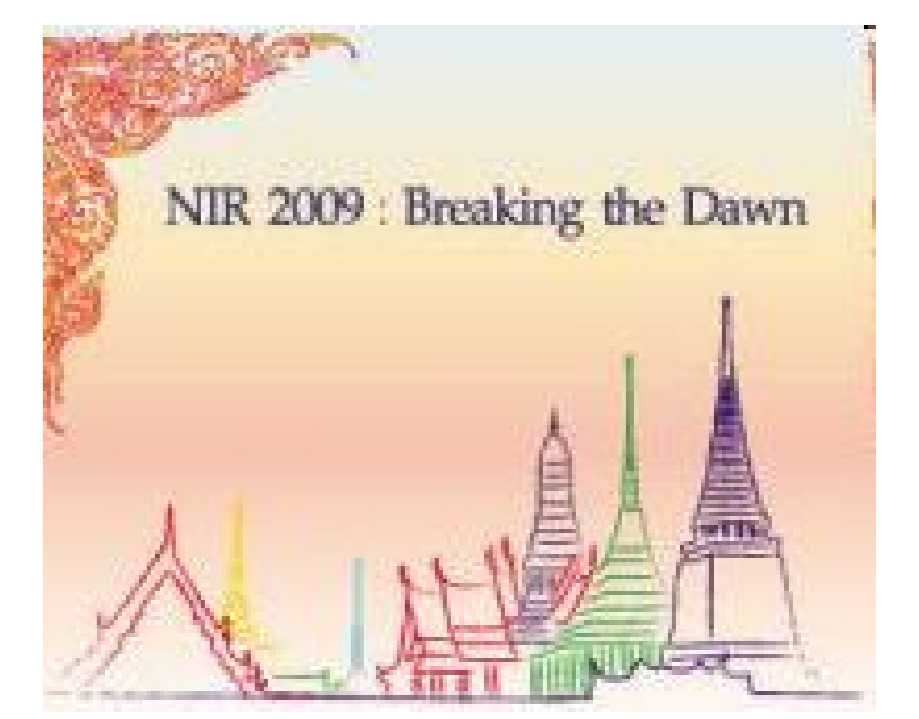


# Multi-spectral assessment of ingredients and physical properties of apricot



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## About us

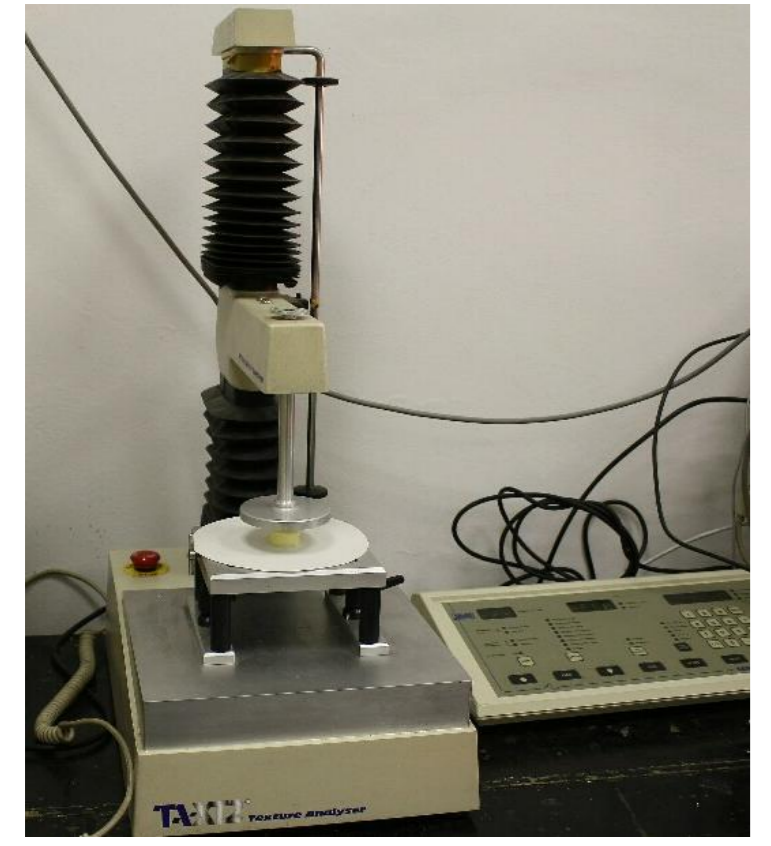
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- Faculty of Horticulture
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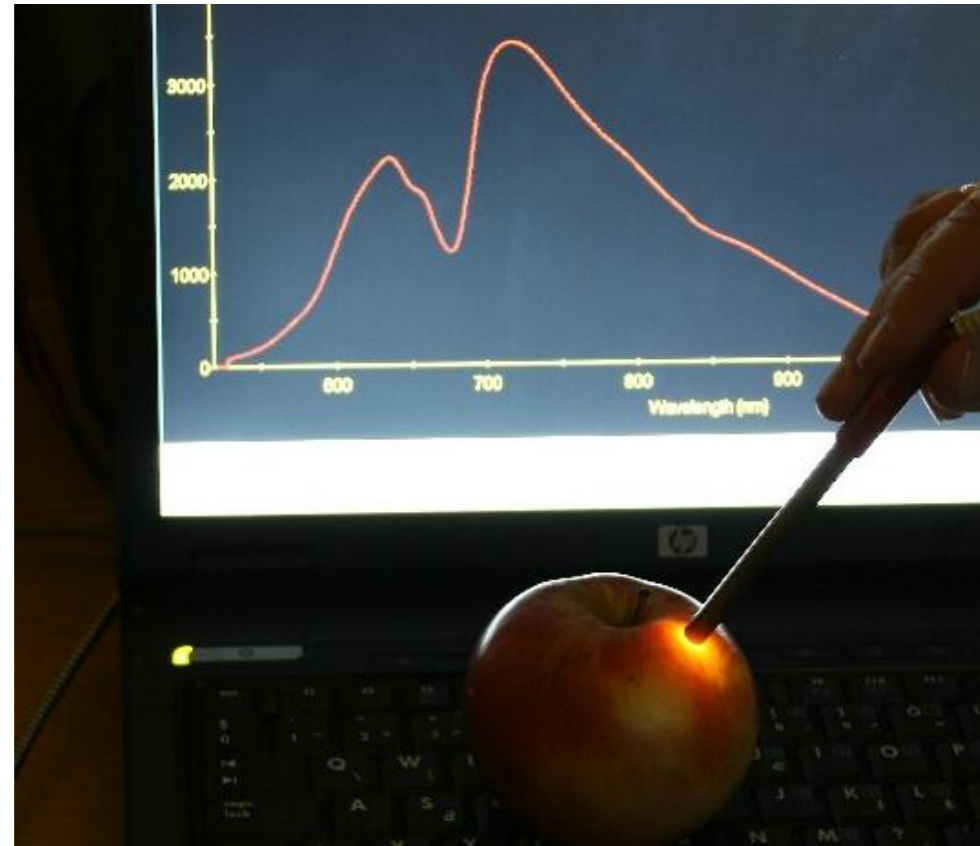
physical properties of food, their raw materials, fruits and vegetables are investigated:

