Combining vitamin C and carotenoid biomarkers better predicts fruit and vegetable intake <u>than</u> <u>individual biomarkers</u> in a dietary intervention stud<u>yies</u>

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Abbreviations used: FV- fruit and vegetables

2 Abstract

3	Purpose: The aim of this study was to determine whether combining potential biomarkers of fruit and
4	vegetables is better at predicting FV intake within FV intervention studies than single biomarkers.
5	Design: Data from a tightly controlled randomised FV intervention study (BIOFAV; all food provided
6	and two meals/d on weekdays consumed under supervision) were used. A total of 30 participants
7	were randomised to either 2, 5 or 8 portions FV/d for four weeks, and blood samples were collected at
8	baseline and four weeks for plasma vitamin C and serum carotenoid analysis. The combined
9	biomarker approach was also tested in three further FV intervention studies <u>conducted by the same</u>
10	research team, with less strict dietary control (FV provided and no supervised meals).
11	Results: The combined model containing all carotenoids and vitamin C was a better fit than either the
12	vitamin C only (P< 0.001) model or the lutein only (P= 0.006) model in the BIOFAV study. The C-
13	statistic was slightly lower in the lutein only model (0.85) and in the model based upon factor analysis
14	(0.88), and much lower in the vitamin C model (0.68) compared with the full model (0.95) . Results for
15	the other studies were similar, although the differences between the models were less marked.
16	Conclusions: Although there was some variation between studies, which may relate to the level of
17	dietary control or participant characteristics, a combined biomarker approach to assess overall FV
18	consumption may more accurately predict FV intake within intervention studies than the use of a
19	single biomarker. The generalisability of these findings to other populations and study designs
20	remains to be tested.

Keywords: fruit; vegetables; dietary intake; biomarkers; methodology

22 Introduction

23 Increased intake of fruit and vegetables (FV) has consistently been associated with reduced chronic 24 disease risk in observational studies [1], which have been subjected to meta-analysis [2,3]. Such 25 observational evidence has been supplemented by recent randomised controlled trials testing the effect 26 of increased FV intake on clinically relevant endpoints [4-8]. 27 28 In both epidemiological research and interventional studies, the accurate measurement of FV 29 consumption is crucial. Traditional self-reported questionnaire-based approaches to the measurement 30 of FV consumption, for example, food frequency questionnaires, 24 hour dietary recalls or food 31 diaries, have well-reported inaccuracies [9-11]. Given such constraints, alternative, objective measures 32 of dietary intake of FV would be valuable. Nutritional biomarkers in biological samples, such as blood 33 and urine, may offer an objective indicator of FV intake [9]. The use of biomarkers would allow a 34 more accurate assessment of the association between FV intake and disease risk, allow population FV 35 intakes to be confirmed, as well as facilitating the measurement of compliance within FV intervention 36 studies [12]. 37 38 In order for a biomarker to be an accurate and valid indicator of FV intake, there are a number of

requirements that must be satisfied. Biomarkers of FV intake need to be minimally invasive to
participants, have the ability to discriminate between different FV intakes, be easy to measure,

41 reproducible, and be highly responsive to any change in FV intake [13-15].

42

Suggested possible biomarkers of FV intake include plasma vitamin C, carotenoids and flavonoids
[16-20]. In a recent systematic review [15] vitamin C and carotenoids were the two biomarkers that
were most frequently measured and consistently responsive within dietary FV interventions. Some
single biomarkers have been shown to be strong indicators of specific single FV, for example the
carotenoid lycopene is a good predictor of tomato intake [21]. However, while some of these proposed
biomarkers have been associated with a specific fruit or vegetable, or FV class, they have been less
reliably associated with overall FV consumption [17-19, 22-26]. This is likely to be due, at least in

50	part, to FV being a complex food group with variability in the bioactive compounds contained within
51	individual FV. Therefore, measuring a panel of potential biomarkers of FV intake within FV
52	intervention studies has been recommended [15]. Examining this panel in an integrated way may
53	more reliably predict overall FV consumption than a single individual biomarker or panel of individual
54	biomarkers.
55	
56	This paper examines the effect of increased FV intake on a panel of biomarkers of FV consumption
57	(vitamin C and six carotenoids), considered both singly and in combination. Using data from a strictly
58	controlled randomised FV intervention study (BIOFAV) designed for this purpose, i.e. with strict
59	dietary control to ensure compliance, and three further FV intervention studies, we sought to
60	determine whether a combined biomarker approach was better at predicting overall FV intake within
61	FV intervention studies than single biomarkers.
62	
63	Subjects and Methods
64	The Biomarkers of Fruit and Vegetables (BIOFAV) study was a randomised controlled FV feeding
65	study (2, 5 or 8 portions of FV per day for 4 weeks) in healthy volunteers ($n=30$). The study was
66	approved by the School of Medicine, Dentistry and Biomedical Sciences research ethics committee of
67	Queen's University Belfast and participants gave informed written consent. The study was registered
68	at clinicaltrials.gov as NCT01591057. The study duration was chosen to be long enough to allow the
69	proposed biomarkers to change in response to the alteration in FV intake, whilst the inclusion and
70	exclusion criteria ensured a broad range of ages and healthy volunteers were included, to maximise
71	generalisability of study findings. A sample size of n=10 per group was chosen for two reasons, firstly
72	because variability data from previous studies suggested that statistically significant increases in
73	blood-based FV biomarkers would be achieved with such a sample size, whilst this was also
74	achievable from a manpower perspective, given the intensity of the dietary intervention.
75	
76	Participants were recruited using university intranet emails and posters between June 2011 and May

