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# 3 Phenotypic divergence between the cultivated apple (*Malus domestica*) and its primary wild 4 progenitor (*Malus sieversii*)

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11 ABSTRACT

12 An understanding of the relationship between the cultivated apple (*Malus domestica*) and its primary wild progenitor species (M. sieversii) not only provides an understanding of how 13 14 apples have been improved in the past, but may be useful for apple improvement in the future. 15 We measured 10 phenotypes in over 1000 unique apple accessions belonging to M. domestica 16 and *M. sieversii* from Canada's Apple Biodiversity Collection. Using principal components 17 analysis (PCA), we determined that *M. domestica* and *M. sieversii* differ significantly in phenotypic space and are nearly completely distinguishable as two separate groups. We found 18 19 that *M. domestica* had a shorter juvenile phase than *M. sieversii* and that cultivated trees 20 produced flowers and ripe fruit later than their wild progenitors. Cultivated apples were also 3.6 21 times heavier, 43% less acidic, and had 68% less phenolic content than wild apples. Using 22 historical records, we found that apple breeding over the past 200 years has resulted in a trend 23 towards apples that have higher soluble solids, are less bitter, and soften less during storage. Our

results quantify the significant changes in phenotype that have taken place since apple

25 domestication, and provide evidence that apple breeding has led to continued phenotypic

26 divergence of the cultivated apple from its wild progenitor species.

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#### 28 INTRODUCTION

The domesticated apple (Malus domestica) belongs to the genus Malus, which consists of 29 30 30-55 interfertile species that grow primarily in temperate climates. Archaeological evidence suggests that apples have been cultivated for at least 3,000 years [1] and that they have had 31 32 immense cultural, religious, culinary and economic importance for centuries [2–4]. Genomic 33 evidence suggests that as apples were transported west into Europe along the Silk Road from 34 Central Asia, hybridization and introgression from multiple *Malus* species created the modern 35 cultivated apple (*M. domestica*) [2,5]. While there has been introgression from multiple species, including Malus sylvestris and Malus baccata, to the M. domestica genome, Malus sieversii of 36 37 Kazakhstan is widely recognized as the primary ancestor of the cultivated apple [5-7]. 38 Today, the cultivated apple is the 3rd most produced fruit crop in the world [8]. Accordingly, apple fruit quality and phenology traits have been a major focus for breeding 39 40 programs around the world [9-11], and both wild and domesticated germplasm are routinely 41 evaluated for their potential use by apple breeders [12,13]. Traits such as precocity, harvest date 42 and flowering date have practical implications for apple producers, as these traits influence 43 investment timelines, crop quality and fruit damage risk. Weight, firmness, sugar content, acidity and phenolic content are important considerations for processors and consumers, who have 44 specific preferences for these quality attributes when choosing to purchase apples [14]. Many of 45

these fruit quality traits have been targets for improvement in breeding programs around theworld, and current genetic mapping efforts remain focused on these phenotypes [15–17].

Cost-effective trait improvement in apples is critical since the investment costs of 48 49 growing apple trees are high. Apple trees are large plants with a long juvenile phase: new trees often only start bearing fruit 5 years into the life cycle, requiring growers to invest heavily before 50 51 generating revenue. Thus, producers typically grow only thoroughly evaluated and historically 52 successful apple varieties. As a result, a small number of well-established varieties dominate the 53 cultivated population. For example, in 2019 over 50% of all commercially produced apples in the US consisted of only 4 apple cultivars [18]. The global population of apples is dominated by a 54 55 small number of elite varieties, despite an immense source of genetic and phenotypic diversity available for apple improvement [19]. Decreased diversity in apples, and agricultural crops more 56 broadly, has resulted in an increased interest in the use of crop wild relatives (CWRs) for 57 agricultural improvement. CWRs offer genetic and phenotypic diversity that can be leveraged in 58 59 the breeding of novel cultivars with desirable traits such as disease resistance or flesh colour 60 [20]. By 1997 the world economy had gained approximately \$115 billion in benefits from the use 61 of CWRs as sources of resistance to environmental change and disease [21]. An understanding of how fruit quality and phenology vary within the cultivated apple's wild relatives is essential to 62 63 future apple improvement.