- Rheological by static and dynamic methods
- Dielectric, chemical (e-tongue)
- Optical by image processing, scattering, spectroscopy, multi- and hyperspectral imaging methods

for basic research and industrial quality control, automation purposes.



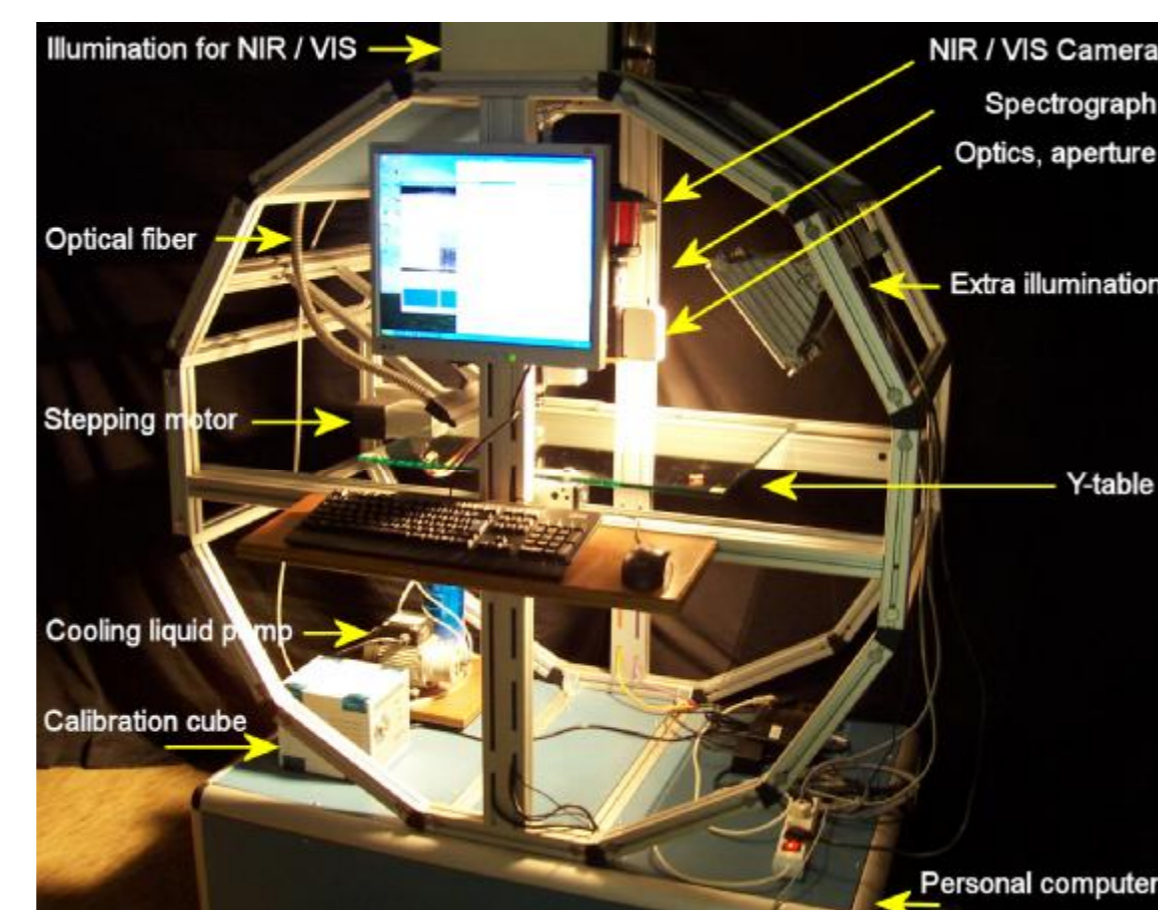
Penetrometer (static method)



Scattering at multiple wavelength



Capital of Hungary at night



Zeutech hyperspectral measurement setup

## Introduction

Some quality-related internal parameters of apricot can be predicted by the reflected NIR spectrum. According to the recent publications (Bureau et al, 2009, Camps and Christen, 2009), using 800-2500nm range, the soluble solids content (SSC) and the titratable acidity (TA) can be predicted properly, but other quality traits, like malic and citric acid, individual sugars, ethylene production and firmness were not satisfactory modeled.

