

LARGE-SCALE BIOLOGY ARTICLE

# Stitching together the Multiple Dimensions of Autophagy Using Metabolomics and Transcriptomics Reveals Impacts on Metabolism, Development, and Plant Responses to the Environment in *Arabidopsis*<sup>CW</sup>

Céline Masclaux-Daubresse,<sup>a,b,1</sup> Gilles Clément,<sup>a,b,2</sup> Pauline Anne,<sup>a,b,2</sup> Jean-Marc Routaboul,<sup>a,b,3</sup> Anne Guiboileau,<sup>a,b</sup> Fabienne Soulay,<sup>a,b</sup> Ken Shirasu,<sup>c</sup> and Kohki Yoshimoto<sup>a,b,c</sup>

<sup>a</sup>Unité Mixte de Recherche 1318, INRA, Institut Jean-Pierre Bourgin, 78026 Versailles cedex, France

<sup>b</sup>AgroParisTech, Institut Jean-Pierre Bourgin, 78026 Versailles cedex, France

<sup>c</sup>RIKEN, Plant Science Center, Tsurumi-ku, Yokohama 230-0045, Japan

Autophagy is a fundamental process in the plant life story, playing a key role in immunity, senescence, nutrient recycling, and adaptation to the environment. Transcriptomics and metabolomics of the rosette leaves of *Arabidopsis thaliana* autophagy mutants (*atg*) show that autophagy is essential for cell homeostasis and stress responses and that several metabolic pathways are affected. Depletion of hexoses, quercetins, and anthocyanins parallel the overaccumulation of several amino acids and related compounds, such as glutamate, methionine, glutathione, pipercolate, and 2-aminoadipate. Transcriptomic data show that the pathways for glutathione, methionine, raffinose, galacturonate, and anthocyanin are perturbed. Anthocyanin depletion in *atg* mutants, which was previously reported as a possible defect in flavonoid trafficking to the vacuole, appears due to the downregulation of the master genes encoding the enzymes and regulatory proteins involved in flavonoid biosynthesis. Overexpression of the *PRODUCTION OF ANTHOCYANIN PIGMENT1* transcription factor restores anthocyanin accumulation in vacuoles of *atg* mutants. Transcriptome analyses reveal connections between autophagy and (1) salicylic acid biosynthesis and response, (2) cytokinin perception, (3) oxidative stress and plant defense, and possible interactions between autophagy and the COP9 signalosome machinery. The metabolic and transcriptomic signatures identified for the autophagy mutants are discussed and show consistencies with the observed phenotypes.

## INTRODUCTION

Autophagy (namely, macro-autophagy) is an evolutionarily conserved process in eukaryotic cells. It participates in catabolic processes and the recycling of cytoplasmic and organelle constituents through the sequestration of cell material into vesicles. These vesicles are then delivered for breakdown to the central vacuole in yeast and plants or to the lysosome in animals. The autophagy system, discovered in yeast and extensively studied in mammals, has also now been well described in *Arabidopsis thaliana* (Liu and Bassham, 2012). Many *ATG* (autophagy) genes play a role in the

formation of cup-shaped double membrane preautophagosomal structures. These expand and curve to engulf malfunctioning or unneeded organelles or proteins and to remove cellular debris. Under normal conditions, autophagy is a housekeeping mechanism managing cell waste, recycling cell constituents, and controlling organelle quality. Its function in remobilizing nutrients becomes essential when cells are faced with nutrient deprivation or stress.

In plants, *ATG* genes are upregulated during leaf senescence and in response to a large range of stresses, such as pathogen attack, drought, salt stress, and starvation (Liu et al., 2009; Breeze et al., 2011). Phenotypic analyses of *Arabidopsis atg* mutants showed that autophagy is essential for plant survival upon carbon, nitrogen, or water deprivation and is involved in plant immunity (Hayward and Dinesh-Kumar, 2011). As autophagy mutants displayed early senescence symptoms under nitrogen limitation, autophagy-dependent nitrogen recycling and remobilization efficiency appeared critical. The use of <sup>15</sup>N tracing at the whole-plant level demonstrated that autophagy has an important role in the remobilization of organic nitrogen from the leaves to the seeds. It was also shown that despite higher protease activities in rosette leaves, *atg* mutants accumulate soluble proteins and other nitrogen compounds in their vegetative tissues (Guiboileau et al., 2012, 2013).

<sup>1</sup> Address correspondence to celine.masclaux@versailles.inra.fr.

<sup>2</sup> These authors contributed equally to this work.

<sup>3</sup> Current address: Genomic and Biotechnology of Fruit, Unité Mixte de Recherche 990 INRA/INP-ENSAT, 24, Chemin de Borderouge-Auzeville CS 52627, F-31326 Castanet-Tolosan cedex, France.

The author responsible for distribution of materials integral to the findings presented in this article in accordance with the policy described in the Instructions for Authors (www.plantcell.org) is: Céline Masclaux-Daubresse (celine.masclaux@versailles.inra.fr).

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Although it is now widely accepted that autophagy participates in recycling cellular components and, thus, in nutrient recycling and mobilization, it is likely that autophagy activity is also essential for numerous other cellular processes related to cell longevity, cell reprogramming, or organelle repair and maintenance. Thus, defects in autophagy housekeeping functions would generate a large set of intracellular changes and defects that would differ depending on age and environmental constraints. Indeed, recent reports showed that autophagy can be selective and that this selectivity might depend on the environmental stress conditions sensed by the plants and on the specific organelles damaged or cellular pathways impaired (Floyd et al., 2012). Specific autophagy occurring in response to sulfur stress was documented in tobacco (*Nicotiana tabacum*) plants by the discovery of interactions between the two sulfur-responsive proteins UPC9 and Joka2 and between Joka2 and ATG8f (Zientara-Rytter et al., 2011). The Joka2 protein sequence was revealed to have high homology with the NBR1 adapter involved in autophagy selectivity in mammals. A specific involvement of autophagy in chloroplast degradation (chlorophagy) was also previously documented. Ono et al. (2013) reported that in individual darkened leaves, vacuolar transfer and processing of chloroplastic Rubisco–green fluorescent protein (GFP) fusion is not observed in the *atg5* mutant. More recently, we showed that *atg* mutants accumulate peptides identified as Rubisco and glutamine synthetase GS2 fragments, which might be due to incomplete degradation of stromal proteins (Guiboileau et al., 2013). In addition to specificities associated with substrates and stress conditions, some reports suggest that the core autophagy machinery might also be involved in trafficking cellular components other than unwanted organelles or proteins and as such might participate in metabolic pathways such as anthocyanin maturation and trafficking to the vacuole (Floyd et al., 2012).

Beside its role in cellular component degradation, autophagy also plays a role in plant immunity (Hayward et al., 2009). Several reports have shown that autophagy is required for resistance to necrotrophic pathogens and constitutes a prosurvival mechanism (Lai et al., 2011; Lenz et al., 2011). Responses of *atg* mutants to biotrophic pathogens, such as *Pseudomonas*, appear more complex. Autophagy could restrict or conversely promote cell death responses under incompatible plant pathogen interaction (Liu et al., 2005; Hofius et al., 2009). Autophagy activity appears to be involved in the regulation of the salicylic acid (SA) pathway, and elevated SA accumulation in autophagy mutants is responsible for their early leaf senescence and the extensive cell death symptoms when inoculated with incompatible *Pseudomonas* strains (Yoshimoto et al., 2009). However, the exact process by which the SA/autophagy feedback loop is working remains to be elucidated.

Our aim is to obtain an overview of the pleiotropic effects of autophagy activity on the regulation of plant metabolism and cell signaling in *Arabidopsis*. Since autophagy activity is enhanced in leaves during ageing and when nitrate is limiting, *atg* mutants grown under sufficient or limiting nitrate conditions were used for metabolomics and transcriptomics analyses. The results allowed us to decipher the large range of effects generated by autophagy defects in plants and to reveal links between autophagy, metabolism, and signaling.

## RESULTS

### Metabolite Profiles of *atg* Mutants and RNAi18 Reveal Prominent Changes in Amino Acid, Sterol, Sugar, and Flavonoid Metabolism

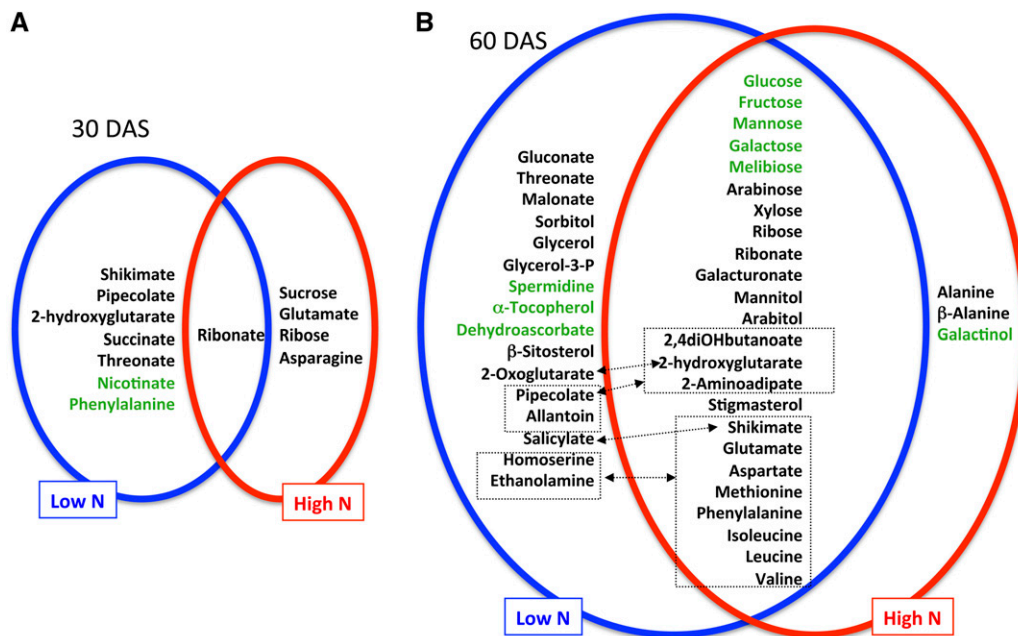
Our first analyses were performed on *atg5*, *atg9*, *ATG18a* RNA interference lines (RNAi18), and Columbia (Col) wild-type rosette samples from plants grown under low and high nitrate conditions for 30, 60, and 75 d according to Guiboileau et al. (2013). As shown in our previous reports, no senescing phenotype can be observed 30 d after sowing (DAS) for any of the genotypes under low or high nitrate conditions. At 60 DAS, senescing leaves were observed under low nitrate conditions on *atg5*, *atg9*, and RNAi18 rosettes but not on the wild type. At 75 DAS, leaf senescence was observed for all genotypes under low nitrate conditions but not the wild type under high nitrate conditions (Guiboileau et al., 2013).