77 2012. Inclusion criteria were: aged between 18 and 65 y; current consumption of $FV \le two$ portions/d,

78	while exclusion criteria were: body mass index $>$ 35 kg/m ² ; use of high dose vitamins, minerals or
79	dietary supplements likely to affect biomarkers of FV intake; excessive alcohol consumption (defined
80	as >28 units/week for males and >21 units/week for females); food sensitivities or allergies that would
81	interfere with the tolerance of a high FV-rich diet; current smoking; medical conditions or dietary
82	restrictions that would considerably limit the participant's ability to complete the study requirements;
83	history of diabetes; pregnant or lactating; following a weight loss diet. Participants' usual diet was
84	assessed using the 7-day diet history method.
85	
86	Participants were randomly assigned, using a block design, to one of three intervention groups, to
87	consume 2, 5 or 8 portions of FV daily for 4 weeks.
88	
89	All food, including the FV consumed during the intervention, was provided and there was supervised
90	consumption of two meals per day on weekdays. The menu plan was based around the participant's
91	portions allocation, their likes and dislikes and also their usual energy intakes. Participants were
92	therefore free to choose the FV they wished to consume, although a balance of fruit versus vegetables
93	was encouraged, and variety also promoted. A portion of FV was as recommended by Department of
94	Health (UK) guidelines, e.g. one apple, orange or banana, 3 heaped tablespoons of vegetables, or 150
95	ml fruit juice) [27].
96	
97	A fasting blood sample was collected from all participants at baseline and week 4. All bloods were
98	processed within two hours of being drawn and stored at -80°C. Weight and height were also assessed
99	at baseline and week 4, and weight was re-measured at week 2 to ensure it remained constant over the
100	course of the study, and diets were altered if weight loss or gain was observed. Demographic
101	information was collected on alcohol consumption, smoking status, levels of physical activity (MRC
102	Recent Physical Activity Questionnaire), medication use at baseline and week 4 to ensure there were
103	no changes to these behaviours over the study duration.
104	
105	Other fruit and vegetable intervention studies

106	The other FV intervention studies included in the current analysis were randomised interventions,
107	conducted in a similar way to BIOFAV, and by the same research team, except the intervention was
108	less strictly controlled, i.e. FV were provided to the participants rather than whole diet, and there was
109	no supervised consumption. The FA VRIT study randomised participants with hypertension to 1, 3 or
110	6 portions of FV/d for 8 weeks, the ADIT study randomised participants >65 y to 2 or 5 portions of
111	FV/d for 16 weeks, while the FIRST study recruited participants at increased risk of CVD and
112	randomised them to 2, 4 or 7 portions FV/d for 12 weeks. Detailed methodology and analysis of the
113	primary outcomes of these studies have been published [5,7-8], and the studies are summarised in
114	Table 1.
115	
116	Laboratory analysis
117	All biomarker analysis was conducted blinded to allocated FV group. For all studies, plasma ascorbic
118	acid concentrations were determined by fluorometric assay [28]. Serum concentrations of lutein,
119	zeaxanthin, β -cryptoxanthin, α -carotene, β -carotene and lycopene were measured by reverse phase
120	high performance liquid chromatography (HPLC) [29]. As says were standardised against appropriate
121	National Institute of Standards and Technology reference materials. These assays are also externally
122	quality assured by participation in the French Society for Vitamins and Biofactors quality assurance
123	scheme.
124	
125	Statistical Analysis
126	For baseline characteristics continuous variables are presented as mean (SD) and categorical variables
127	are presented as n (%). Between groups comparisons of baseline characteristics were made using one
128	way ANOVA tests for continuous variables and Chi-square tests for categorical variables.
129	
130	Biomarker status variables were summarised as mean (standard deviation) and changes are expressed
131	as mean (95% CI). Changes in micronutrient status were assessed using one-way ANOVA, with a test
132	for linear trend across groups if there were > two intervention groups.
133	