The non-destructive, non-contact and fast optical measurement methods, like hyper- or multispectral imaging are more and more demanded for on-line industrial quality control tasks. These methods combine the advantages of spectroscopy and conventional image processing, obtain the spatial distribution of spectral properties on non-homogeneous surfaces (Figure 1), but have much less spectral information in usually noisy environment.

For testing the feasibility of multispectral industrial application, the internal-, rheological and optical properties of apricot cultivars were investigated. Samples of three cultivars, three ripening state and three further categories by storage time were measured with 20 samples in each group. All the measurements were taken on both blushed and un-blushed side as well (Figure 2).

The optical properties were measured and checked in different spectral ranges with different instrumentation. Mechanical properties of the samples were measured on dynamical way, with two impact methods and an acoustic response system. The chemical properties were measured after all non-destructive methods mentioned above.

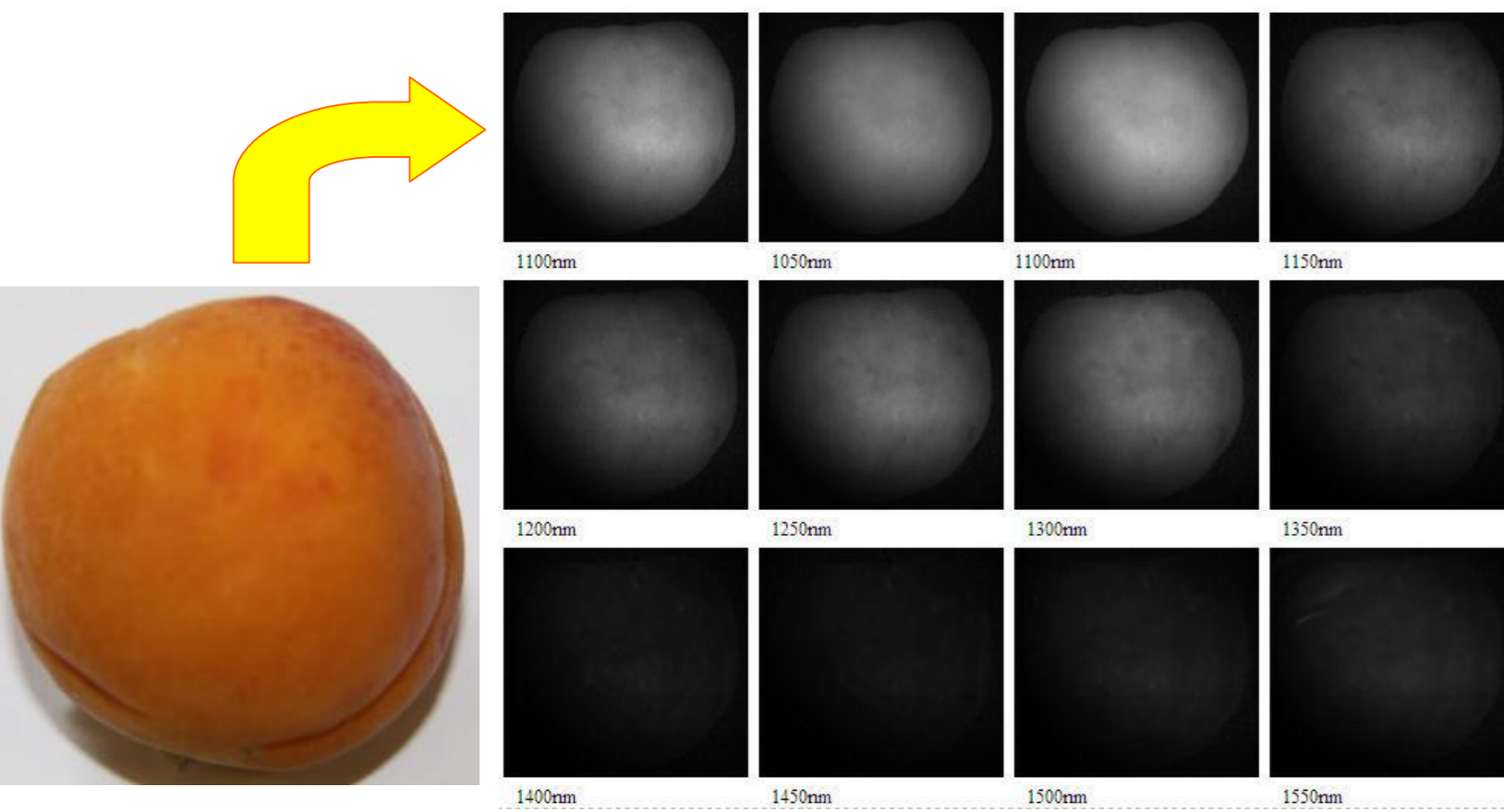


Fig. 1: Multispectral images of defected Bergarouge sample



Fig. 2: Bergeron cultivar in three ripeness state

## Materials and methods

In the experiment described below, samples of Bergeron, Bergarouge and Zebra apricot cultivars were tested grouping in three ripeness category (1. immature, 2. ripened for processing, 3. ripened for consumption). The second category was stored for one week (4. category) and two weeks (5. category).

