primary approaches for identifying alleles are EcoTILLING and sequence-based allele mining. As discussed in the previous section, EcoTILLING is used to identify naturally occurring allelic variants present in the primary and secondary gene pools. In a sequence-based approach, alleles of diverse genotypes are amplified by PCR and subsequently sequenced. Allele mining was used in identifying alleles for important seed quality traits including  $Amy32b$ ( $\alpha$ -amylase gene) and  $Gpc-B1$  (gene for grain protein content) in barley,  $wx$  locus (waxy gene) in rice, and  $Wx-A1$  (waxy gene) in wheat (Kumar et al. [2010](#page-28-17)). The prospect of using allele mining for detecting novel alleles of genes is relatively unexplored in millets. The availability of wholegenome assemblies, high-quality molecular markers, and the gradually reducing cost of sequencing is expected to result in more studies for identifying novel genes and loci. That would encourage more efforts for the mining of candidate genes for some key agronomic and grain quality traits leading to the detection of useful alleles for application in molecular breeding.

## 7.2 Transcriptomics

A handful of reports on transcriptome studies investigating biological processes have been published in proso millet. Yue et al. ([2016\)](#page-30-12) used Illumina sequence reads from two proso millet accessions, viz., Yumi No.2 and Yumi No.3, to assemble a proso genome transcriptome. From the 113,643 unigenes assembled, 62,543 contigs were assigned to 315 gene ontology (GO) categories. Additionally, 15,514 unigenes could be mapped into 202 Kyoto Encyclopedia of Genes and Genomes (KEGG) clusters, and 51,020 unigenes were mapped to 25 clusters of orthologous groups (COG) categories. The most represented KEGG pathways included metabolic pathways (25.65%), biosynthesis of secondary metabolites (10.71%), and biosynthesis of amino acids (3.57%) (Yue et al. [2016](#page-30-12)). In 2017, Hou et al. developed a transcriptome assembly using Illumina sequence reads from a single genotype of proso millet named Neimenggu-Y1. They were able to identify 25,341 unigenes out of which 5170 (20.4%) could be mapped to 146 KEGG pathways. GO annotation with 2936 tissue-specific genes resulted in three subcategories- biological processes, molecular functions, and cellular components (Hou et al. [2017](#page-28-18)). Zhang et al. [\(2019](#page-30-13)) published a comparative analysis of transcriptome associated with drought tolerance in two genotypes, viz., Neimi 5 and Jinshu 6. Drought stress resulted in 833 and 2166 DEGs in Jinshu 6 and Neimi 5, respectively. Some of the DEGs could be mapped to some key KEGG pathways including carbon metabolism, phenylpropanoid biosynthesis, and amino acid biosynthesis (Zhang et al. [2019\)](#page-30-13). The unigenes that were mapped to the key KEGG pathways in the above reports should be explored further to identify their roles in those pathways. This information could be useful in targeting specific genes for enriching proso millet with useful nutraceuticals or inhibiting the biosynthesis of antinutrients.

#### 7.3 Proteomics

There is an abundance of reports on proteomics research for the major crops including rice, corn, soybean, wheat, and potato. However, like other omics disciplines, the number of published reports pertaining to proteomics in proso millet and other millet is very meager (Khound and Santra [2020](#page-28-13)). Perhaps the first proteomics analysis in proso millet was done on a 2500-year-old starch food in China. Comparative proteomics analysis between the ancient sour dough bread and a few other reference cereals identified proso millet and barley as the ingredients of the ancient bread (Shevchenko et al. [2014\)](#page-30-14). In 2017, Roy and co-workers reported the seed protein analysis of four Korean proso millet varieties using two-dimensional (2-D) electrophoresis and mass fingerprinting to map the seed proteins and determine their functional properties. They detected 1152 differentially expressed proteins, out of which 26 reproducible proteins were further analyzed using matrix-assisted laser desorption/ionization time-of-flight/time-offlight mass spectrometry (MALDI-TOF-TOF/MS). Two of the 26 proteins were found to be upregulated in all the cultivars, while 13 were upregulated and 11 were downregulated in 2 proso millet cultivars. The authors opined that the differential expression of the proteins in the four proso millet cultivars was possibly variety-specific (Roy et al. [2017\)](#page-29-18).