134	In BIOFAV, ordinal (proportion odds) logistic regression analyses were utilised to predict allocated
135	FV group (2, 5 or 8 portions of FV per day). Initially, models were fitted with single biomarkers
136	(vitamin Conly, lutein only) and then a combined biomarker model was fitted (containing all
137	carotenoids and vitamin C). Biomarker variables entered into models were based upon change
138	between week 4 and baseline and were standardised to calculate (adjusted) odds ratios (OR) per
139	standard deviation increase in each variable and 95% confidence intervals (95% CI). To avoid
140	computational problems when calculating, for the full model, an optimism corrected C-statistic
141	(described later), a separate model was created in which factor analysis (based upon the principal-
142	factor method, including 2 factors and no rotation) was first used to reduce the carotenoid variables to
143	produce two factor score variables. These two factor score variables were entered into a model along
144	with vitamin C. The combined biomarker model was formally compared to the models with vitamin C
145	and lutein model using likelihood ratio tests. The proportional odds assumption was informally
146	checked by comparing the estimates from logistic regression models comparing 2 to 5 items of FV
147	intake per day and 5 to 8 items of FV intake per day.
148	
	The ability of the models to correctly classify FV intake (i.e. 2, 5 or 8 portions of FV per day) were
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 148 149 150 151 152 153 154 155 156 157 158 	The ability of the models to correctly classify FV intake (i.e. 2, 5 or 8 portions of FV per day) were measured by creating 3 by 3 tables of predicted intake based upon the model scores against the observed intake (i.e. the actual category of intake). The cut offs for the predicted intake categories were chosen post-hoc to obtain the correct total number of predicted cases for each outcome category overall. Based upon these 3 by 3 tables, the percentage agreement of predicted and observed intake and a weighted Kappa value was calculated. The discriminative ability of each model was formally quantified using a C-statistic. C-statistics and confidence intervals were calculated using STATA add-on somersd [30]. This statistic can be interpreted as the probability that, for a pair of individuals with different FV category intake, the one

161 estimated in a bootstrap sample and the modified C-statistic was calculated in the bootstrap sample

162	and in the original sample. This process was repeated 200 times and the average difference in
163	performance in the bootstrap sample and in the original sample was calculated (the optimism) and
164	subtracted from the apparent performance to estimate the internally validated performance [31].
165	
166	These analyses were replicated in FIRST (using ordinal logistic regression models with outcome 2, 4
167	and 7 FV per day and explanatory variables based upon the difference in biomarker levels from
168	baseline to week 12) and FA VRIT (using ordinal logistic regression models with outcome 1, 3 and 6
169	FV per day and using explanatory variables based upon the difference in biomarker levels from
170	baseline to week 8). In ADIT similar analyses were conducted using logistic regression, as only two
171	FV intake categories were used (2 and 5 FV per day), with explanatory variables based upon
172	difference in biomarker from baseline to week 16.
173	
174	These analyses were conducted to predict allocated FV group, but, because of the reduced dietary
175	control in these studies (supply of FV and close contact with study team to encourage compliance), it
176	is possible that compliance with the dietary intervention in these other studies was less than in
177	BIOFAV. Linear regression analysis with self-reported FV intake as the outcome was therefore also
178	used to calculate an adjusted R^2 value for models containing change in vitamin C alone, lutein alone
179	and a combination of all carotenoids and vitamin C in FAVRIT, FIRST and ADIT.
180	
181	Statistical analyses were performed using SPSS version 19.0 for Mac (SPSS Inc, Chicago, IL) and
182	STATA version 12 (StataCorp, College Station, Texas).
183	
184	Results
185	A total of 30 participants completed the BIOFAV study. Figure 1 shows the flow of participants
186	through the study. One participant had a missing blood sample at week 4. Table 2 shows the baseline
187	study population characteristics. Also shown in table 2 are the baseline characteristics according to FV
188	intervention group (2, 5 or 8 portions FV/d). The baseline characteristics were similar in the three FV
189	intervention groups (2, 5 or 8 portions FV/d).

191 Table 3 shows baseline and change in biomarker status in the three FV intervention groups. The 192 groups were similar at baseline, but there were statistically significant between group changes in all 193 biomarkers measured at week 4, with the exception of zeaxanthin and lycopene, although a similar 194 trend was observed for zeaxanthin.

195

196 Table 4 illustrates the single and combined biomarker models used to predict allocated FV group in 197 BIOFAV participants. In the vitamin Conly model, vitamin C was associated with FV group, whilst 198 in the lutein only model, lutein was also associated with FV group. Formal tests indicated that the 199 combined model containing all carotenoids and vitamin C was a better fit than either the vitamin C 200 only (P<0.001) model or the lutein only (P=0.006) model. The combined model correctly allocated 201 86% of individuals to the correct group compared with 52% in the vitamin C only model and 66% in 202 the lutein only model. These corresponded to Kappa values of 0.85 in the combined model compared 203 with 0.31 in the vitamin C only and 0.54 in the lutein only models. The C-statistic was slightly lower 204 in the lutein only model (0.84) and in the model based upon factor analysis (0.88), and much lower in 205 the vitamin C model (0.68) compared with the full model (0.95). An optimism corrected C-statistic 206 was not calculable for the full model, however correction for optimism reduced the C-statistic for the 207 factor analysis model (0.85) but the C-statistics for the vitamin C model and lutein model were little 208 altered (0.68 and 0.84).