The mass (m) and the three perpendicular diameters ( $d_1$ ,  $d_2$ ,  $d_3$ ) were recorded. The following optical, mechanical and chemical parameters were inspected on both blushed and un-blushed side (Figure 3):

Optical	<ul style="list-style-type: none"> <li>• <b>RGB Imaging System</b> (RGB images using diffuse illumination): average value and variance of XYZ colour components of segmented areas</li> <li>• <b>Pigment Analyzer</b> (400-1090 nm range, 3.25nm resolution): reflected spectra, Normalized Difference Vegetation Index, Normalized Anthocyanin Index</li> <li>• <b>ColorLite sph850 spectrophotometer</b> (400-700 nm range, 10nm resolution): reflected spectra, CIE Lab, Luv and XYZ coordinates</li> <li>• <b>PCM Spectralyzer 10-25</b> (1000-2500 nm range, 2nm resolution) (Figure 5): the average reflectance on a 25mm diameter area</li> <li>• <b>NIR Multispectral Imaging system</b> (12 images at 1000-1050-...-1550 nm) (Figure 8): average value and variance of intensity values on segmented areas</li> </ul>
Mechanical	<ul style="list-style-type: none"> <li>• <b>acoustic resonance method:</b> measured: resonance frequency (<math>f</math>, Hz) and width of the resonance peak at -3 dB (<math>bw</math>, Hz) calculated: <math>s_1 = f^2 \cdot m^{2/3}</math> and <math>s_2 = f^2 \cdot d_1^2</math> acoustic stiffness coefficients</li> <li>• <b>impact method:</b> measured: time of deceleration of the impact hammer (<math>dt</math>, ms) calculated: <math>D = 1/dt^2</math> impact stiffness coefficient</li> <li>• <b>Sinclair Internal Quality tester</b> measured: Sinclair firmness coefficient on 1-100 scale (<b>IQ</b>)</li> </ul>
Destructive	<ul style="list-style-type: none"> <li>• <b>pH</b> of the apricot flesh (Vaiseshika pH-conductivity TDS+DO meter and inserted flesh probe)</li> <li>• <b>SSC (Brix)</b> of the apricot juice (Atago digital refractometer PAL-1)</li> <li>• <b>Sugar-content</b> of groups (fructose, glucose, saccharose, xylose, raffinose) (HPLC)</li> <li>• <b>Titratable acid content</b> of groups (titration)</li> </ul>



Fig. 3: Pigment Analyzer, Color Lite; Acoustic method, Impact method, Sinclair IQ tester; Brix tester, pH-meter

The correlation between **NIR spectrophotometer measurement** and different quality traits was investigated by Partial Least Squares (PLS) linear regression method. Since randomly selecting two third of whole dataset as calibration subset did not resulted reliable prediction, the first (immature) and third (ripened for consumption) groups were used as calibration set having a wide distribution of internal properties. The optimal number of latent variables was determined on the base of the minimal value of RMSEV and the maximal value of Relative Performance Determinant (RPD). RPD is defined as the standard deviation of the reference values of all samples divided by the standard deviation of the error of the validation set. The overfitting of regression was checked by the B-vector.

The **multispectral images** were segmented, than the average spectra of investigated area were compared with spectrophotometer measurements. The variance of spectra on investigated area was also checked. The prediction model was also the PLS method calculating the correlation, the RPD, RMSEC and RMSEV values and the B-vector. Multi-linear regression (MLR) method was used to determine the significant wavelengths of given internal properties. All, the statistical algorithm were developed in Mathcad software package (ver. 14.0, MathSoft, USA).

## Results

All the measured optical (e.g. Lab, NDVI, NAI) and mechanical (Sinclair-, impact- and acoustic stiffness) parameters were changed monotonically by the ripeness state and by the storage time as well (Table 1). The chemical properties, however, behave irregularly. The **pH** increased during ripening, but it grown significantly only at the first week of storage. The soluble solids content (**Brix**) increased during ripening, but has not changed during storage. The change of **sugar-content** (fructose, glucose, saccharose, xylose, raffinose) and titratable acid (**TA**) was not commonly monotonous by ripeness state, neither by storage time (Table 2). This paper will focus on the prediction of **pH** and **Brix**.