#### 7.4 Metabolomics

There are only a couple of available reports on the metabolomics of proso millet. The first published study on proso millet metabolomics used gas chromatography-time-of-flight mass spectrometry (GC-TOFMS) to evaluate gain quality. Kim et al. [\(2013\)](#page-28-19) studied the primary metabolites and phenolic acids of the matured grains of three Korean proso millet varieties, viz., 'Joongback', 'Joongjuk', and 'Hwangguem'. They were able to identify 48 metabolites from the grains, which included 43 primary metabolites and 5 phenolic acids. The mature grains of the variety 'Joongjuk' contained significantly higher levels of phenolic acids than the other two varieties. This makes this variety a suitable candidate for further evaluations and genetic improvement as a nutraceutical (Kim et al. [2013](#page-28-19)).

In a relatively recent publication, 172 metabolites and 3 cooking quality traits were compared between conventionally and organically grown seeds of two proso millet varieties. There was no difference in the metabolite profiles between the conventionally and organically grown gains, except in the levels of some carbohydrates such as glucose and fructose, which were higher in the organically grown grain. The variations observed in the metabolite content could be primarily attributed to the variety (Liang et al. [2018a](#page-29-19)). These findings emphasize the importance of variety selection for developing proso millet varieties for nutraceutical use.

#### 7.5 Phenomics

A phenome can be described as the complete set of phenotypic traits expressed by a cell, tissue, or organism, and the field of studies on the phenome is known as phenomics. Establishing the relationship between the genotypes and phenotypes is a major breeding objective of any crop improvement program. Traditional phenotyping approaches are usually laborious, time-consuming, expensive, and mostly destructive (Santra et al. [2019](#page-30-0)). It is important to determine more phenotype-to-genotype relationships to develop reliable predictive models for predicting a full array of phenotypes of a genotype (Gustin and Settles [2015\)](#page-28-20). In recent years, high-throughput phenotyping techniques and tools including high-resolution imaging, spectroscopy, robotics, and powerful algorithms have been developed to push plant phenotyping to the next level. Different high-throughput phenotyping approaches have been used to study a variety of phenotypic traits such as plant growth, biomass, leaf morphology, maturity, and nutrient status (Santra et al. [2019](#page-30-0)). To the best of our knowledge, the first-ever report on highthroughput phenotyping in proso millet was reported by Zhao et al. who used UAV-based imaging for heading percentage detection in proso millet (Zhao et al. [2022\)](#page-30-15).

A more niche area of phenomics, for example, "seed phenomics," could be developed in proso millet to specifically study various seed characteristics (Gustin and Settles [2015](#page-28-20)). This will require the integration of various imaging technologies, spectroscopy, and multiple omics such as genomics, transcriptomics, proteomics, and metabolomics. Various imaging techniques and rapid, nondestructive spectroscopic techniques, such as near-infrared (NIR) spectroscopy and nuclear magnetic resonance (NMR) spectroscopy, are routinely used to determine various seed traits such as shape, size, color, and chemical composition. To the best of our knowledge, there is no report or ongoing research on proso millet seed phenome, which is very important for genetic improvement of nutraceuticals values in proso millet.

## <span id="page-24-0"></span>8 Post-Genomic Approaches for Improving Seed Nutritional Quality

The following sections summarize the current status of proso millet "omics" resources available to the scientists working in the field of proso millet nutraceutomics. The following sections address post-genomic omics approaches for genetic manipulation of proso millet seed nutraceuticals.

## 8.1 Genome-Wide Association Studies (GWAS)

Genome-wide association study (GWAS) or association mapping (AM) involves the detection of an association between DNA marker(s) and a trait of interest based on the principle of linkage disequilibrium (LD). This is achieved through large-scale genotyping of germplasm panels or breeding populations exhibiting contrasting phenotypes across different environments. Several GWAS have been conducted in millets to uncover the marker-trait association for some important traits. However, only a few reports of GWAS for seed nutritional traits are available. The only available report on GWAS in proso millet to date was published in 2021 by Boukail et al. They used a global collection of 88 varieties and landraces to identify marker trait associations (MTAs) for seed morphological traits. They identified 2412 high-quality SNPs using restriction site-associated DNA sequencing (RAD-seq). These SNPs were used for GWAS for seed traits, such as seed length (SL), seed width (SW), seed perimeter (SP), and seed color (RGB) as well as agronomical traits. They identified MTAs for the seed and agronomic traits (Boukail et al. [2021](#page-27-13)). The SNPs that were found to have a strong association with the agronomic and seed traits could be strong candidates for marker-assisted selection (MAS) in proso millet breeding programs. Having said that, no report on GWAS for nutraceutical traits is available in proso millet yet. This warrants the initiation of genome-scale studies to identify MTAs for some key seed quality traits to accelerate the development of proso millet varieties with impeccable agronomic qualities and healthy seed components.