209

Results for the other studies are shown in **Table 5**, but the differences between the models were less marked. For instance, the optimism corrected C-statistics was slightly higher in the combined model compared with the vitamin C only model and lutein only model in FA VRIT (0.76, 0.64 and 0.65, respectively) and in ADIT (0.75, 0.72 and 0.67, respectively), but not in FIRST (0.64, 0.58 and 0.66, respectively). Similarly, adjusted r^2 values were higher in the combined model compared with the vitamin C only model and lutein only in FA VRIT (0.22, 0.03 and 0.16, respectively) and in ADIT (0.26, 0.12 and <0.01, respectively), but not in FIRST (0.11, <0.01 and 0.15, respectively).

218 When analyses were replicated to predict allocated FV group in each of the four studies based upon

- 219 the final biomarker values as opposed to the change variables, similar levels of agreement were
- 220 demonstrated (data not shown).
- 221
- 222 Discussion

223	This study suggests that a combined biomarker panel may better predict FV intake within intervention
224	studies than consideration of single biomarkers. Plasma vitamin C, and certain carotenoids and
225	flavonoids have been suggested as biomarkers of intake of overall FV [<u>16-20,</u> 23-24, 26, 32-3 <u>4</u> 3]. A
226	systematic review of FV biomarkers within FV intervention studies showed that vitamin C and
227	carotenoids are commonly used and do tend to increase [15]. However, there are two problems with
228	the assessment of these biomarkers of overall FV intake: firstly FV is a complex food group, and the
229	content of phytochemicals proposed as biomarkers will vary markedly between different classes of
230	FV, and even within different varieties of the same FV [$3435-3637$]. Storage and processing of FV
231	can also affect phytochemical content [3738]. Secondly, there are a number of factors that will affect
232	biomarker response to a given FV intake, including inter-individual variation in digestion, absorption
233	and metabolism. Some of this variation will be genetic in origin, but environmental factors such as
234	BMI [3839], smoking [3940], baseline biomarker status [4041,4142] and other aspects of diet (e.g. fat
235	content of meal in which FV are consumed [24, 4243-4546]) will affect bioavailability of the
236	phytochemicals and/or biomarker response. Nutritional biomarkers will therefore never be perfect at
237	reflecting dietary FV consumption on their own, because physiological processes in the body will also
238	impact upon response. Furthermore, there are other dietary sources of some of these compounds and
239	therefore single compounds may not reflect total overall FV consumption. In addition, the plasma
240	concentration of vitamin C has a linear relationship with vitamin C intake up until a specific point,
241	above which plasma concentrations of vitamin C plateau (>5 servings of FV) [19,4647], and therefore
242	vitamin C may be a less useful biomarker at higher levels of intake.
243	
244	Despite these limitations, efforts to improve the ability of biomarkers to predict FV intake would be

245 valuable in nutritional epidemiology. Campbell et al, [26] initially suggested combining biomarkers, and summing carotenoid status [47<u>48</u>] or flavonoid urinary excretion [48<u>49</u>-50<u>51</u>] has previously been
attempted. Such an approach, however, will take greater account of the more predominant compounds
(e.g. lycopene when summing total carotenoids), and therefore a more sophisticated approach may be
required. A recent publication has conducted a similar analysis to that performed here in a single, less
well-controlled FV intervention [54<u>52</u>].

251

252 Because of the limitations of the FV biomarkers when examining overall FV intake, we proposed that 253 a combined biomarker approach (vitamin C and six carotenoids) may be able to take into account the 254 diversity and variety of bioactive compounds found within FV and would be more likely to capture the 255 total amount of FV consumed. Hence the current analysis aimed to determine whether a model 256 including a panel of biomarkers (vitamin C and six carotenoids) was better at predicting FV intake 257 within a FV intervention study than models examining individual biomarkers. These The analyses 258 utilised a tightly controlled FV intervention study (all food was provided and two meals/d on 259 weekdays consumed under supervision; (-BIOFAV) and three previously-conducted, less tightly 260 controlled FV interventions (FA VRIT, FIRST and ADIT). The combined biomarker model performed 261 better in the more tightly controlled intervention, BIOFAV. Similar patterns of results were observed 262 for the other studies, but differences between the combined biomarker and individual biomarker 263 models were less marked, and this was particularly true for the FIRST study, where the combined 264 model was not significantly better than the lutein only model. This suggests that an integrated panel of 265 biomarkers in intervention studies may obtain a more accurate and precise measure of total FV 266 consumption, but the observed differences detected between studies do need to be explored. 267 268 It is likely that the difference detected within the current studies arose due to the less intensive and less

dietary control in the other three dietary interventions compared to BIOFAV, although efforts were made in each of these <u>other</u> interventions to maximise compliance with the allocated intervention and minimize inaccuracies in self-reporting. For example, FV was delivered to the participants in all three studies, participants were contacted weekly by telephone to monitor compliance with the intervention study, and participants were encouraged to report any lack of compliance with the intervention. It is