Phenotyping large and diverse populations of plants is labour intensive and frequently
results in a "phenotyping bottleneck" [22], leaving crop researchers without powerful fruit
quality data for analysis. Recently, comprehensive phenotyping of Canada's Apple Biodiversity
Collection (ABC) generated measurements for fruit phenotypes in a collection of more than 1000
wild and cultivated apple accessions [23]. In the present work, we explored ten phenotypes from

the ABC and determined the degree to which the cultivated apple differed from its primary wild
progenitor, *M. sieversii*, and how cultivated apples have changed over the past 200 years of

71 breeding and improvement.

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73 MATERIALS AND METHODS

74

75 Phenotype data

The phenotype data analysed here were collected from Canada's Apple Biodiversity 76 77 Collection (ABC) and were part of previously published work [23]. Briefly, the ABC is an apple 78 germplasm collection located at the Agriculture and Agri-Food Canada (AAFC) Kentville 79 Research Station in Nova Scotia, Canada (45.071767, -64.480466). The ABC contains 1119 80 unique accessions of apples planted in duplicate on M.9 rootstock in an incomplete randomized block design. The apple accessions in the ABC consist of accessions from the United States 81 Department of Agriculture (USDA) Plant Genetic Resources Unit apple germplasm collection in 82 83 Geneva, NY, USA; commercial cultivars from the Nova Scotia Fruit Growers' Association 84 Cultivar Evaluation Trial; and diverse breeding material from AAFC Kentville. The orchard 85 consists largely of *M. domestica* accessions, but also contains 78 *M. sieversii* accessions. 86 Phenotype data from the ABC were collected in 2016 and 2017 [23]. Here we focus on 10 phenotypes most relevant for assessing how apples have changed during domestication, 87 88 breeding and improvement. Precocity was measured as a score of 1-4, indicating year of bloom; 1 (2014), 2 (2015), 3 (2016) and score 4 indicated that the tree had not yet bloomed as of 2016. 89 90 Flowering date was measured in 2016 as the date in Julian days when the youngest wood 91 displayed >80% of flowers at king bloom stage. Since it often took more than one day to harvest

92	the entire orchard, harvest date was recorded in Julian days as the Monday of the week of
93	harvest. Firmness was measured as the average firmness in kg/cm <sup>2</sup> at harvest of five apples
94	measured using a penetrometer. Weight was measured as the average weight in grams of five
95	apples at harvest. Acidity was measured as the malic acid content in mg/mL of combined juice
96	from five apples measured using titration. Soluble solids were measured as °Brix of the juice of
97	five apples using a refractometer. Phenolic content was measured as $\mu$ mol GAE/g of fresh
98	weight. Percent acidity change was measured by subtracting the acidity at harvest from the
99	acidity after 90 days storage and then dividing by the acidity at harvest. Percent firmness change
100	was measured by subtracting the firmness at harvest from the firmness after 90 days storage and
101	then dividing by the firmness at harvest. Sample sizes for each phenotype are listed in Table 1.
102	

- 103 Table 1. Sample sizes by phenotype.

Phenotype	M. domestica	M. sieversii
Precocity	797	76
Flowering Date	768	74
Harvest Date	647	59
Firmness	644	59
Weight	644	58
Acidity	626	56
Soluble Solids	644	56
Phenolic Content	399	9
% Change in acidity during storage	449	19
% Change in firmness during storage	409	27

## 108 Data analysis

109	Principal components analysis (PCA) was conducted using a scaled and centered matrix
110	of the 10 phenotypes listed in Table 1 using the prcomp() function in R 4.0.2 [24]. A Wilcoxon
111	signed-rank test was used to determine whether the phenotypes and PC values differed
112	significantly between wild and cultivated apples.
113	A Pearson correlation was used to assess relationships between phenotypes and the
114	release year of cultivated apples. Where appropriate, the significance threshold was Bonferroni-
115	corrected to account for 10 comparisons. Data visualization was performed using the ggplot2 R
116	package [25].
117	
118	RESULTS
119	
120	PCA of the 10 phenotypes revealed modest overlap between cultivated and wild apples in
121	phenotypic space (Fig. 1A, 1B). Wild and cultivated apples were significantly different along
122	PC1 (W = 53893, p = 3.56 x 10 <sup>-26</sup> ), PC2 (W = 13066, p = 2.07 x 10 <sup>-17</sup> ) and PC3 (W = 39203, p
123	= 0.0002; Fig. 1C).
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126 Fig 1. PCA of ten phenotypes in wild (N = 79) and cultivated apples (N = 801). A) PC1 vs

PC2. B) PC1 vs PC3. The proportion of the variance explained by each PC is shown in

128 parentheses on each axis. C) The difference between wild and cultivated apples for PCs 1, 2 and

- 129 3 are shown as violin plots. P values from a Wilcoxon test comparing PC values between
- 130 cultivated and wild apples are shown for each of the first three PCs.