Metabolic changes (raw data available online as Supplemental Data Set 1) were estimated by computing the fold changes in metabolite concentrations in *atg5*, *atg9*, and RNAi18 relative to the wild type at each time point and for each nitrate condition and each planting (three separate plantings, each containing three plant samples; see Methods). Only significant and reproducible differences between the mutant/RNAi and wild type (based on *t* test,  $P < 0.05$ ) are presented in Supplemental Data Set 2. Metabolites were classified as amino acids, amines, secondary metabolites, cyano compounds, tricarboxylic acid cycle compounds, and sugars compounds to simply presentation of results.

Under both low and high nitrate conditions, only a few changes were observed in *atg5*, *atg9*, and RNAi18 at 30 DAS (Figure 1A). With the exception of the ribonate concentration, which increased under both low and high nitrate conditions and in at least two of the three mutant/RNAi lines, no other metabolite changed in a similar way under both conditions (Supplemental Data Set 2; Figure 1A). Under low nitrate conditions, the accumulation of piperolate, 2-hydroxyglutarate, shikimate, succinate, ribonate, and threonate was observed as well as a decrease in phenylalanine and nicotinate. After 30 DAS under high nitrate conditions, glutamate, asparagine, ribose, ribonate, and sucrose accumulated (Supplemental Data Set 2; Figure 1A).

At 60 and 75 DAS, further differences between the wild type and the mutants were observed, and these were more pronounced under low nitrate conditions (Supplemental Data Set 2; Figure 1B). Under both low and high nitrate conditions, the mutant/RNAi lines accumulated a large set of amino acids among which glutamate and aspartate are the known precursors of the others. The mutant/RNAi lines also accumulated minor amino acids such as methionine, phenylalanine, and branched-chain amino acids such as valine, leucine, and isoleucine as well as shikimate, which is the precursor of aromatic amino acids and the starting point of the biosynthesis of phenolic compounds and SA (Figure 1B).

Changes in carbohydrates were more contrasted than those of the amino acids. While hexoses (glucose, fructose, mannose, and galactose) were lower in the mutant/RNAi lines than in the wild type, their corresponding sugar alcohols (mannitol and sorbitol) and aldonic acids (gluconate, galacturonate, ribonate, threonate, and malonate) were higher (Figure 1B). Depletion in hexose forms was consistent with previous results (Guiboileau et al., 2013) and



**Figure 1.** Changes in the Metabolite Contents of *atg* Mutants Compared with the Wild Type.

The metabolites that increased (black font) or decreased (gray or green font) significantly in the rosettes of *atg* mutant/RNAi lines, grown under low nitrate or high nitrate for 30 (A) or 60/75 (B) DAS are shown. Amino acids and related compounds are in dashed boxes, and arrows indicate metabolic links between compounds.

[See online article for color version of this figure.]

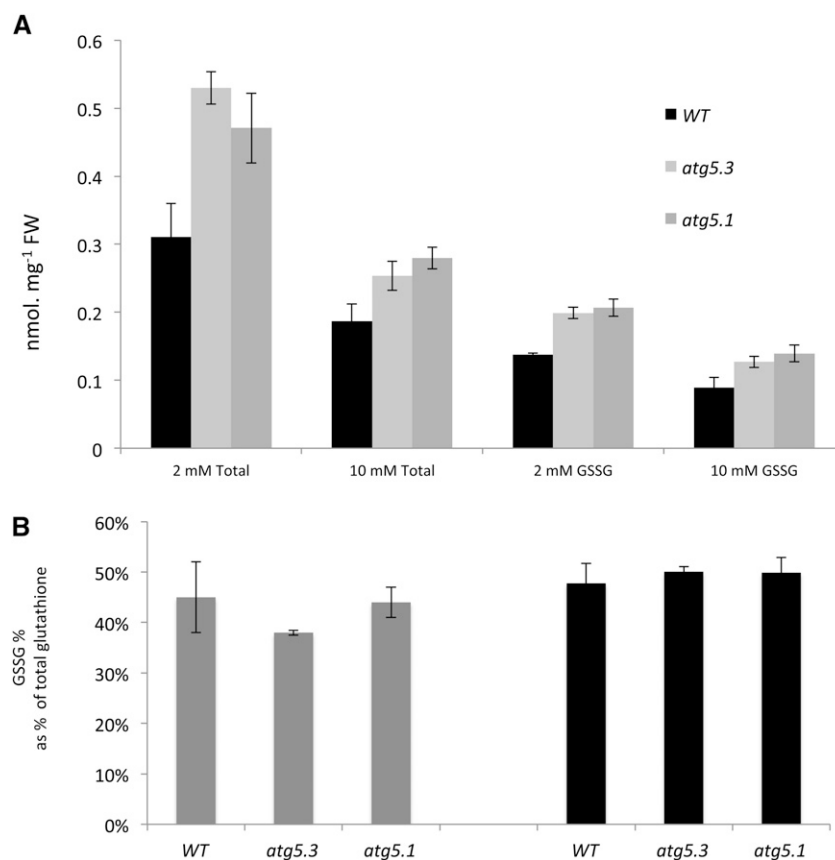
the concomitant accumulation of sugar alcohols and acids suggests a defect in the redox management of sugar molecules in the autophagy defective lines. The accumulation of cell wall sugars such as xylose, arabinose, and ribonate also suggests that cell wall edification is affected in the mutants.

2-Hydroxyglutarate, 2-amino adipate, and 2,4-dihydroxybutanoate were found to accumulate in the *atg* mutant/RNAi lines, suggesting that degradation of lysine and other aromatic and branched-chain amino acids is different in the mutant/RNAi lines compared with the wild type (Araújo et al., 2011; Figure 1B). 2-Hydroxyglutarate is known to participate in butanoate metabolism and is involved in lysine and aromatic amino acid catabolic pathways that can be used under certain circumstances to support mitochondrial respiration (Engqvist et al., 2011). 2-Amino adipate is also involved in the lysine degradation pathway as a pipecolate catabolite (Goyer et al., 2004). Interestingly, pipecolate also accumulated in the mutant/RNAi lines, but only under low nitrate supply. Allantoin overaccumulation, which is symptomatic of purine degradation, was also observed. Accumulation of all these compounds suggests then that amino acid and purine catabolism is modified in autophagy mutants, and this feature could explain why autophagy mutants accumulate nitrogen and especially amino acids in their rosette leaves, as shown previously by Guiboileau et al. (2013). Indeed, it is difficult to explain why amino acids accumulate in the rosettes leaves of autophagy mutants when protein degradation is impaired (Guiboileau et al., 2013). The interconversion of all the amino acids released from protein degradation to glutamine and asparagine, which are considered as the two major amino acids dedicated to phloem uploading in plants, might be a bottleneck for amino acid

translocation (reviewed in Masclaux-Daubresse et al., 2008). The accumulation of glutamate and aspartate, but not asparagine or glutamine, in the *atg* mutant/RNAi lines is consistent with this hypothesis.

From these observations, the question of whether these metabolic defects could be related to symptoms of early senescence was raised. The main reason why autophagy mutants senesce earlier than the wild type was partially answered previously and linked to the overaccumulation of reactive oxygen species (ROS) and SA (Yoshimoto et al., 2009). Our results on sugar forms (hexoses, acids, and alcohol) show that autophagy mutants are suffering from some kind of disturbed redox (Figure 1B). In addition, we observed a depletion of antioxidant molecules such as  $\alpha$ -tocopherol and spermidine in mutant/RNAi lines. Thus, to examine redox further, we then measured glutathione (GSSG and GSH) concentrations using enzymatic assays since glutathione cannot be determined using gas chromatography–mass spectrometry (GC-MS). Both total glutathione and oxidized glutathione (Figure 2A) were higher in *atg* mutants, while the percentage of glutathione oxidation was not modified (Figure 2B). These results suggest that *atg* mutant/RNAi lines do modulate their redox status at least through the glutathione pathway. However, the pronounced overaccumulation of glutathione that parallels the increases in glutamate and methionine suggests that amino acid metabolism is modified due to a more intensive activity of the glutathione pathway in these lines.