274	possible that there was a lack of adherence to the dietary intervention, and therefore the analysis
275	according to allocated FV group would not have been appropriate. However, the association between
276	biomarker response and self-reported FV intake (in portions/d) was also calculated and revealed
277	similar associations. It is still possible that the self-reported measures utilised to assess numbers of
278	portions of FV consumed were inaccurately reported. There may also have been between-study
279	differences in the FV self-selected by participants or in the composition of the FV consumed, which
280	could have impacted on biomarker responses. For example, the range of FV consumed within
281	BIOFAV may have been less broad than in the other studies, although this is unlikely, and similar
282	guidance regarding selection of FV (a balance of FV, encouragement to maximise variety) was given
283	in all studies. Similarly, the FV supplier was the same in all studies, and all fieldwork duration
284	periods were long enough to account for between-study seasonal differences in FV composition.
285	Another major difference between BIOFAV and other FV intervention studies was that BIOFAV
286	recruited young healthy individuals, whilst the other studies recruited either older participants or those
287	at high CVD risk. BIOFAV participants were non-smokers, and had BMIs in the normal range,
288	whereas those in the other studies included smokers, and participants were overweight. It is possible
289	that there is an age-related reduction in FV biomarker response, or that biomarker responses are
290	reduced with increasing weight $[\frac{3839}{393}]$ and in smokers $[\frac{3940}{3940}]$ and that this contributed to the
291	differences observed.
292	
293	The analyses presented here have several strengths. They are the first to examine combining FV
294	biomarkers to improve prediction of FV intake in a tightly controlled intervention, or other than simple
295	summation [4748-5051]. The BIOFAV study was strictly controlled, and we are confident that
296	participants consumed the number of FV portions they were allocated to, therefore our observation of
297	improved prediction of FV intake using a combined panel of biomarkers is novel and robust. The
298	ability to test this hypothesis in further FV interventions is also a strength. There are, however, some
299	accompanying limitations - the overall absolute performance of the model to predict intake,
300	particularly in the less controlled studies, was relatively low (e.g. an r ² of 0.26 in ADIT), indicating
301	there is substantial variability in FV intake not explained by the included biomarkers, and that what we

302	are commenting on is the relative improvement with a combined biomarker approach. A further
303	limitation is that internal validation was not possible for the combined model in BIOFAV, due to the
304	small number of observations relative to the parameters estimated, and therefore it was not possible to
305	correct for over fitting/optimism in the models. Although internal validation was performed for the
306	other models, a better estimate of the prognostic power of these models would be determined using
307	external validation. The combined biomarker approach could be extended and incorporate further
308	biomarkers (e.g. flavonoids) and account for environmental factors that could affect biomarker
309	response (e.g. BMI, smoking), while the ability of such an approach, compared with single
310	biomarkers, to predict individual intakes on a population level would require further model
311	development and testing. The utility of a combined biomarker approach to predict different patterns of
312	FV intake (e.g. predominantly fruit or vegetable) or diets containing different classes of FV (e.g. green
313	vegetables, root vegetables, pulses, fruits), or different varieties of the same FV classes could also be
314	explored. A combination of multiple measures of dietary assessment may provide more accurate
315	estimates of true dietary intake, for example combining biomarkers and self-reported measures of
316	dietary intake using regression calibration equations [5253,5354], and this could represent a natural
317	extension of combining biomarkers when measuring FV intake. The biomarkers measured here are
318	commonly used in FV intervention studies and therefore the suggested approach, if confirmed as
319	useful, would be at no extra cost.
320	
321	In conclusion, there was some evidence that a combined model including a range of FV biomarkers (a
322	carotenoid panel and vitamin C) performed better at predicting allocated FV within a strictly
323	controlled dietary intervention study than the use of a model with vitamin Conly or lutein only. A
324	similar pattern was observed in three less intensive FV interventions, although differences between
325	models were less clear cut. Therefore, a combined biomarker approach to assess overall FV
326	consumption may more accurately predict FV intake within intervention studies than the use of single
327	biomarkers. The utility of such an approach to predict population level intake of FV remains to be
328	tested.
329	

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- 348 Statement of authors' contributions to manuscript
- 349 KMA, JM, MCM, ISY and JVW designed research; AJM, LLH, CRD and CEN conducted research;
- 350 CRC and AJM analyzed data; AJM, JVW and CRC wrote the paper; JVW had primary responsibility
- for final content. All authors read and approved the final manuscript. There are no conflicts of
- 352 interest.
- 353 Conflict of interest
- 354 The authors declare that they have no conflict of interest.
- 355