Cultivar	Ripeness/Storage category	Mass, g			Volume, cm <sup>3</sup>			Stiffness			Un-blushed			Blushed side			Ripeness in visible range														
		avg	std	std	avg	std	std	avg	std	std	avg	std	std	avg	std	std	L*	a*	b*	L	a	b									
Bergeron	Immature (1)	65.4	4.9	60.1	4.3	14.0	2.5	0.140	0.027	2050959	47564	-0.07	0.20	0.06	0.21	0.77	0.15	0.56	0.10	57.8	2.7	6.7	1.9	41.0	2.7	49.5	4.8	16.4	5.3	31.3	5.4
	processing (2)	67.8	6.2	54.7	6.6	12.1	1.3	0.133	0.017	2136610	370326	-0.10	0.18	-0.02	0.20	0.90	0.07	0.78	0.12	51.5	1.3	11.5	1.6	40.3	1.7	46.5	1.7	44.0	2.0	31.9	2.0
	1 week (4)	69.4	7.8	54.4	8.9	10.3	1.2	0.073	0.020	1011637	485146	-0.46	0.05	-0.48	0.07	0.84	0.13	0.61	0.18	49.3	2.8	12.5	3.6	33.7	2.8	41.1	4.9	19.4	4.1	23.5	5.6
	2 weeks (5)	65.9	6.6	61.5	7.1	9.8	1.3	0.052	0.017	1672507	234025	-0.30	0.10	-0.24	0.21	0.92	0.05	0.80	0.08	56.3	2.4	14.2	2.8	40.8	2.1	45.5	3.9	22.1	2.5	26.5	5.0
	consumption (3)	65.9	6.6	61.5	7.1	9.8	1.3	0.052	0.017	1672507	234025	-0.30	0.10	-0.24	0.21	0.92	0.05	0.80	0.08	56.3	2.4	14.2	2.8	40.8	2.1	45.5	3.9	22.1	2.5	26.5	5.0
Bergarouge	Immature (1)	64.7	8.3	60.6	7.7	14.9	2.5	0.141	0.027	2050959	1117264	-0.11	0.15	-0.08	0.19	0.69	0.23	0.36	0.33	58.1	1.7	7.2	2.7	41.5	2.4	49.7	4.2	14.9	5.6	31.6	5.6
	processing (2)	64.3	9.8	58.9	8.9	11.2	2.5	0.110	0.022	2050959	847019	-0.29	0.11	-0.27	0.11	0.88	0.11	0.71	0.15	56.0	2.5	12.1	2.2	40.1	3.0	43.0	3.3	22.8	4.4	24.1	5.2
	1 week (4)	61.4	6.0	46.2	4.8	13.6	2.4	0.066	0.012	441656	202022	-0.46	0.05	-0.47	0.07	0.94	0.05	0.60	0.16	47.7	2.7	10.8	3.4	31.8	1.8	41.6	3.8	16.9	3.9	23.1	4.3
	2 weeks (5)	45.4	7.3	38.4	7.0	-	-	-0.034	0.011	185482	131504	-	-	-	-	-	-	-	-	45.5	2.0	11.2	2.1	33.1	2.1	37.3	3.4	17.6	2.9	21.9	4.9
	consumption (3)	64.3	9.8	58.9	8.9	11.2	2.5	0.110	0.022	2050959	847019	-0.29	0.11	-0.27	0.11	0.88	0.11	0.71	0.15	56.0	2.5	12.1	2.2	40.1	3.0	43.0	3.3	22.8	4.4	24.1	5.2
Zebra	Immature (1)	61.3	5.2	46.8	4.9	21.8	3.1	0.228	0.041	4262964	1238763	0.22	0.28	0.21	0.27	0.63	0.10	0.76	0.10	55.5	1.9	15.4	2.9	40.5	2.4	44.4	5.4	25.7	3.4	26.4	7.1
	processing (2)	64.3	6.0	62.2	4.4	20.3	4.1	0.151	0.020	3333971	1033394	0.08	0.19	0.10	0.22	0.82	0.09	0.79	0.11	50.6	1.9	13.8	1.6	42.6	2.0	45.1	2.8	17.5	2.5	34.5	4.0
	1 week (4)	67.1	10.0	61.5	8.4	13.2	4.2	0.123	0.027	1609289	554809	-0.32	0.11	-0.31	0.15	0.91	0.08	0.77	0.14	50.6	1.5	16.1	1.2	39.4	2.3	45.1	2.3	20.4	1.7	31.5	3.2
	2 weeks (5)	64.3	6.0	62.2	4.4	20.3	4.1	0.151	0.020	3333971	1033394	0.08	0.19	0.10	0.22	0.82	0.09	0.79	0.11	50.6	1.9	13.8	1.6	42.6	2.0	45.1	2.8	17.5	2.5	34.5	4.0
	consumption (3)	67.1	10.0	61.5	8.4	13.2	4.2	0.123	0.027	1609289	554809	-0.32	0.11	-0.31	0.15	0.91	0.08	0.77	0.14	50.6	1.5	16.1	1.2	39.4	2.3	45.1	2.3	20.4	1.7	31.5	3.2