131

- 132 To visualize and assess the difference between cultivated and wild apples for each individual
- 133 phenotype, we produced density plots to visualize each species' distribution for each phenotype
- 134 and tested whether phenotypes differed between the two species (Fig. 2).



### 136 Fig 2. Overlapping density plots of 10 phenotypes comparing values from wild and

137 cultivated apples. The phenotype associated with each plot is shown along the X axis. The W

138 and Bonferroni-corrected p values report the results of performing a Wilcoxon rank sum test of

the difference between the phenotypic distributions of wild and cultivated apples.

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141	Wild and	cultivated	apples	differed	signific	antly for	6 of the 1	0 phenotype	es tested, including
					- 0 -			· · · · · · · · · · · · · · · · · · ·	

142 precocity (W = 23838, p = 0.021), flowering date (W = 48984, p =  $7.52 \times 10^{-24}$ ), harvest date (W

143 = 30482, p =  $2.99x10^{-13}$ ), weight (W = 36255, p =  $1.44x10^{-31}$ ), acidity (W = 8480, p =  $5.1x10^{-9}$ ),

and phenolic content (W = 352,  $p = 5.59 \times 10^{-5}$ ). We found that, on average, cultivated apples

145 produce flowers for the first time 21% (0.38 years) earlier than wild apples. Within a growing

season, cultivated apples flower 3 days later, and are harvested 15 days later than wild apples.

147 Cultivated apples are also 3.6 times heavier, 43% less acidic, and 68% lower in phenolic content

148 than their wild progenitors. In comparison, wild and cultivated apples did not differ significantly

149 for firmness, soluble solids, or changes in acidity or firmness during storage.



151	Fig 3. Phenotype values of cultivated apples as a function of their release year with a
152	comparison to values in their wild ancestor, <i>M. sieversii</i> . Phenotypes include phenolic
153	content (A), firmness change during storage (B), flowering date (C), and soluble solids (D).
154	Values for cultivated apples are blue, and the values observed for <i>M. sieversii</i> are represented in
155	yellow as a violin plot on the left side of each plot. The R and p values from a Pearson
156	correlation between phenotypic values and release year are shown within each scatter plot.
157	
158	To visualize phenotypic change within cultivated apples over time, apples' phenotypes are
159	displayed as a function of their release year (Fig. 3 & Supplementary Fig. 1). We found
160	significant correlations with release year for phenolic content ( $R = -0.364$ , $p = 2.34 \times 10^{-6}$ ), change
161	in firmness during storage (R = $0.222$ , p = $0.00265$ ), flowering date (R = $-0.172$ , p = $0.00247$ ),
162	and soluble solids ( $R = 0.123$ , $p = 0.0469$ ) and determined that cultivated apples have shifted
163	closer to the mean of wild apples for flowering date and firmness change, but further from the
164	mean of wild apples for phenolic content and soluble solids.
165	
166	DISCUSSION
167	
168	Apples have been cultivated for over 3000 years, but because vegetative propagation has
169	been practiced for 2000 years, it has been suggested that only about 100 generations have
170	elapsed since apple domestication [26]. Despite this relatively short window for apple
171	improvement, we found that cultivated apples are nearly entirely phenotypically distinct from
172	their primary wild progenitor, M. sieversii (Fig. 1). Phenotypic differences are frequently used as
173	an approximate measure of relatedness, and the separation in principal component space

174 observed here is in agreement with genomic studies that have shown significant differentiation 175 between the genomes of *M. domestica* and *M. sieversii* [5,19]. It is worth acknowledging that we 176 observed some overlap between wild and cultivated apples in phenotypic space. The PCA 177 performed here made use of only 10 phenotypes, and it is possible that more differentiation 178 would be observed with more measures of the apple phenome. Further, each variable in PCA 179 should ideally capture an independent biological feature of apples. However, some phenotypes 180 analysed here are correlated, such as harvest date and firmness [23], and their variation may be 181 driven by the same biological feature [27]. Therefore, interpreting our PCA as a quantification of 182 the degree of phenotypic differentiation between cultivated and wild apples should take these 183 caveats into consideration.