In addition to SA, the autophagy mutants also overaccumulate its two precursors, shikimate and phenylalanine. Interestingly, we observed that the autophagy defective lines did not turn red under



**Figure 2.** Glutathione Concentrations Are Higher in *atg* Mutants.

**(A)** Total glutathione (GSH + GSSG) and oxidized glutathione (GSSG) concentrations are significantly higher in wild-type rosettes (black bars) than in *atg5* mutant rosettes (gray bars; *atg5.1* allele, dark gray; *atg5.3* allele light gray; see Methods; mean and sd are shown;  $n = 3$  plant replicates), grown under low (2 mM nitrate) or high (10 mM nitrate) for 60 DAS.

**(B)** The percentage of glutathione oxidation is not different in *atg5* mutant compared with wild-type rosettes grown under low (2 mM nitrate; gray bars) or high (10 mM nitrate; black bars) for 60 DAS (mean and sd are shown;  $n = 3$  plant replicates).

nitrate limitation, as is usually observed in the wild type and under high nitrate conditions (Figure 3). This phenotype was especially striking on the reverse side of the rosettes and suggested differences in anthocyanin contents. We then used liquid chromatography–mass spectrometry (LC-MS) to measure the concentrations of flavonoid compounds that might be important as protectants against oxidative stress and are also produced from shikimate and phenylalanine. Overall, under high nitrate conditions, there was no significant difference in flavonoid contents between *atg5* and Col wild type except for the cyanidins A1342 and A1182, which were less abundant in *atg5* (Table 1; Supplemental Table 1). However, when grown under nitrate limitation, we found that the levels of all the anthocyanin molecules were 2 to 6 times lower in *atg5* than in the wild type at 60 DAS, and 3 to 6 times less at 75 DAS. Quercetin was 2 times less abundant in *atg5* at both 60 and 75 DAS, while no difference was observed for kampferol. The increase in SA that paralleled the decrease in flavonoids suggested that phenylalanine products are being preferentially rerouted to the SA pathway, thus depleting the biosynthesis of other flavonoid compounds.

The question of whether the changes in metabolite profiles in the *atg* mutants are due to their early leaf senescence phenotype was also addressed using the SA-defective *atg* mutants previously described by Yoshimoto et al. (2009). As those SA-defective *atg* mutants senesce later, similarly to the wild type, these were used with the aim of detecting autophagy-related and senescence-independent metabolic changes. Thus, metabolites were determined in the Col wild type, two SA defective lines (the *sid2* mutant and NahG overexpressor), the SA-deficient *atg* mutants (*atg5-3.sid2* and *atg5-1.NahG*), and the two different *atg5-1* and *atg5-3* mutants used previously by Yoshimoto et al. (2009) and Guiboileau et al. (2012) (see Methods). Supplemental Figure 1 shows that there was no significant difference between the metabolomes of mutant alleles *atg5-1* and *atg5-3*, so these were not distinguished further in this report. In order to determine SA-dependent and SA-independent autophagy-related metabolome modifications, significant metabolic differences were determined between *atg5* and Col, between *atg5.sid2* and *sid2*, and between *atg5.NahG* and NahG (Supplemental Table 2). These comparisons allowed us to determine which metabolites were significantly different



**Figure 3.** Unlike the Wild Type, the Rosettes of the *atg* Mutant Do Not Accumulate Anthocyanin or Turn Dark Red.

Photos of the reverse side of Col, *atg5*, and *atg9* rosettes grown under low or high nitrate conditions for 60 DAS. [See online article for color version of this figure.]

in *atg* mutants independent of senescence symptoms, SA production, and genetic backgrounds. In the *atg5/Col*, *atg5sid2/sid2*, and *atg5.NahG/NahG* comparisons, we found that the most robust fingerprint specific to the autophagy defect was shikimate accumulation in *atg5* mutants, which was observed regardless of genetic background and nitrate conditions (Supplemental Table 2; Figure 4). The other characteristics that were confirmed in five of the six comparisons performed were the significant accumulation of glutamate, pipicolate,  $\beta$ -sitosterol, and raffinose. The accumulation of other amino acids such as aspartate, methionine, and tryptophan were also significant in all the *atg5* backgrounds under low nitrate conditions. Measurement of the total amino acid concentration also confirmed their increase in the autophagy defective lines compared with their respective controls (Figure 4). As a result, we concluded that the increases in glutamate, pipicolate,  $\beta$ -sitosterol, raffinose, aspartate, and methionine are robust fingerprints of defects in autophagy.

#### Gene Ontology Analysis of Transcriptomic Data for *atg5* and *atg9* Relative to the Wild Type Highlights That the *atg* Mutants Are Hypersensitive to a Large Set of Stresses

Genes showing significant changes (based on false discovery rate [FDR] percentage values; see Methods) in expression between

(1) *atg5* or *atg9* mutants and the wild type grown under low nitrate conditions for 30 or 60 DAS, (2) the two *atg* mutants (*atg5* and *atg9*) and the wild type grown under low nitrate conditions for 30 or 60 DAS, and (3) *atg5* and the wild type grown under high nitrate for 60 DAS were identified. The full data sets are available online as supplemental Excel files (Supplemental Data Sets 3 to 9). The lists of genes that were significantly up- or downregulated in each condition, genotype, and harvest time are shown in Supplemental Data Sets 10 and 11. These lists were analyzed to determine intersections and Gene Ontologies (GOs) (Figure 5).

Eighty-six genes were significantly upregulated in both *atg5* and *atg9* under both low and high nitrate conditions at 30 and 60 DAS (Figure 5A; Supplemental Table 3 for more details). The frequency of the GO terms of these 86 upregulated genes shows that they are mainly involved in response to stimuli such as biotic stress (e.g., *PATHOGENESIS-RELATED GENE1 [PR1]*, *PLANT NATRIURETIC PEPTIDE-A*, *UPI* serine protease inhibitor, the transcription factor genes *WRKY38* and *WRKY18*, the resistance factor gene *HR4*, *ARABINOGALACTAN-PROTEIN5*, and the putative cytochrome 450 gene *CYP71B25*), chemicals and abiotic stresses (e.g., the transcription factor genes *ANAC061*, *ANAC036*, *MYB15*, *MYB2*, and *MC8*) and SA (e.g., *PHYTOALEXIN DEFICIENT3 [PAD3]*, *PAD4*, and the GH3 gene *PBS3*) (Supplemental Table 4). No genes were downregulated in both *atg5* and *atg9* and in all