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	Number of participants						
Study	completing intervention	Study Duration	Portions/d	<u>Dietary intervention</u> <u>intensity</u>	Age (y)	Health Status	Assessment visits when blood collected
BIOFAV	30	4 weeks (no wash out required as 1-2 p <u>ortions</u> /day FV consumers recruited)	2, 5 or 8	All food provided. including FV. Two meals/d consumed under supervision.	18-65	Healthy	0, 2 and 4 weeks
	80	12 weeks (+4 week run-in-period)	2.47	FV supplied weekly. Compliance encouraged by weekly telephone call.	10.77		0 and 12 weeks of intervention period
FIRS T [5]	89		2, 4 or 7	FV supplied weekly. Compliance encouraged by weekly telephone	40-77	High risk of CVD	0 and 8 weeks of
FAVRIT <u>[8]</u>	117	 8 weeks (+4 week run-in-period) 16 weeks (no wash out required as ≤ 2 portions/day FV consumers 	1, 3 or 6	<u>call.</u> <u>FV supplied weekly.</u> <u>Compliance encouraged</u> <u>by weekly telephone</u>	40-65	Hypertensive	intervention period
ADIT <u>[6,7]</u>	82	recruited)	2 or 5	<u>call.</u>	65-85	Healthy	0, 6, 12 and 16 weeks

Table 1. Summary details of the intervention studies included in the combined biomarker analysis.

Participant Characteristic	Total	2 portion group (n=11)	5 portion group (n=9)	8 portion group (n=10)
Age (years) ^a	28.5 (11.8)	25.9 (10.8)	28.2 (9.6)	31.7 (14.9)
Sex n (% female) ^b	15 (50)	6 (54.5)	4 (44.4)	5 (50)
Weight (kg) ^a	69.7 (13.7)	70.9 (17.8)	70.4 (8.6)	67.8 (13.5)
Height (m) ^a	1.70 (0.1)	1.70 (0.1)	1.7 (0.1)	1.69 (0.07)
BMI (kg/m ²) ^a	24.0 (4.1)	24.6 (5.4)	23.8 (2.7)	23.7 (3.6)
Waist (cm) ^a	81.7 (12.2)	82.0 (13.8)	83.7 (11.2)	79.6 (12.0)
Hip (cm) ^a	100.7 (6.9)	101.5 (8.9)	100.6 (5.2)	99.8 (6.3)
Systolic blood pressure (mmHg) ^a	109.6 (29.2)	109.3 (23.7)	107.1 (32.2)	112.2 (34.5)
Diastolic blood pressure (mmHg) ^a	72.7 (21.6)	74.8 (22.1)	70.6 (23.8)	72.3 (21.2)
Past smoker n (%) ^b	6 (20)	2 (18.2)	2 (22.2)	2 (20.0)
Alcohol consumers n (%) ^b	22 (73.4)	9 (81.8)	7 (77.8)	6 (60.0)
Never or occasionally	8 (26.7)	2 (18.2)	2 (22.2)	4 (40.0)
Once or twice a week	20 (66.7)	9 (81.8)	6 (66.7)	5 (50.0)
Three to five times a week	2 (6.7)	0 (0)	1 (11.1)	1 (10.0)
Full time education (years) ^a	16.1 (2.8)	15.9 (1.5)	16.2 (3.1)	16.3 (3.8)
Using medication n (%) ^b	13 (43.3)	4 (36.4)	5 (55.6)	4 (40.0)
Employment ^b				
Student	18 (60)	8 (72.7)	4 (44.4)	6 (60)
Full time employ ment	11 (36.7)	3 (27.3)	4 (44.4)	4 (40)
Unemployed	1 (3.3)	0(0)	1 (11.1)	0 (0)

Table 2. Baseline characteristics of BIOFAV participants (n=30) according to FV intervention group

^aContinuous variables presented as mean (SD). ^bCategorical variables presented as n(%).

 Table 3. Serum and plasma FV biomarker status of BIOFAV participants at baseline and