We found significant differences between wild and cultivated apples for several phenology traits including precocity, flowering date, and harvest date (Fig. 2). Cultivated apple trees flower and bear fruit at a younger age. Due to the long juvenile phase of apple trees, plants with the ability to bear fruit earlier in their life cycle are desirable for growers because revenue is generated earlier. It is therefore possible that precocity has been selected for during apple improvement.

Flowering date was 17% (3 days) later in cultivated apples than wild apples. Frost during blossoming can cause loss, damage or reduced marketability of fruits [28], making flowering time an important consideration for growers when planting orchards. Additionally, apples with later flowering dates tend to be firmer [23,29], and firmer apples are preferred by consumers [30]. The later flowering date in cultivated apples could therefore be a by-product of selection for firm apples. Similarly, selection for firm apples may explain why cultivated apples were harvested 15 days later than wild apples, since harvest date and firmness are strongly correlated 197 [23,29]. It is well established that harvest date is a reliable predictor of fruit firmness, and these
198 two phenotypes may be regulated by a common molecular pathway [27]. Thus, preference for
199 firm fruit could be directly impacting the selection for apples with later harvest dates.

200 We found significant differences between cultivated and wild apples across multiple fruit 201 traits including weight, acidity, and phenolic content (Fig. 2). Cultivated apples are 3.6x heavier 202 than wild apples, in agreement with previous comparisons between these two species [31]. 203 Consumers prefer large, visually appealing fruit [32,33], so selection for large fruit size may 204 explain our observation. We also found that cultivated apples are 43% less acidic than wild 205 counterparts. Acidity contributes to the sour taste of apples, and apple preference is heavily 206 influenced by acid/sugar ratios [34]. Given this relationship, it is not surprising that cultivated 207 apples, which are primarily consumed as fresh fruit [35], have lower acid than wild apples but do not differ in soluble solid content. Finally, cultivated apples have, on average, 68% less phenolic 208 209 content than wild apples. Phenolic compounds, which offer nutritional benefits [36], are partially 210 responsible for the enzymatic browning that occurs when apple flesh is exposed to oxygen [37]. 211 Browned flesh is visually unappealing and typically results in negative effects on flavour, 212 making apples that resist browning more appealing to producers and consumers [37]. In fact, the 213 only genetically modified apple variety on the market today, Arctic<sup>TM</sup> Apples, was designed to 214 silence genes related to enzymatic browning and was advertised as "the original nonbrowning 215 apple" [38]. The human aversion to apple browning has likely contributed to the decline in 216 phenolic content in cultivated apples, despite the nutritional benefits of such compounds. In 217 addition, some evidence suggests that fruit size impacts polyphenol accumulation in apples [39], 218 which could help explain why we observe lower phenolic content in cultivated apples.

219 According to the present analysis, many phenotypes of cultivated apples have 220 dramatically changed since divergence from the primary progenitor species, M. sieversii. These 221 differences represent phenotypic separation that could be leveraged in the improvement of 222 cultivated apples, and emphasizes the potentially functional diversity provided by CWRs. While 223 wild apples from this investigation may not offer improved fruit quality phenotypes that are 224 currently attractive to consumers, they hold phenotypic variation that could be important for 225 apple improvement in the future. For example, breeders could exploit the high phenolic content 226 of wild apples to improve the nutritional quality of cultivated apples. Further, traits from wild 227 apple varieties could potentially benefit the cider industry, which values high acidity and 228 phenolic content [40].