Table 1: Average and standard deviation of quality traits

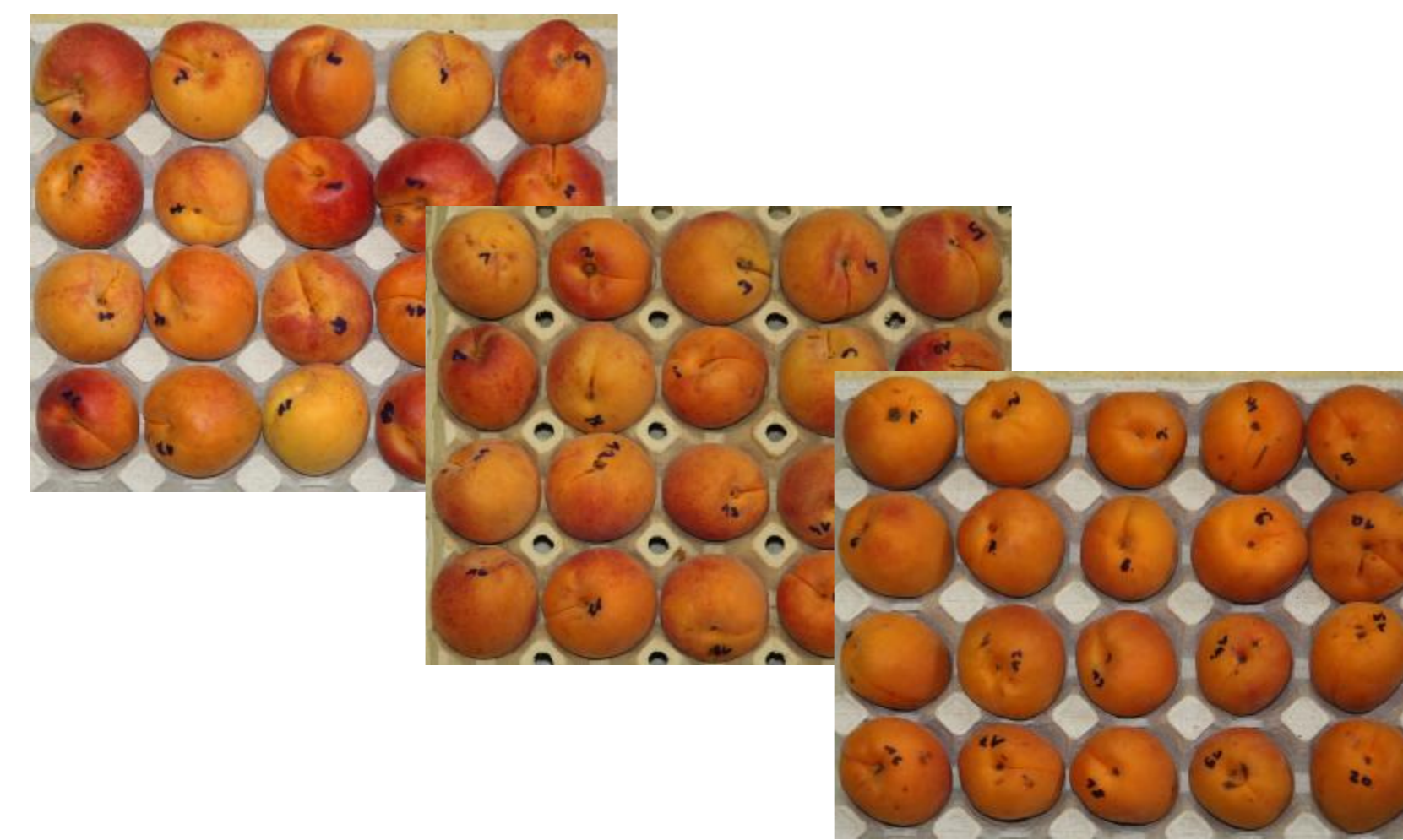


Fig. 4: Bergeron, Bergarouge and Zebra cultivars

Cultivar	Ripeness/Storage category	Chemical											measurement on groups of samples					
		Brix, %	pH	Acid, %	Fructose, mg/g	Glucose, mg/g	Saccharose, mg/g	Xylose, mg/g	Raffinose, mg/g	RPD	RMSEV	RMSEC	RPD	RMSEV	RMSEC			
Bergeron	Immature (1)	14.8	1.3	3.44	0.24	1.75	10506	207	9845	548	21569	133	96	198	819	312		
	processing (2)	18.6	1.4	3.82	0.25	1.40	9411	198	11443	192	21658	133	50	810	863	158		
	1 week (4)	18.1	1.3	4.29	0.21	1.75	11703	271	10738	349	23066	284	65	112	539	058		
	2 weeks (5)	18.4	1.5	4.31	0.20	1.75	11703	271	10738	349	23066	284	65	112	539	058		
	consumption (3)	17.6	1.1	4.4	0.22	1.45	13778	561	11326	693	21725	961	21725	961	21725	961		
Bergarouge	Immature (1)	19.8	1.5	3.8	0.4	3.50	9243	476	9778	526	21996	406	137	796	587	312		
	processing (2)	18.6	1.0	4.3	0.3	1.75	10449	962	8739	631	18680	144	86	116	648	873		
	1 week (4)	18.6	0.9	5.2	0.4	5.35	9701	039	8035	543	23110	041	117	621	754	017		
	2 weeks (5)	18.7	1.2	5.0	0.5	1.75	10449	962	8739	631	18680	144	86	116	648	873		
	consumption (3)	17.6	1.1	4.4	0.3	1.75	10207	753	9904	356	1912	193	43	688	749	584		
Zebra	Immature (1)	13.4	1.2	2.8	0.1	3.50	870	492	7475	184	4345	306	50	649	-			
	processing (2)	14.2	1.0	2.9	0.2	4.20	444	311	1327	115	2797	826	-	-	-			
	1 week (4)	16.1	1.3	3.1	0.2	1.75	727	984	1792	188	833	026	44	363	11	894		
	2 weeks (5)	16.8	1.0	3.1	0.5	2.80	1181	121	2529	844	5859	931	180	801	151	561		
	consumption (3)	14.2	1.0	2.9	0.2	4.20	444	311	1327	115	2797	826	-	-	-			