**Table 1.** Anthocyanin, Quercetin, and Kampherol in the *atg5* Mutant Compared to the Wild Type

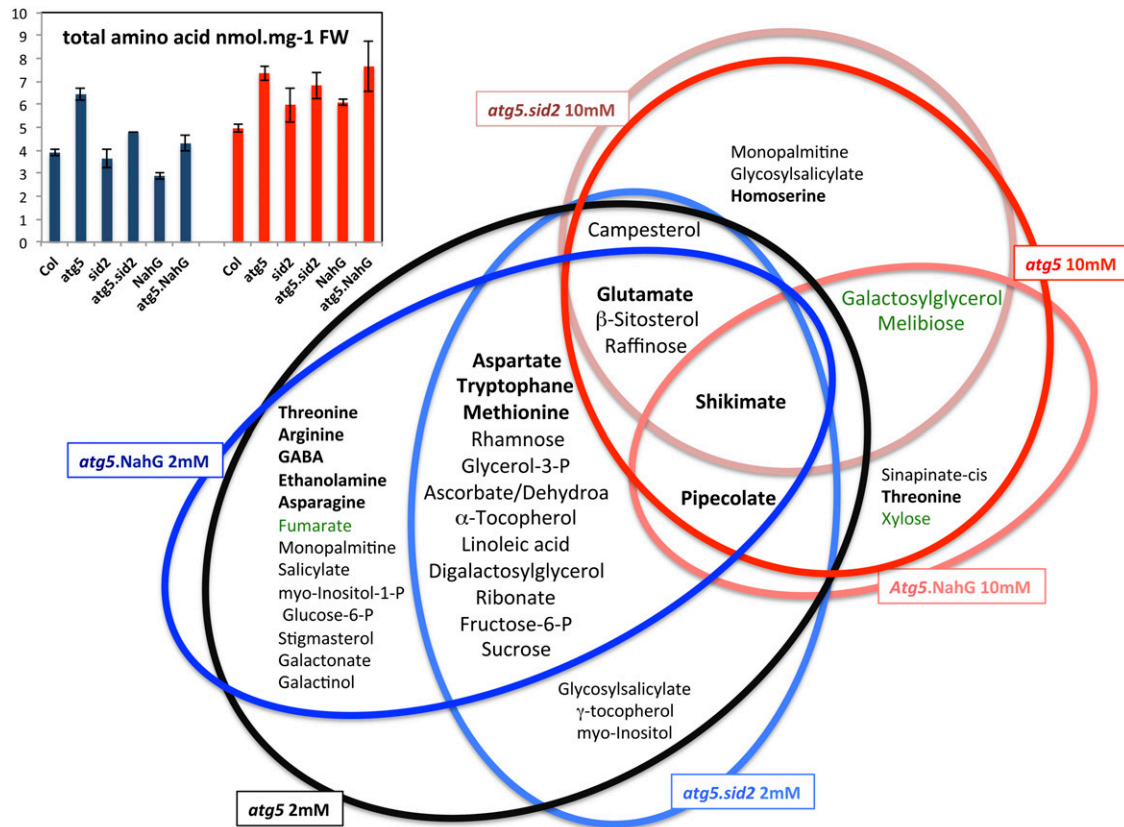
			30 DAS		60 DAS		75 DAS		
Low N 2 mM			<i>atg5</i>	Col	<i>atg5</i>	Col	<i>atg5</i>	Col	
ng · g <sup>-1</sup> FW	Cyanidin 3-O-[2''-O-(xylosyl)-6''... A974	Mean	47.1	221.2	<b>349.7</b>	<b>2373.2</b>	<b>7.9</b>	<b>253.5</b>	
		SD	80.9	282.7	275.1	327.4	17.8	158.7	
	Cyanidin 3-O-[2''-O-(2'''-O-(sinapoyl) ... A1182	Mean	194.4	266.1	<b>470.5</b>	<b>1642.8</b>	<b>25.5</b>	<b>255.3</b>	
		SD	181.1	153.4	170.8	191.0	42.7	62.2	
	Cyanidin 3-O-[2''-O-(xylosyl) 6''... A1136	Mean	0.0	0.0	<b>1309.2</b>	<b>5535.5</b>	<b>42.0</b>	<b>2498.0</b>	
		SD	0.0	0.0	233.4	651.5	73.4	922.1	
	Cyanidin 3-O-[2''-O-(6'''-O-(sinapoyl)... A1342	Mean	465.3	376.9	<b>3783.8</b>	<b>7878.6</b>	<b>714.7</b>	<b>3138.0</b>	
		SD	83.3	131.9	722.3	514.9	190.9	1109.8	
	Isomer Cyanidin 3-O-[2''-O-(6'''-... A1342 2	Mean	167.5	151.9	<b>933.6</b>	<b>2171.5</b>	<b>463.5</b>	<b>1151.7</b>	
		SD	99.9	117.0	93.8	108.7	77.7	316.9	
	Cyanidin 3-O-[2''-O-(2'''-O-(... A1256	Mean	33.1	36.8	<b>602.7</b>	<b>1288.5</b>	<b>136.5</b>	<b>659.3</b>	
		SD	22.2	29.3	81.4	114.2	28.6	258.0	
	μg · g <sup>-1</sup> FW	K-3,7-di-O-Rha	Mean	153.9	153.7	337.6	340.1	265.5	262.3
			SD	8.1	14.5	11.2	32.6	43.5	22.7
K-3-O-Glc-7-O-Rha		Mean	96.4	95.2	147.8	135.9	140.1	124.7	
		SD	6.5	9.9	12.8	22.1	26.5	19.1	
K-3-O-Rha(1-2)Glc-7-O-Rha		Mean	245.0	231.9	<b>694.5</b>	<b>574.6</b>	532.5	481.2	
		SD	36.6	38.5	84.2	62.4	109.4	52.0	
Q-3-O-Glc-7-O-Rha		Mean	4.1	5.1	<b>28.4</b>	<b>58.9</b>	<b>12.5</b>	<b>31.7</b>	
		SD	1.6	1.8	5.0	10.0	3.3	8.5	
Q-3-O-Rha(1-2)Glc-7-O-Rha		Mean	8.6	8.0	<b>52.3</b>	<b>90.1</b>	<b>16.9</b>	<b>46.9</b>	
		SD	1.8	2.2	5.6	8.4	7.5	13.6	
I-Glc-Rha		Mean	1.2	1.5	3.9	5.4	3.3	3.8	
		SD	0.9	1.4	1.0	1.5	0.9	0.6	
Q-3,7-di-O-Rha 60V		Mean	5.6	5.0	<b>15.5</b>	<b>41.6</b>	<b>6.5</b>	<b>21.4</b>	
		SD	0.6	0.8	2.8	7.6	2.3	7.4	

			30 DAS		60 DAS		75 DAS		
High N 10 mM			<i>atg5</i>	Col	<i>atg5</i>	Col	<i>atg5</i>	Col	
ng · g <sup>-1</sup> FW	Cyanidin 3-O-[2''-O-(xylosyl)-6''... A974	Mean	0.0	0.0	12.3	0.0	15.6	7.2	
		SD	0.0	0.0	21.3	0.0	27.0	12.4	
	Cyanidin 3-O-[2''-O-(2'''-O-(sinapoyl) ... A1182	Mean	136.6	274.5	<b>0.0</b>	<b>102.3</b>	0.0	0.0	
		SD	118.4	115.3	0.0	6.2	0.0	0.0	
	Cyanidin 3-O-[2''-O-(xylosyl) 6''... A1136	Mean	0.0	0.0	0.0	0.0	73.0	0.0	
		SD	0.0	0.0	0.0	0.0	126.5	0.0	
	Cyanidin 3-O-[2''-O-(6'''-O-(sinapoyl)... A1342	Mean	351.1	352.7	<b>90.1</b>	<b>368.8</b>	<b>77.4</b>	<b>609.9</b>	
		SD	52.4	118.6	41.2	105.8	134.1	200.7	
	Isomer Cyanidin 3-O-[2''-O-(6'''-... A1342 2	Mean	145.0	200.8	36.2	143.0	41.2	48.1	
		SD	6.0	92.2	62.7	46.5	71.3	83.3	
	Cyanidin 3-O-[2''-O-(2'''-O-(... A1256	Mean	32.0	35.8	12.8	51.2	0.0	0.0	
		SD	27.7	7.9	11.2	22.5	0.0	0.0	
	μg · g <sup>-1</sup> FW	K-3,7-di-O-Rha	Mean	179.3	168.8	199.8	194.4	150.3	198.3
			SD	6.6	18.2	1.5	21.4	34.3	31.3
K-3-O-Glc-7-O-Rha		Mean	107.5	100.2	119.4	116.8	82.7	109.4	
		SD	6.6	8.7	0.8	11.9	24.3	20.1	
K-3-O-Rha(1-2)Glc-7-O-Rha		Mean	262.1	271.0	266.1	295.2	203.0	238.7	
		SD	15.7	44.0	28.4	3.9	88.8	50.4	
Q-3-O-Glc-7-O-Rha		Mean	6.1	5.3	6.8	6.3	9.4	3.8	
		SD	0.6	0.4	0.4	0.4	2.1	4.6	
Q-3-O-Rha(1-2)Glc-7-O-Rha		Mean	10.7	8.7	8.7	11.7	6.0	10.8	
		SD	0.8	0.9	2.0	0.4	3.1	2.6	
I-Glc-Rha		Mean	1.1	2.1	2.4	1.6	0.9	0.0	
		SD	0.3	1.3	0.6	1.3	1.5	0.0	
Q-3,7-di-O-Rha 60V		Mean	<b>7.3</b>	<b>5.5</b>	5.2	6.6	2.9	4.9	
		SD	0.6	0.2	0.8	0.2	1.2	0.4	

Anthocyanin, quercetin, and kampherol concentrations (mean ± SE; *n* = 6 plants) in *atg5* and Col wild type grown under low (Low N 2 mM) and high (High N 10 mM) nitrate conditions for 30, 60, and 75 DAS. Significant differences between *atg5* and the wild type are indicated by bold and italic numbers. Three culture rounds were tested giving similar results. Complete names of cyanidin compounds can be found in Supplemental Table 1. Anthocyanin concentrations are in ng · g<sup>-1</sup> FW. Quercetin and kampherol concentrations are in μg · g<sup>-1</sup> FW. FW, fresh weight.





**Figure 4.** SA-Dependent and -Independent Metabolic Changes in *atg* Mutants.

Venn diagram representing the metabolites that increased or decreased in the rosettes of *atg5*, *atg5 sid2*, and *atg5 NahG* relative to Col, *sid2*, and NahG controls, respectively, grown under low nitrate or under high nitrate for 60 DAS. The histogram (top left) shows that total amino acid concentrations are significantly different (Student's *t* test \**P* < 0.05) in *atg5*, *atg5 sid2*, and *atg5 NahG* relative to Col, *sid2*, and NahG controls, respectively (mean and SD are shown; *n* = 3 plant replicates). [See online article for color version of this figure.]

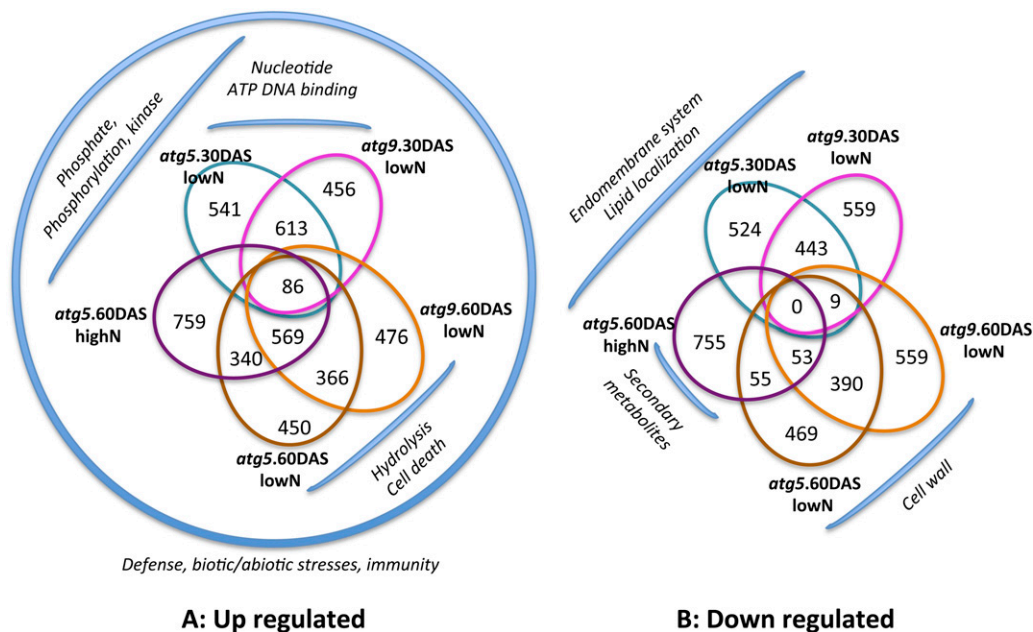
nitrate conditions and at all time points (Figure 5B). To facilitate GO term analysis of all the genes listed in Supplemental Data Sets 10 and 11, we considered the genes up- or downregulated separately in both *atg5* and *atg9* grown for (1) 30 DAS under low nitrate conditions or (2) 60 DAS under low nitrate conditions and in *atg5* grown for 60 DAS under high nitrate conditions (Supplemental Table 5). As shown in Supplemental Table 5, the most significant classes of genes upregulated in the mutants relative to the wild type were related to defense, biotic and abiotic stress responses, and immunity. Classes of GO terms related to phosphorus, such as phosphate/phosphorus metabolic processes, protein amino acid phosphorylation, phosphorylation and kinase activities, transferase activities transferring phosphorus, and posttranslational protein modifications, were also found in both *atg5* and *atg9* grown under low nitrate conditions for 30 DAS and in *atg5* grown under high nitrate conditions for 60 DAS. The few classes of genes upregulated in both *atg5* and *atg9* under low nitrate conditions at 60 DAS were related to hydrolysis (GO:0016798, GO:0004553, and GO:0016787), cell death (GO:0016265 and GO:0008219), and regulation of defense or response to stimulus (GO:0048583 and GO:0031347). Overrepresentation of hydrolase and cell death-related genes in *atg5* and *atg9* under low nitrate conditions at 60