## 8.2 Genomic Selection (GS)

Genomic selection (GS) is the breeding approach of using genome-wide highdensity markers to facilitate rapid selection of suitable candidates for breeding (Srivastava et al. [2020\)](#page-30-16). GS is still in the nascent stage in millets as very few GS studies have been conducted so far due to the limited availability of genomic resources. Varshney et al. [\(2017](#page-30-17)) utilized whole-genome resequencing (WGRS) data for performing GS to predict the grain yield of pearl millet under four different stress scenarios across environments. They used to analyze the grain yield of 64 hybrids with 302,110 SNPs to identify promising hybrid combinations for hybrid production (Varshney et al. [2017](#page-30-17)). In another study, Liang and his coauthors [\(2018b](#page-29-20)) evaluated four genomic selection schemes using two genotyping strategies, namely, RAD-seq and tunable genotyping by sequencing (tGBS) in pearl millet. The authors observed that for traits with significant mid-parent heterosis, the inbred phenotypic data moderately improved genomic predication of the hybrid genomic estimated breeding values when the trait values of the inbred and hybrid lines were scored relative to the mean trait values of the corresponding populations (Liang et al. [2018b\)](#page-29-20). Similar GS studies can be conducted in proso millet for major morphoagronomic and seed quality traits to accelerate genetic improvement of breeding populations in a time-efficient and cost-effective manner.

## 8.3 Genome Editing

Genome editing is a relatively newer technique adopted by plant breeders to develop new and improved varieties of crops. Rather than introducing transgene(s) randomly into the host genome, genome editing used sequence-specific nucleases (SSNs) to induce targeted and precise nucleotide sequence changes to the genome (Santra et al. [2019\)](#page-30-0). Genome editing tools have been successfully used to introduce genes into major cereals including rice, wheat, and maize (Ceasar [2022\)](#page-27-14). The most commonly used genome editing tools are clustered regularly interspersed short palindromic repeats-CRISPR-associated nucleases (CRISPR-Cas) system, transcription activator-like effector nucleases (TALENs), and zinc-finger nucleases (ZFNs) (Santra et al. [2019](#page-30-0); Ceasar [2022](#page-27-14)).

There are numerous reports on genome editing in major cereals, especially rice, wheat, maize, and barley. However, genome editing is still a relatively unexplored territory in millets. One example of the successful use of genome editing tools in improving grain quality is the knock-out of three key genes associated with phytic acid (PA) biosynthesis in maize. PA naturally occurs in the grains of many cereal crops, including proso millet. It is considered an antinutrient as it is largely indigestible and may cause environmental pollution. TALEN and CRISPR-Cas9 systems were used to induce mutations in the genes, viz., ZmIPK, ZmIPK1A, and ZmMRP4, encoding enzymes that catalyze three steps in PA biosynthesis (Liang et al.  $2014$ ). There are only two reports on successful CRISPR-Cas9-mediated genome modification in foxtail millet (Ceasar [2022](#page-27-14)). Similar strategies can be implemented in proso millet for improving grain quality by reducing the levels of antinutrients and enriching with health-promoting compounds such as carotenoids. However, reliable, reproducible, and robust micropropagation and transformation systems need to be developed for this crop in order to accomplish this.

# 9 Conclusion and Future Prospects

Compared to the major crops such as rice, wheat, corn, and soybean, there is a dearth of genomic resources available for the genetic improvement of proso millet. Especially, little to no progress has been made in exploring genes or QTLs linked to grain nutraceutical traits. Therefore, there is a need for devising strategies for developing and harnessing genomic resources in the identification of genes and QTLs associated with seed components in proso millet. This will facilitate omics-assisted breeding of this ancient crop thereby enabling rapid and precise genetic improvement for various agronomic and seed quality traits. Therefore, the global millet researchers must work together to take advantage of such technological advancement in the "omics" research to advance the field of "nutraceutomics" in proso millet. Interdisciplinary research, extension, and promotion are essential for using proso millet in the human food market.

The future prospects of proso millet along with other climate-resilient millets are vast for the food and nutritional security of the global population in the current century and future. The global climate is deteriorating exponentially with the acute pressure of population increase and farmland reduction. All seven millets have great potential to address the mammoth global challenge. A strong collaboration among the millet geneticists and breeders across the globe will be mandatory for the successful implementation of the "omics" in proso millet "nutraceutomics" research and applications for human health and nutritional security in the changing climate, especially in the climate-fragile countries in the world.

Conflict of Interest The authors declare that they have no conflict of interest.

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