Table 2: Chemical properties

## 1. Spectrophotometer data analysis:



Fig. 5: PCM Spectralyzer 10-25

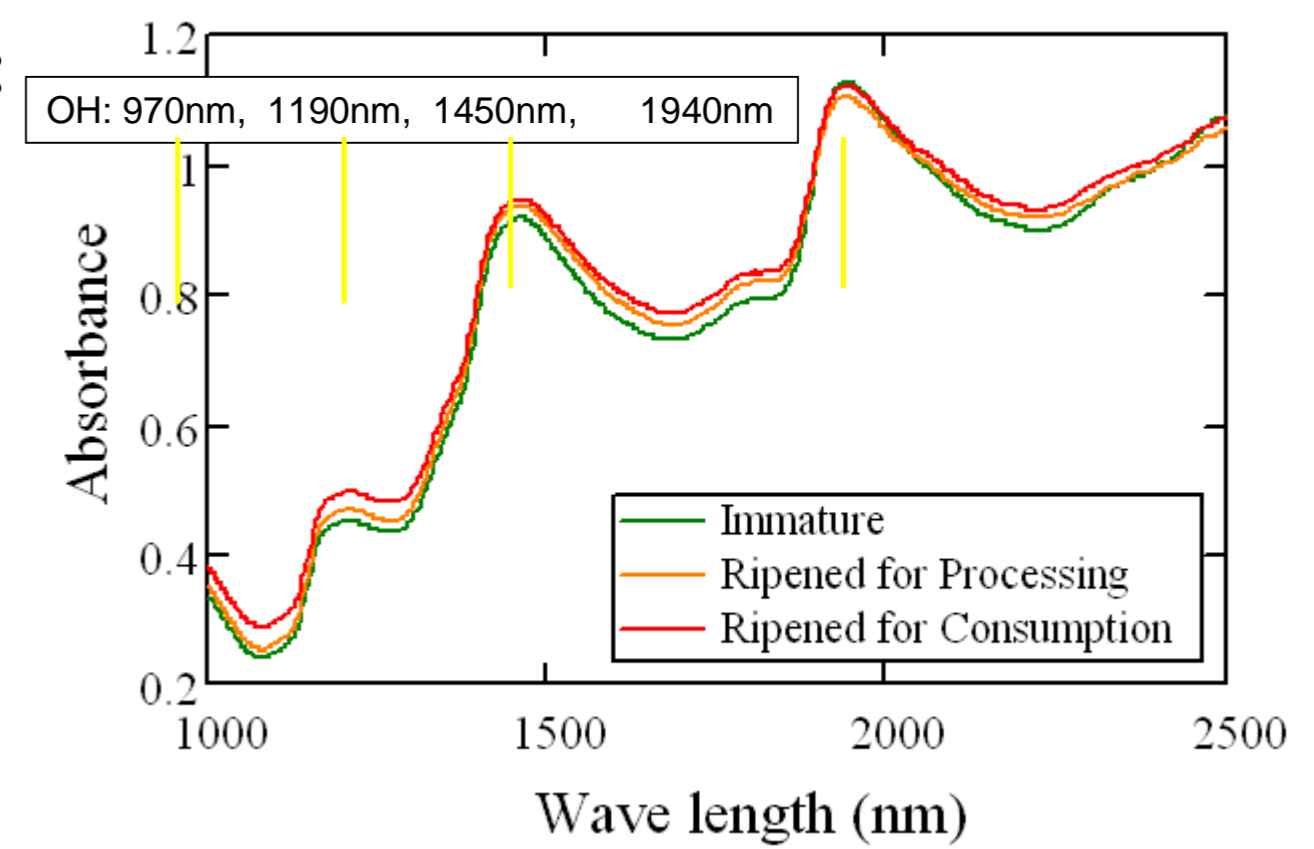


Fig. 6: Typical spectra of different ripeness states (averages for all cultivars, items and sides)

## Prediction of pH:

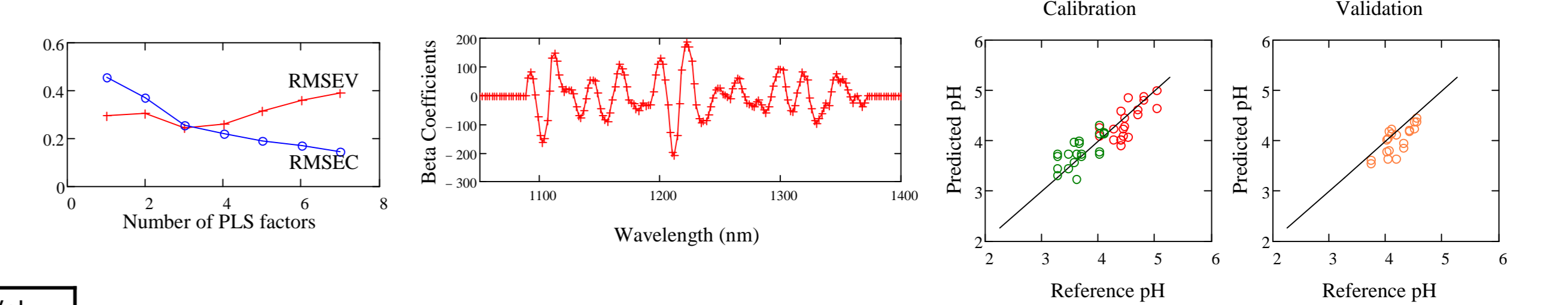


Fig. 7. A.) Determination of LV, B.) Checking overfitting, C.) Calibration and validation set

pH: The optimal number of factors was found to be 3 (7.A). The diagram of B-coefficients appears smooth enough (7.B). The diagram of calibration and validation shows relationship (7.C). High RPD and small RMSEV signs, that this model is encouraging, despite of sample set contained both the spectra measured on blushed and un-blushed side. Brix: RPD is less, RMSEV is higher, but it has the same correlation (R).