during intervention in those consuming 2, 5 or 8 portions of FV/d

		п	Baseline	Change at 4 wk
Vitamin C (µmol/l)	2 portions/d	11	58.4 (16.3)	-7.7 (-20.9,5.5)
	5 portions/d	9	61.0 (13.1)	14.0 (2.9,25.1)
	8 portions/d	9	52.6 (20.5)	11.7 (-6.7,30.0)
	<i>P</i> -value		0.45	0.04
Lutein (µmol/l)	2 portions/d	11	0.16 (0.07)	-0.01 (-0.03,0.01)
``	5 portions/d	9	0.15 (0.05)	0.03 (0.02,0.05)
	8 portions/d	9	0.16 (0.03)	0.06 (0.03,0.08)
	P-value		0.89	< 0.001
Zeaxanthin (µmol/l)	2 portions/d	11	0.04 (0.02)	0.002 (-0.003,0.006)
Zeuzantinin (µm01/1)	5 portions/d	9	0.05 (0.02)	0.006 (0.003,0.009)
	8 portions/d	9	0.05 (0.01)	0.008 (-0.002,0.018)
	<i>P</i> -value		0.69	0.11
_	2	1.1	0.10 (0.00)	0.01 (0.02 0.02)
β-cryptoxanthin	2 portions/d	11	0.10 (0.09)	-0.01 (-0.03,0.02)
(µmol/l)	5 portions/d	9	0.08 (0.04)	0.03 (0.004,0.06)
	8 portions/d	9	0.08 (0.02)	0.06 (0.01,0.11)
	1		· · /	
	P-value		0.41	0.005
α-carotene (µmol/l)	2 portions/d	11	0.14 (0.10)	0.08 (0.02,0.14)
	5 portions/d	9	0.10 (0.06)	0.13 (0.03,0.23)
	8 portions/d	9	0.13 (0.08)	0.34 (0.13,0.54)
	P-value		0.80	0.003
β-carotene (μmol/l)	2 portions/d	11	0.34 (0.25)	0.14 (0.01,0.26)
p-carotene (µmon/i)	5 portions/d	9	0.24 (0.19)	0.36 (0.05,0.67)
	8 portions/d	9	0.48 (0.44)	0.88 (0.31,1.46)
	<i>P</i> -value		0.33	0.002
- / 10	2 portions/d	11	0.51 (0.26)	0.064 (-0.032,0.159)
Lycopene (µmol/l)	5 portions/d	9	0.37 (0.28)	0.102 (-0.071,0.276
	5 portions/d 8 portions/d		. ,	0.102 (-0.071,0.276
	o portions/d	9	0.48 (0.26) 0.80	
	P-value			0.55

Values are mean (SD) with changes expressed as mean (95% CI). Change calculated as wk 4 – baseline. Both baseline variables and changes were compared between 2, 5 and 8 portions/d groups using one way analysis of variance with linear trend fitted.

		Vitamin C only model		Lutein only model		All carotenoids and vitamin C model		Factor analysis model (all Carotenoids)	
		OR (95% CI)	Р	OR (95% CI)	Р	OR (95%CI)	Р	OR (95% CI)	Р
	Vitamin C	2.45 (1.09, 5.54)	0.03			1.87 (0.51, 6.93)	0.35	1.59 (0.65, 3.87)	0.312
	Lutein			8.18 (2.19, 30.54)	0.002	30.75 (1.28, 736.55)	0.04		
Estimates ^a :	Zeaxanthin					0.23 (0.02, 2.46)	0.23		
OR (95% CI) per standard deviation increase	Lycopene					0.32 (0.09, 1.11)	0.07		
	β-cryptoxanthin					4.11 (0.49, 34.48)	0.19		
	α-carotene					1.82 (0.04, 92.06)	0.77		
	β-carotene					2.19 (0.04, 107.34)	0.69		
	First factor (footnote) ^b							12.71 (2.88, 56.04)	0.001
	Second Factor (footnote) ^c							2.28 (0.73, 7.14)	0.157
	P value compared with full model ^d	< 0.001		0.006		Reference		< 0.001	
Model Performanc e	Percentage agreement e	52 % (15/29)		66 % (19/29)		86 % (25/29)		75 % (22/29)	
	Weighted Kappa	0.31		0.54		0.85		0.69	
	C-statistic	0.68 (0.50, 0.86)		0.84 (0.71, 0.96)		0.95 (0.89, 1.00)		0.88 (0.76, 1.00)	
	Optimism corrected C-statistic	0.68		0.84		f		0.85	

Table 4. Ordinal logistic regression to predict allocated FV group in BIOFAV participants utilising single or combined biomarker models

^a Estimates based upon ordinal logistic regression with outcome intake in groups (2, 5 and 8 portions perday) and explanatory variables change in biomarker values at 4 weeks.

^bFirst factor calculated from factor analysis based upon all carotenoids (change at 4 weeks). Calculate score= $0.22 \times \text{Lutein} + 0.20 \times \text{Zeaxanthin} + 0.02 \times \text{Lycopene} + 0.09 \times \beta$ -cryptoxanthin + $0.16 \times \alpha$ -carotene + $0.62 \times \beta$ -carotene.

^cSecond factor calculated from factor analysis based upon all carotenoids (change at 4 weeks). Calculate score= 0.41 X Lutein + 0.30 X Zeaxanthin + 0.04 X Lycopene + 0.14 X β-cryptoxanthin + -0.52 X α-carotene + -0.11 X β-carotene.