DAS is consistent with the fact that under nitrate limitation, mutants present severe senescence symptoms that certainly involve hydrolysis processes linked to cell component degradation (Breeze et al., 2011). Indeed, protease activities are also much higher in the mutants than in the wild type (Guiboileau et al., 2013).

The number of genes significantly downregulated in *atg5* or *atg9* under the various conditions and at the different time points was quite similar to the number of genes upregulated under the same conditions. However, their intersections and the significance (FDR%) of their GO terms were much weaker (Figure 5B; Supplemental Table 6). The few GO term classes detected were also all different depending on time points and nitrate conditions. We can note that they are related to the endomembrane system, lipid localization, and cell wall and secondary metabolism (phenylpropanoid, flavonoid, and isoprenoid), which makes sense regarding our metabolome results.

**Transcript Profiles of *atg* Mutants Are Consistent with Metabolite Profiles and a Deficiency in Flavonoid Biosynthesis**

In order to relate the transcriptome data to our previous metabolite profiles, we specifically examined the expression of



**Figure 5.** The Number of Genes Up- or Downregulated in *atg* Mutants Relative to the Wild Type Fluctuates Depending on Nitrate Conditions and Plant Age.

Venn diagrams represent the number of genes upregulated (**A**) and downregulated (**B**) in *atg5* or *atg9* mutants grown under low (lowN) or high (highN) nitrate conditions for 30 or 60 DAS. The significantly up- or downregulated genes relative to the wild type (based on FDR% values; see Methods) were recorded (Supplemental Data Set 3 and 4) and analyzed using VirtualPlant1.3 (<http://virtualplant.bio.nyu.edu/cgi-bin/vpweb/>) and AGRIGO (<http://bioinfo.cau.edu.cn/agriGO/index.php>) bioinformatics tools to extract intersection lists for Venn diagrams and analyze GO classes. The most significant GO term classes found in the different lists are indicated by the brackets surrounding the Venn diagrams. [See online article for color version of this figure.]

genes related to the different metabolic pathways affected in *atg* mutant/RNAi lines.

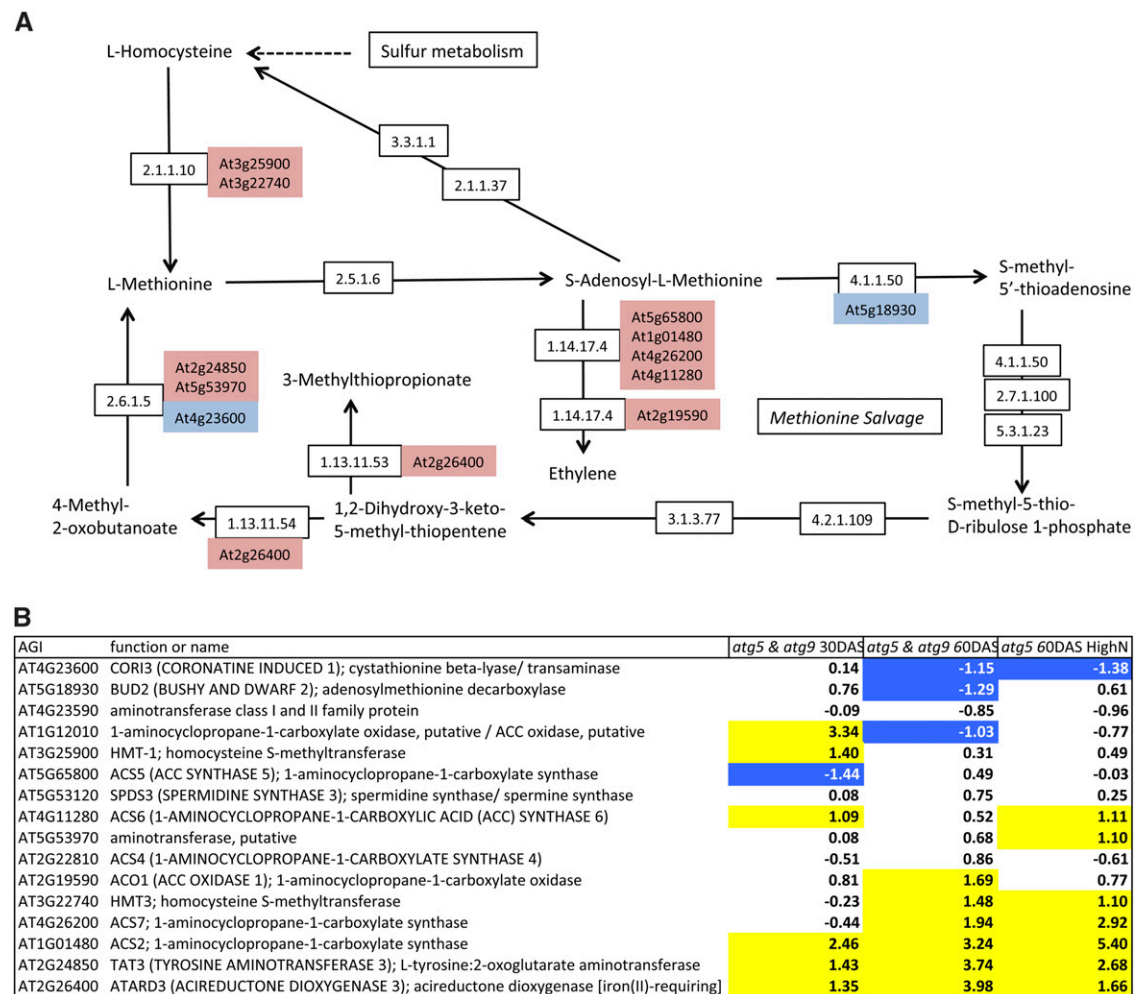
Since amino acid concentrations, especially glutamate, aspartate, and methionine, were shown to increase in the *atg* mutant/RNAi lines and in the SA-deficient *atg* mutants compared with the wild type, we first examined nitrogen and amino acid metabolism (Supplemental Table 7). Only a few genes involved in nitrate and ammonium assimilation and in glutamine, glutamate, aspartate, and asparagine metabolism were differentially expressed in *atg5* and *atg9*, suggesting that amino acid accumulation in the mutants is not regulated at the transcriptional level by modification of the expression of the corresponding biosynthetic enzymes. Indeed, the upregulation of genes involved in nitrogen metabolism, such as *GDH2* and *ASN1*, which are dark-induced genes, cannot explain the differences in amino acid composition, especially in the case of aspartate, asparagine, glutamate, and glutamine. In the case of methionine, which was significantly higher in all the autophagy-defective genotypes, examination of its biosynthesis pathway on KEGG (<http://www.genome.jp/kegg/pathway.html>) showed that expression of many genes involved in methionine synthesis and salvage pathways are significantly, and for some highly, upregulated (Figure 6). Thus, methionine metabolism and salvage pathways are certainly very active in the *atg* mutants. The link between methionine and ethylene also suggests that ethylene biosynthesis could be higher in the mutants, despite the fact that Yoshimoto et al. (2009) did not find any phenotype recovery in

the *atg5 ein2* double mutant. In addition to the methionine pathway, we observed that several genes involved in the glutathione pathway and encoding the glutathione *S*-transferase and  $\gamma$ -glutamyl transpeptidase were upregulated in the *atg* mutants. In good agreement with our metabolomic data, the active conversion of glutathione to glutamate suggested by these transcriptomic data might explain the higher concentrations of glutamate in the *atg* mutants (Figure 7). Although pipecolate accumulation was very high in the *atg* mutants compared with the wild type, the transcriptomic data did not reveal any significant difference in the expression levels of the few genes known in *Arabidopsis* to be involved in lysine or branched-chain amino acid catabolism.

Regarding other metabolites, such as some phytosterols and galacturonate, the transcriptome data showed that upregulation of the genes involved in their biosynthesis was reliably well correlated with the increase in their concentrations in the *atg* mutants (Supplemental Figures 2 and 3). Similarly, the increase in raffinose in the mutants was consistently well correlated with the upregulation of its biosynthetic genes *DARK INDUCIBLE10* and *RAFFINOSE SYNTHASE2*.