## 2. Multispectral data analysis:

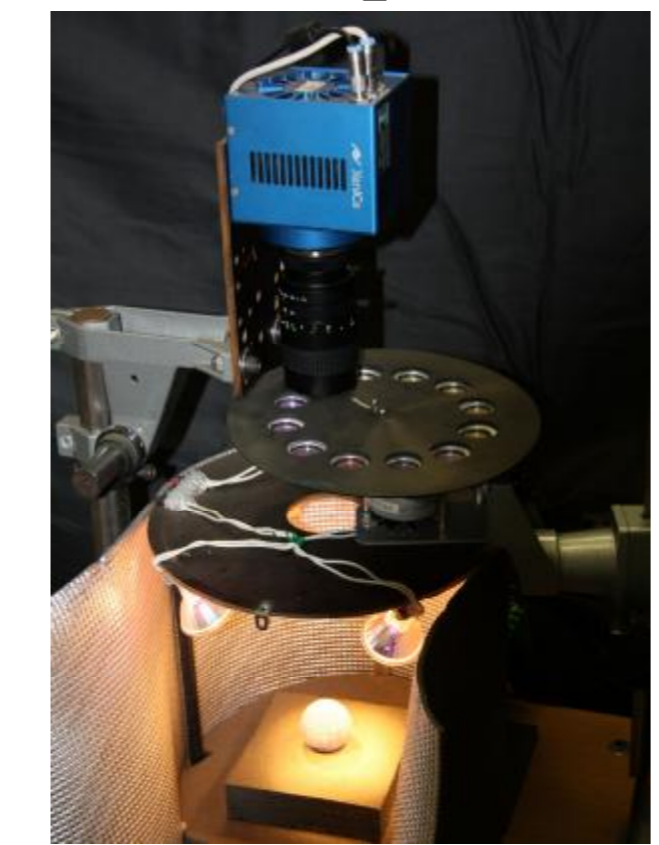


Fig. 8: Multispectral setup

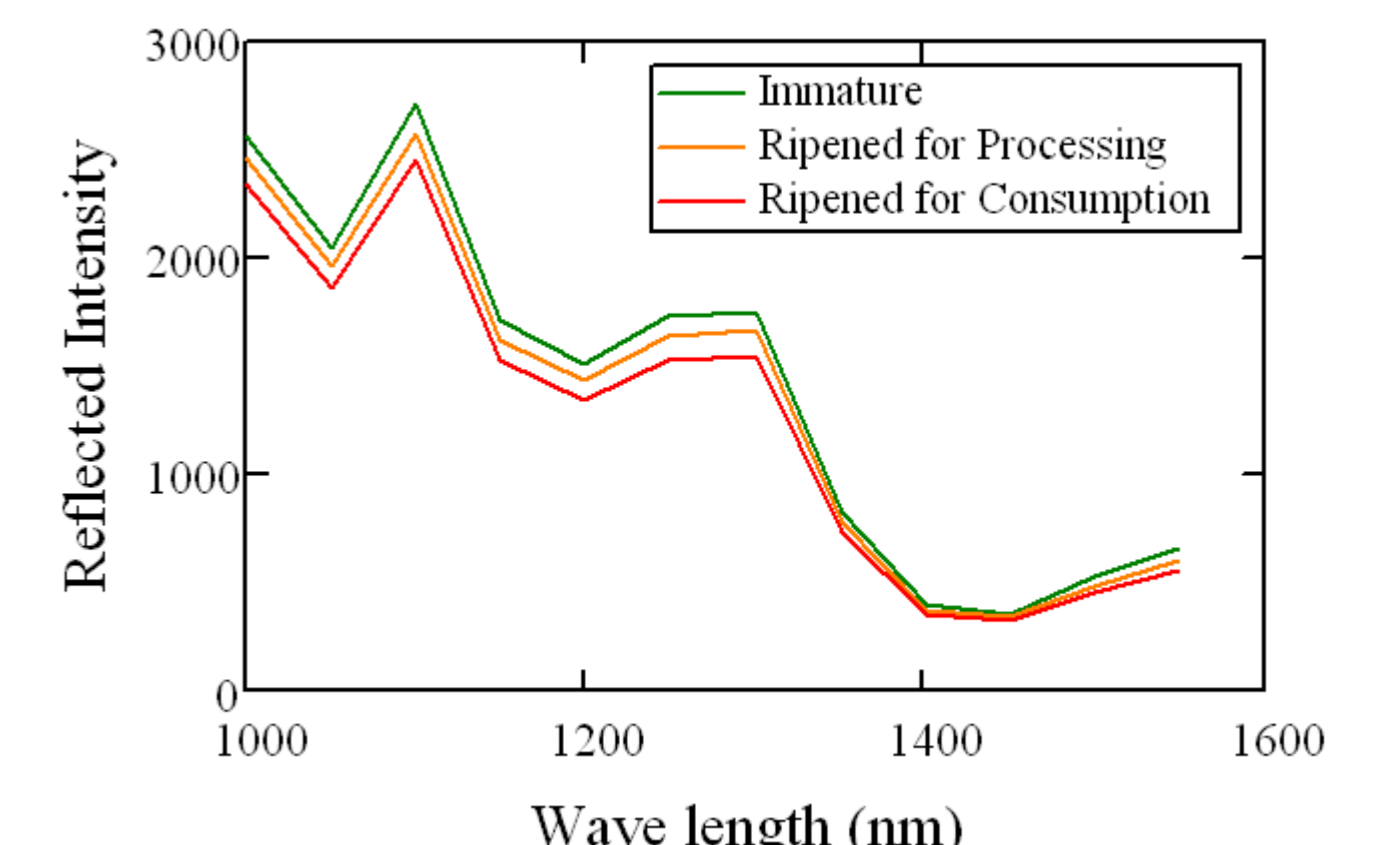


Fig. 9: Typical spectra of different ripeness states (average for all cultivars, items and sides)

## Prediction of pH:

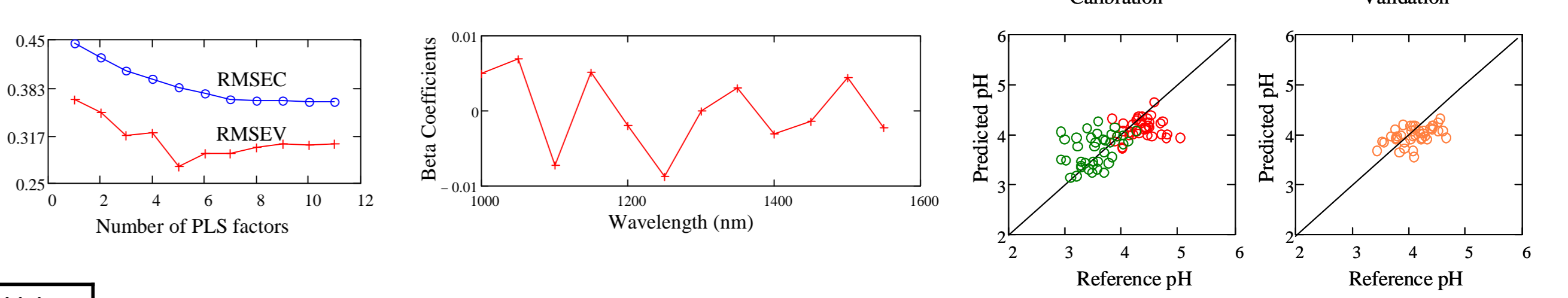


Fig. 10. A.) Determination of LV, B.) Checking overfitting, C.) Calibration and validation set

pH: Using multiplicative scatter correction, the RPD and the small RMSEV show acceptable relation. R2 is small, because the cultivars have different behaviour on these wavelengths. Building the model for given cultivar (e.i. Bergeron), the results were better. Without multiplicative scatter correction, only 2 factors resulted RPD=1.38 and RMSEV=0.37 values. The significant wavelengths were calculated by MLR method. Brix: R2 is almost zero, signing that these wavelengths are useless for predicting SSC. Significant wavelengths of this property