^d P value for likelihood ratio test comparing each model to model containing all carotenoids and vitamin C

^e Comparing actual category of intake with predicted category of intake based upon model cut offs (chosen to obtain the correct proportion in each category of intake).

^f Optimism could not be calculated due to large number of parameters compared with number of observations.

Table 5.	Regression	analysis to	o predict	allocated	FV	group	in F	FAVRIT,	FIRST	and ADI	Г

studies utilising single or combined biomarker model approach

		Vitamin C model	Lutein model	All carotenoids and vitamin C model
FAVRIT study	a	IIIouei		
TAVKII Study	Vitamin C	1.53 (1.05, 2.24)		1.71 (1.14, 2.56)
	Lutein		2.15 (1.40, 3.30)	1.69 (0.87, 3.27)
Estimates: OR	Zeaxanthin		(,)	0.68 (0.32, 1.41)
(95% CI) per	Lycopene			0.52 (0.30, 0.91)
standard	β-cryptoxanthin			6.23 (2.65, 14.63)
deviation	α-carotene			1.33 (0.60, 2.94)
increase	β-carotene			0.60 (0.27, 1.32)
	P compared with full model ^d	< 0.001	< 0.001	Reference
	Percentage agreement ^e	41% (41/100)	44% (44/100)	61 % (61/100)
Model	Weighted Kappa	0.21	0.24	0.47
Performance	C-statistic	0.64 (0.55, 0.73)	0.65 (0.57, 0.74)	0.80 (0.71, 0.88)
Performance	Optimism corrected C-statistic	0.64	0.65	0.76
	Adjusted r^{2t}	0.03	0.16	0.22
FIRST study ^b				
	Vitamin C	1.14 (0.77, 1.69)		0.98 (0.64, 1.49)
Estimates: OR	Lutein		1.96 (1.25, 3.08)	2.89 (1.30, 6.46)
(95% CI) per	Zeaxanthin			0.25 (0.05, 1.13)
standard	Lycopene			0.89 (0.53, 1.52)
deviation	β-cryptoxanthin			2.48 (1.09, 5.63)
increase	α-carotene			2.61 (0.23, 29.30)
	β-carotene			0.77 (0.36, 1.64)
	P compared with full model ^d	0.02	0.40	Reference
	Percentage agreement ^e	40 % (33/83)	41 % (34/83)	45 % (37/83)
Model	Weighted Kappa	0.12	0.19	0.30
Performance	C-statistic	0.58 (0.48, 0.68)	0.66 (0.57, 0.75)	0.70 (0.61, 0.79)
	Optimism corrected C-statistic	0.58	0.66	0.64
	Adjusted r ^{2 t}	< 0.01	0.15	0.11
ADIT study ^c		0.00 (1.07 4.17)		0.07 (1.04, 4.54)
E	Vitamin C	2.39 (1.37, 4.17)	1.50 (0.00, 0.00)	2.37 (1.24, 4.54)
Estimates: OR	Lutein		1.70 (0.99, 2.93)	1.59 (0.74, 3.43)
(95% CI) per	Zeaxanthin			2.76 (0.25, 30.63)
standard	Lycopene			1.03 (0.50, 2.12)
deviation	β-crypt oxanthin			1.91 (0.94, 3.92)
increase	α-carotene β-carotene			5.08 (0.62, 41.71)
	P compared with full model ^d	0.02	<0.001	0.28 (0.10, 0.74) Reference
	Percentage agreement ^e	70 % (55/79)	<0.001 62 % (49/79)	75 % (59/79)
Model	Kappa	0.39	0.24	0.49
Performance	C-statistic	0.39	0.24	0.49
1 errormanee	Optimism corrected C-statistic	0.72	0.67	0.82 (0.72, 0.91)
	Adjusted r^{2t}	0.12	<0.07	0.26
^a Estimatas hasa	d upon ordinal logistic regression wit			

^a Estimates based upon ordinal logistic regression with outcome intake in groups (1, 3 and 6 portions per day) and explanatory variables change in biomarker values at 8 weeks.

^b Estimates based upon ordinal logistic regression with outcome intake in groups (2, 4 and 7 portions per day) and explanatory variables change in biomarker values at 12 weeks.

and explanatory variables change in biomarker values at 12 weeks. ^c Estimates based upon logistic regression with outcome intake in groups (2 and 5 portions per day) and explanatory variables change in biomarker values at 16 weeks.

explanatory variables change in biomarker values at 16 weeks. ^d P value for likelihood ratio test comparing each model to model containing all carotenoids and vitamin C. ^e Comparing actual category of intake with predicted category of intake based upon model cut offs, chosen to

obtain the correct proportion in each category of intake. ^f Adjusted r^2 calculated using multiple linear regression with actual self-reported FV intake as the outcome and change in biomarker values as explanatory variables. Legends for figures

Figure 1: Flow chart illustrating recruitment, randomisation and participants' progression through BIOFAV dietary intervention study.