Among the other compounds found to overaccumulate in *atg* mutants, shikimate is a building block for many secondary metabolites, such as phenolics, anthocyanin, and SA. Each of these pathways could thus influence shikimate accumulation or depletion. When each was examined, we only found differences





**Figure 6.** Genes Involved in the Methionine Pathway Are Upregulated in *atg5* and *atg9*.

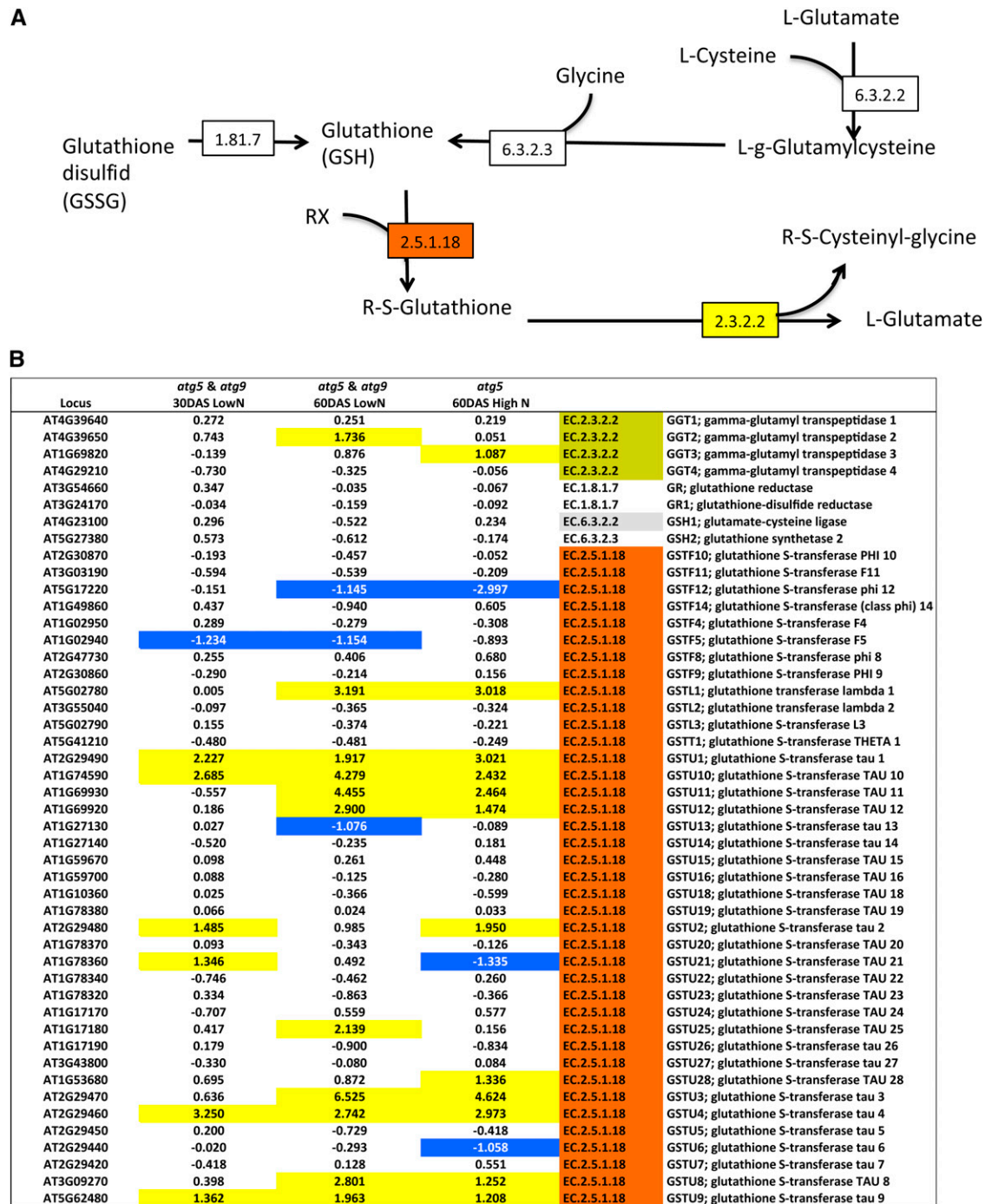
The L-methionine pathway was adapted from the KEGG methionine pathway (A) available online (<http://www.genome.jp/kegg/pathway.html>). Several genes identified on KEGG as encoding enzymes connected to methionine biosynthesis and methionine salvage pathways and ethylene biosynthesis are upregulated (pink box) or downregulated (blue box) in *atg5* and *atg9* relative to the wild type as shown in (B). Relative expression is presented as the  $\log_2$ (fold change). Significant up- or downregulation ( $FDR\% < 10^{-5}$ ) is indicated by yellow- or blue-colored cells, respectively.

between the *atg* mutants and the wild type for the genes involved in the anthocyanin pathway. Different levels of anthocyanin and quercetin (Table 1, Figure 8, Boxes 3 and 4) were observed in the *atg* mutants relative to the wild type as previously reported by Pourcel et al. (2010). In their report, the authors suggested that autophagy is needed for trafficking and loading anthocyanin in the vacuole, and this conclusion was further reported in a review (Floyd et al., 2012). When expression of genes involved in phenylpropanoid pathways (KEGG and Lillo et al., 2008) was examined, we found that only a few genes involved in the shikimate pathway (e.g., the alanine glyoxylate aminotransferase gene *AGT3*) are upregulated in *atg5* and *atg9* (Supplemental Table 8). In contrast, many genes involved in the biosynthetic and regulatory flavonoid pathway, among which the master regulatory genes *PRODUCTION OF ANTHOCYANIN PIGMENT 1 PAP1*, *PRODUCTION OF ANTHOCYANIN PIGMENT 2 PAP2* and *TRANSPARENT TESTA 8 TT8* and the key enzymes *CHALCONE SYNTHASE CHS*, *LEUCOANTHOCYANIDIN*

*DIOXYGENASE LDOX*, *DIHYDROFLAVONOL 4-REDUCTASE DFR* and *FLAVANONE 3-HYDROXYLASE F3'H*, were significantly downregulated in both *atg5* (Supplemental Table 8) and *atg9* (Supplemental Data Set 11) grown under low or high nitrate conditions at 60 DAS. Quantitative real-time PCR confirmed this downregulation of the major regulatory (*PAP1* and *TT8*) and biosynthetic (*CHS*, *DFR*, *F3'H*, and *LDOX*) genes (2- to 5-fold in *atg9* and *atg5*, respectively) (Figure 8, Box 2).

#### Inhibition of Flavonoid Biosynthetic and Regulatory Pathways Reduces Anthocyanin Accumulation in *atg* Mutants

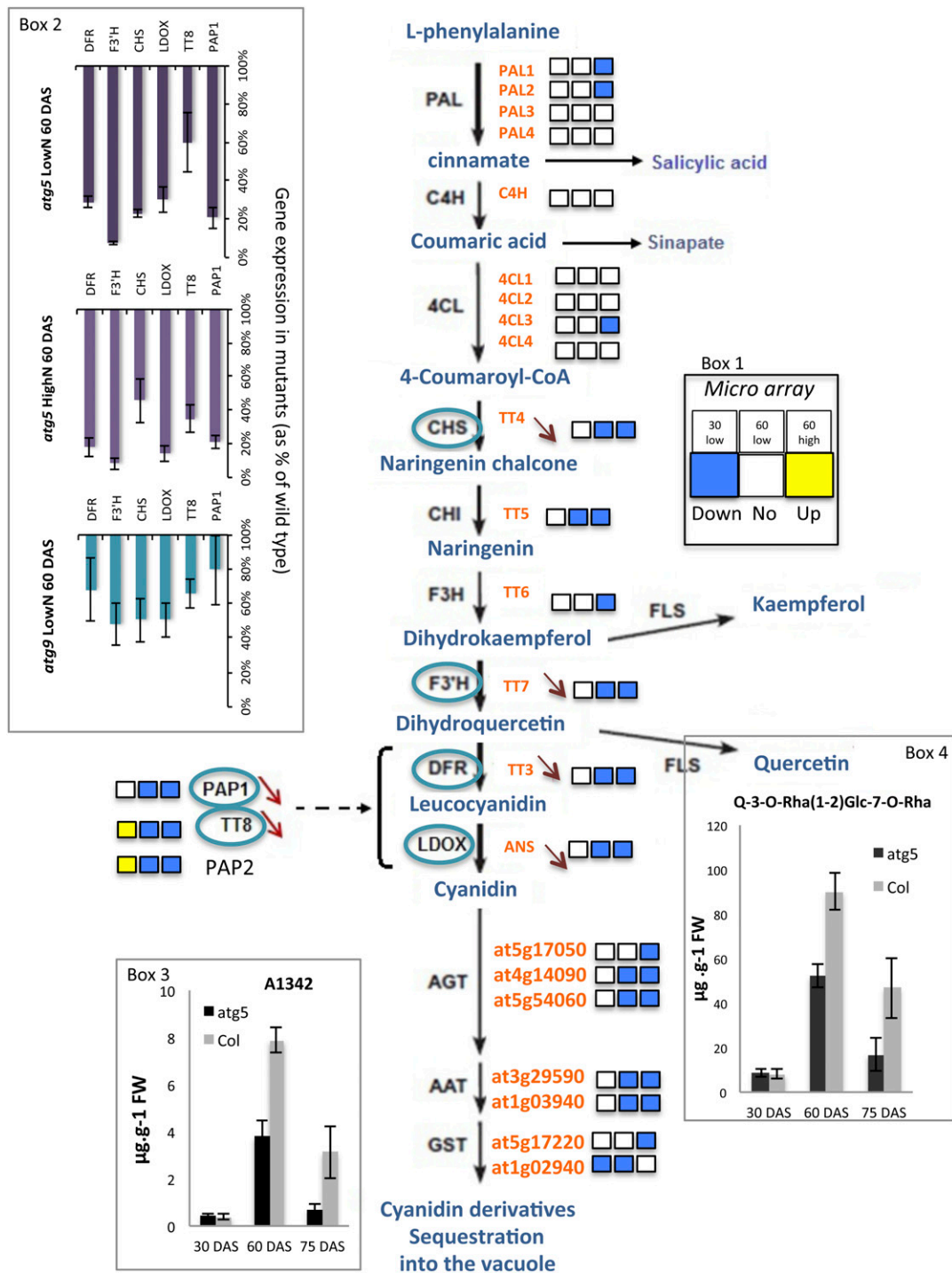
Although Pourcel et al. (2010) suggested that autophagy participates in trafficking and loading anthocyanin in the vacuole for storage, our transcriptomic data suggest that anthocyanin levels are down in *atg* mutants due to the suppression of their biosynthesis