229 Analysis of cultivated apple phenotypes as a function of release year revealed changes over the past 200 years in phenolic content, change in firmness during storage, flowering date, 230 231 and soluble solids (Fig. 3). In particular, as shown previously [23], phenolic content has 232 decreased over time. Phenolic content is associated with bitter taste [41], and modern varieties 233 therefore likely taste less bitter on average than older varieties. Although selection for decreased 234 bitterness could explain our observation, the relationship between low phenolic content and 235 decreased flesh browning could also explain why modern cultivated apples tend to have less 236 phenolics [42]. In comparison, wild apples tend to have higher phenolic content, indicating that 237 cultivated varieties are diverging from the ancestral state. Similarly, more recently released apple 238 cultivars soften less during storage than older cultivars, diverging from the ancestral state. The 239 extended storage and long-distance shipment of apples has become increasingly routine over the 240 past several decades, and selection for reduced softening during storage may explain why 241 firmness retention has improved over time. Storage and transport have also been key targets in

tomato breeding [43], and the demand for fruit that performs well during extended storage andtransport is unlikely to subside.

244 Flowering date is an important trait for apple production, and varies widely across the 245 genus Malus [13]. Later flowering apple trees are less likely to be impacted by frost damage [28] 246 and more likely to be firm [23], which is preferred by consumers. Despite the understood 247 benefits of growing apples with later flowering dates, we found that more recently released 248 varieties had earlier flowering dates. The trend towards earlier flowering varieties could indicate 249 that selection for other traits has indirectly impacted flowering date. Alternatively, growers could 250 be preferring earlier flowering varieties in an attempt to manage fruit ripening times during the 251 harvest season. Cultivated varieties are trending towards the ancestral state of earlier flowering 252 dates, which suggests that wild apples could offer valuable genetic material for breeding earlier 253 harvested varieties.

Finally, we found that more modern cultivated apples are only slightly higher in soluble 254 255 solid content. Previous investigations have reported that firm apples tend to have higher sugar 256 content [10,29,44], so our observation that modern apple varieties tend to have higher SSC may 257 be at least partially be driven by recent selection for increased firmness. Further, a number of studies have suggested that the sugar content of apples is a key factor affecting consumer 258 259 preference [14,30]. Although SSC is only a modest predictor of perceived sweetness [45], 260 consumer's preference for sweet apples could underlie the upward trend in soluble solid content 261 seen in modern cultivated apples.

Several caveats of the present analysis are worth noting. First, we only considered one of the multiple progenitor species of *M. domestica* here [6]. Therefore, only a fraction of the ancestry of the cultivated apple is captured by *M. sieversii*, and a more inclusive pool of ancestral

265	species would yield a more comprehensive comparison of wild and cultivated apples. Second, it
266	is unknown how representative the current sample of wild apples is of the broader M. sieversii
267	population. It is possible that the wild apple varieties within the ABC represent only an
268	unrepresentative subset of <i>M. sieversii</i> , and thus do not accurately capture the diversity of the
269	species. Further, there has been evidence of gene flow between cultivated and wild apples [46],
270	which could mean that the wild species from the current investigation have experienced gene
271	introgression from cultivated trees, and thus do not accurately represent the wild progenitor.
272	Finally, the relatively small sample size in several comparisons limited the power of some of our
273	analyses (Supplementary Fig. 2).
274	Our work demonstrates that cultivated and wild apples have diverged phenotypically, and
275	that hundreds of years of apple improvement have shaped the variation in fruit and phenology we
276	observe among cultivated apples today. Wild apples offer potentially valuable pools of genetic
277	material that may be helpful for apple improvement. Future comprehensive phenomic
278	evaluations, including metabolomic and transcriptomic analyses, across diverse wild apple
279	species will help further assess the degree to which the apple's wild relatives may contribute to
280	improving apple cultivar development.
281	

## 282 SUPPLEMENTARY FIGURES



284	Supplementary Figure 1. Phenotypes of cultivated apples as a function of their release year
285	with a comparison to the ancestral state. Phenotypes include acidity change during storage,
286	acidity, precocity, harvest date, firmness, and weight. Cultivated apple scores for each
287	phenotype are shown in blue, and the ancestral state of each phenotype is represented in yellow
288	as a density distribution of values from <i>M. sieversii</i> . The R and p values from a Pearson
289	correlation between phenotypic values and release year are shown within each scatter plot.
290	
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299	
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301	
302	Data availability: All data presented are freely available to the public via Watts et al. [23].
303	Statistical analyses are on GitHub at https://github.com/MylesLab/Wild_vs_cultivated.
304	
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