**Figure 7.** The Glutathione-to-Glutamate Conversion Pathway Is Upregulated in *atg5* and *atg9* Mutants.

The glutathione-to-glutamate pathway was adapted from the KEGG glutathione metabolism pathway (A) available online (<http://www.genome.jp/kegg/pathway.html>). Many genes identified on KEGG as encoding the glutathione S-transferase (EC.2.5.1.18) and  $\gamma$ -glutamyl-transpeptidase (EC.2.3.2.2) are upregulated in *atg5* and *atg9* relative to the wild type as shown in (B). Relative gene expression in *atg5* and *atg9* compared with the wild type is presented as the  $\log_2$ (fold change). Significant up- or downregulation (FDR%  $<10^{-5}$ ) is indicated by yellow-colored (light) and blue-colored (dark) cells, respectively.

[See online article for color version of this figure.]



**Figure 8.** Genes Involved in the Flavonoid Biosynthesis and Regulatory Pathways Are Downregulated in *atg5*.

A diagram of the flavonoid pathway was adapted from Lillo et al. (2008). The steps are catalyzed by phenylalanine ammonia lyase (PAL), cinnamate 4-hydroxylase (C4H), 4-coumarate-CoA ligase (4CL), chalcone synthase (CHS), chalcone isomerase (CHI), flavanone 3-hydroxylase (F3H), flavonoid 3'-hydroxylase (F3'H), flavonol synthase (FLS), dihydroflavonol 4-reductase (DFR), anthocyanidin synthase (ANS or LDOX), anthocyanin glycosyltransferase (AGT), anthocyanin acyl transferase (AAT), and glutathione S-transferase (GST). PAP1, TT8, and PAP2, the main regulators of DFR and LDOX steps, are also shown. Genes encoding all the enzymes involved in the flavonoid pathway are in green typeface. Microarray data (Box 1) are presented as three squares for the relative gene expressions in *atg5* grown under low nitrate for 30 d (first square), under low nitrate for 60 d (second square), and under high nitrate for 60 d (third square). Square colors in yellow, white, or blue indicate significant upregulation in *atg5*, no difference

through downregulation of the master genes of the pathways. To verify this hypothesis, *atg5* was crossed with the bright purple production of anthocyanin pigment 1-dominant (*pap1-D*) line in which the *PAP1* gene is overexpressed (Borevitz et al., 2000). A double mutant was obtained (Supplemental Figure 4), and the red phenotype was recorded visually and by measuring the total anthocyanin concentration with a spectrometer. Interestingly, the double *atg5 pap1-D* plants grown in vitro turned red very soon after sowing like the *pap1-D* single mutant (Figures 9A and 9B); they were slightly bigger than *atg5* but smaller than *pap1-D*. Measurement of absorbance at 525 nm of acidic methanolic extracts confirmed that *atg5 pap1-D* were accumulating more anthocyanin than the wild type and *atg5*, although slightly less than *pap1-D* (Figure 9C). The fact that in *atg* mutants both *PAP2* and *TT8* are downregulated in addition to *PAP1* might explain why the *pap1-D* dominant allele introduced in *atg5* did not fully restore anthocyanin production to the same level as measured in the *pap1-D* single mutant. Observations of seedling roots (Figure 9D) showed that in *atg5 pap1-D*, large amounts of anthocyanin accumulate in the vacuoles and are more concentrated in some intense red subvacuolar inclusions, described as anthocyanic vacuolar inclusions (AVIs) by Poustka et al. (2007) and Pourcel et al. (2010) (Figure 9). It seems then that the main reason why autophagy mutants do not accumulate anthocyanin is the downregulation of the anthocyanin biosynthesis pathway. As anthocyanins are antioxidants that could be involved in the early senescence phenotype of *atg* mutants, we compared *atg* mutants and wild-type phenotypes in order to determine whether the recovery of anthocyanin biosynthetic capacity has effects on other autophagy mutant phenotypes. We found that the phenotypes of *atg5 pap1-D* and *pap1-D* were very similar when grown under low or high nitrate conditions, even though *atg5 pap1-D* rosettes were slightly smaller than *pap1-D* (Figures 10A and 10B). The *atg5 pap1-D* rosettes were significantly bigger than the *atg5* rosettes. However, both *atg5 pap1-D* and *atg5* plants senesced earlier than the wild type and *pap1-D* (Figure 10C). Rosette biomass of *atg5* was partially recovered by *PAP1* overexpression, but their early senescence phenotype did not change.

### Transcript Profiling of *atg* Mutants Confirmed Hormonal Deregulation and Stress Response

As described previously, we found that autophagy mutants are early senescing and accumulate SA. Consistent with that, we also found that the SA biosynthetic genes are upregulated in *atg5* (Supplemental Figure 5). Early senescence of *atg* mutants, observed as early yellowing symptoms, was positively correlated with upregulation of several senescence-associated genes, such as *SAG12*, *SAG13*, *SAG21*, *SRG1*, and *SRG3* (Supplemental Table 9). However, while the differential expression of SAGs in

the *atg* mutants compared with the wild type was significant from 30 DAS, surprisingly, the fold changes did not increase with age (Supplemental Table 9). In addition, the expression of many known senescence-related genes was not different in the *atg* mutants relative to the wild type. This suggests that the early leaf senescence of *atg* mutants is not typical developmental senescence but appears to be related to other stresses, possibly excess SA production.

To confirm that autophagy mutants were suffering from stress and that stress hormone signaling pathways are affected, the relative expression of marker genes responding to pathogens, SA, jasmonic acid (JA), and ethylene was examined (Figure 11A). Many of the SA-related genes involved in the SA signaling pathway (*ENHANCED DISEASE SUSCEPTIBILITY1*, *PAD4*, *SALICYLIC ACID INDUCTION DEFICIENT2*, and *NONEXPRESSER OF PR GENES [NPR1-4]*) or in SA responses (*PR1* and *PR2*) were upregulated in *atg5* and *atg9* relative to the wild type (Figure 11B; Supplemental Table 10). Consistent with Yoshimoto et al. (2009), who did not detect any difference in JA contents between *atg* mutants and the wild type, very few genes involved in the JA signaling pathway (like *ETHYLENE RESPONSE FACTOR2*) or responding to JA (like *PLANT DEFENSIN 1.2*) were differentially expressed in *atg5* and *atg9* mutants compared with the wild type. The very few ethylene signaling related genes (e.g., *ETHYLENE RESPONSE2* and *CONSTITUTIVE TRIPLE RESPONSE1*) that were upregulated in *atg5* and *atg9* at 30 DAS could suggest that ethylene is overproduced in the *atg* mutants, at least in young rosettes (Figure 11B). However, the differential expression of ethylene-related genes was only observed at 30 DAS but not at 60 and 75 DAS. Accordingly, many WRKY transcription factors known to be involved in stress responses and response to pathogen attack were also upregulated in *atg5* and *atg9* relative to the wild type (Supplemental Table 11). Some of these, but not all, are also related to developmental leaf senescence (Breeze et al., 2011). In addition to WRKY, several NAC transcription factors were also upregulated in *atg5* and *atg9*, among which some are SA or senescence related (Supplemental Table 12). However, the ANAC055 gene described recently as a master negative regulator of SA biosynthesis (Hickman et al., 2013) was highly upregulated in *atg5* and *atg9*, compared with *ANAC019*, which is a positive regulator of SA biosynthesis. This suggests that the defects in the regulation of the SA pathway are downstream of the *ANAC055* regulation node.

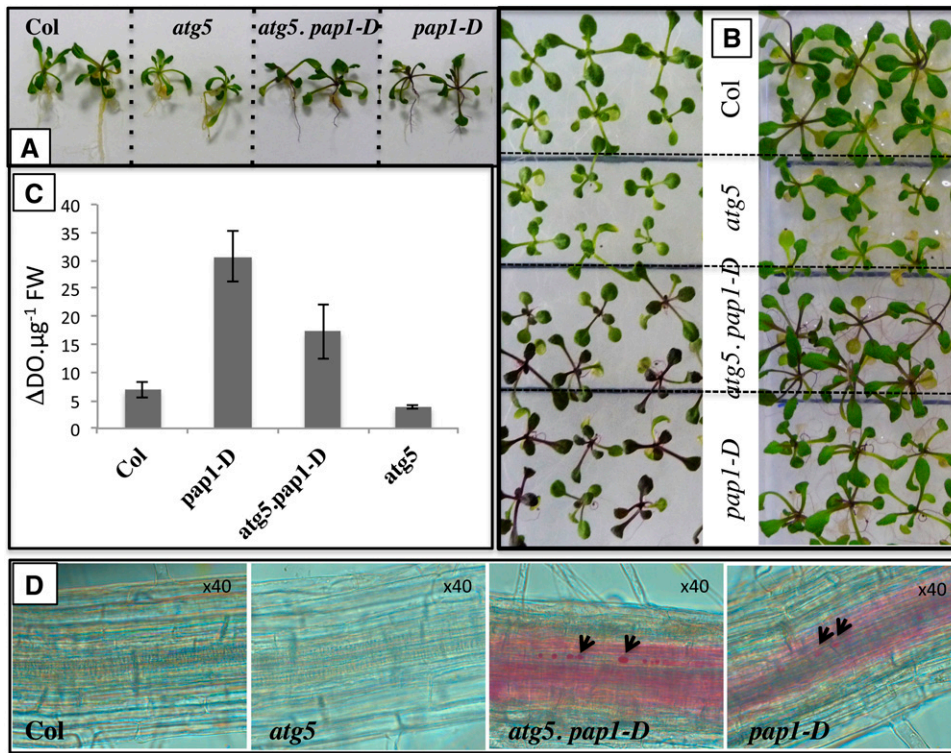
### Comparison of Transcriptome Profiles

The transcriptome profiles of the 100 genes showing the highest overexpression levels in the *atg5* and *atg9* mutants relative to the wild type, under low nitrate at 60 DAS, were compared using the Genevestigator analysis tools (<https://www.genevestigator.com/gv/>).

**Figure 8.** (continued).

between *atg5* and the wild type, or downregulation in *atg5*, respectively. Real-time quantitative RT-PCR performed on transcripts of *atg5* and *atg9* confirmed downregulation (red arrows) of the genes surrounded in blue and histograms (Box 2; mean and *sd* are shown on three plant replicates; two technical replicates showed similar results) of the relative gene expressions are presented in the top left box. The decreases observed in quercetin and anthocyanin compounds are illustrated by the representation of the histograms of A1342 and Q-3-Rha(1-2)Glc7-O-Rha concentrations in *atg5* (black bars) and the wild type (gray bars) (Boxes 3 and 4, respectively; mean and *sd* are shown; *n* = 3 plant replicates).





**Figure 9.** Overexpression of *PAP1* in *atg5* Enhanced Anthocyanin Accumulation and the Production of AVIs.

(A) and (B) The *pap1-D* dominant allele, introduced in the *atg5* mutant, confers red phenotype to *atg5 pap1-D* similar to that of *pap1-D* single mutant. (C) Anthocyanin concentration is increased in *atg5 pap1-D* compared with *atg5* (mean and *SD* are shown; *n* = 4). (D) Anthocyanin accumulation and AVI (arrows) can be observed in the roots of *atg5 pap1-D* and *pap1-D* but not in the roots of *atg5* and the wild type.

Figure 12 summarizes the most significant profile similarities found in other mutants. It was not a surprise to find that mutants affected in plant immunity and systemic acquired resistance, such as *cpr5*, *mkk1/mkk2*, *nudt7-1*, *pvip1 pvip2*, and *mpk4*, showed similar patterns to the *atg* mutants. In contrast, we observed that the top genes upregulated in the *atg* mutants were downregulated in the *pad4* and *npr1* mutants and affected in plant immunity and SA signaling. Similarities with the *CAT2HP* lines (mutated in the catalase 2 gene) confirmed that *atg* mutants are defective at detoxifying ROS, as described by Yoshimoto et al. (2009).

The *atg* expression profiles were also similar to those of the *ARR2* overexpressor and *qhk2 ahk3 ahk4* triple mutants. In contrast, genes that were upregulated in the *atg* mutants were downregulated in the *arr1 arr10 arr12* triple mutants, suggesting defects in the perception and response of *atg* mutants to cytokinins.

## DISCUSSION

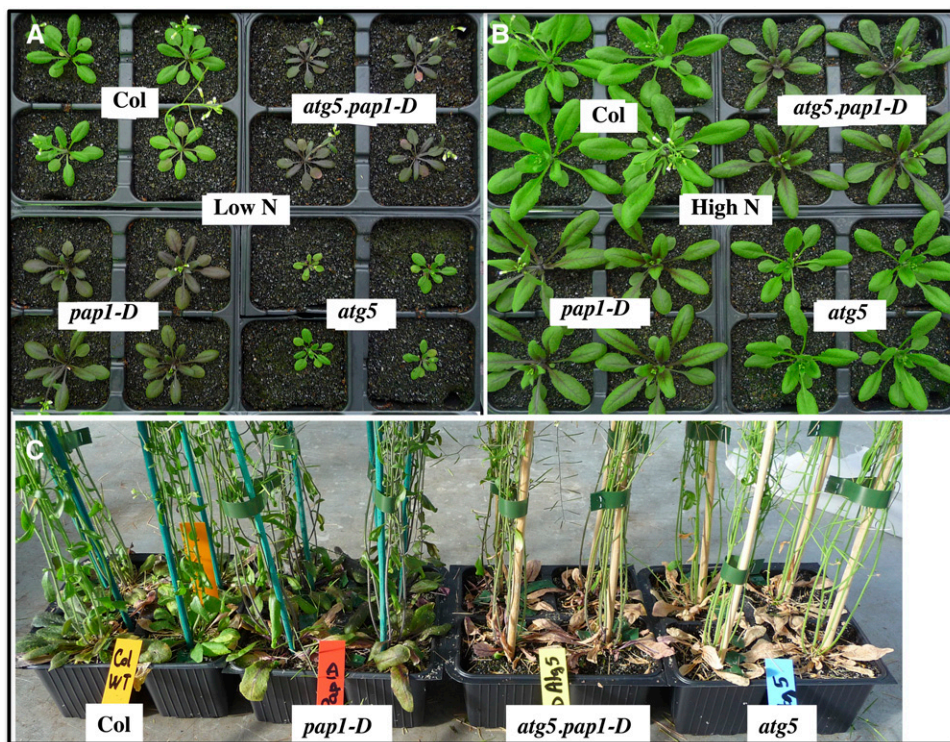
### Why Do Autophagy Mutants Accumulate Amino Acids?

We previously reported that *atg* mutants accumulate many forms of nitrogen in their rosette leaves (soluble proteins, peptides, ammonium, and amino acids, but not nitrate) and have depleted carbon in the form of hexose, sucrose, and starch (Guiboileau et al., 2013).

This report confirmed that amino acids accumulate in *atg* rosettes, especially when grown under low nitrate conditions. The accumulation of glutamate was detected early, as soon as 30 DAS, when no yellowing phenotype can be observed. The accumulation of glutamate, which was confirmed at 60 and 75 DAS, was also found in the SA-deficient backgrounds, thus showing that glutamate accumulation in *atg* mutants was senescence independent. In addition to increased glutamate levels, the other most striking metabolomic differences found between *atg* mutants and the wild type, such as the accumulation of shikimate, aspartate, piperolate, and methionine, were also found in the SA-deficient backgrounds.

An accumulation of glutamate and aspartate, while the glutamine, asparagine,  $\gamma$ -aminobutyric acid, and proline concentrations are maintained, is not an usual feature in plants. Glutamate is usually considered as a highly buffered metabolite (Scheible et al., 2000), while glutamine, proline, or  $\gamma$ -aminobutyric acid concentrations are more flexible. Glutamate and aspartate accumulation in the *atg* mutants suggests that asparagine synthetase and glutamine synthetase, which is known to be very efficient for ammonium assimilation (Masclaux-Daubresse et al., 2006), were the bottleneck of amino acid conversion in *atg* mutants. However, our transcriptomics data did not reveal downregulation of asparagine synthetase or glutamine synthetase (GS) transcript levels. No upregulation of any aspartate amino transferase or glutamate oxoglutarate amino transferase (GOGAT) transcripts was found





**Figure 10.** The Overexpression of *PAP1* in *atg5* Confers Red Phenotype but Does Not Modify Early Senescence Phenotype.

**(A)** Comparison of redness between *atg5*, *atg5 pap1-D*, *pap1-D*, and wild-type plants grown under low nitrate conditions and long days.

**(B)** Comparison of redness between *atg5*, *atg5 pap1-D*, *pap1-D*, and wild-type plants grown under high nitrate conditions and long days.

**(C)** Comparison of leaf senescence in *atg5*, *atg5 pap1-D*, *pap1-D*, and wild-type plants grown under high nitrate conditions and long days.

either. In addition, previously, we did not find any difference between the wild type and *atg* mutant GS activities (Guiboileau et al., 2013). Therefore, the accumulation of glutamate and aspartate does not appear to be due to changes in GOGAT, GS, asparagine synthetase, or aspartate amino transferase expression levels or activities.

Amino acid biosynthesis occurs in both mesophyll and phloem cells. Thus, amino acids could accumulate in *atg* mutants due to some defects in phloem uploading or cell-to-cell amino acid translocation. In *atg* mutants, GS1 activity in the veins was previously found to be higher than that of GS2 (see Guiboileau et al., 2013). The GOGAT isoenzymes, especially the ferredoxin-GOGAT, are preferentially located in the chloroplasts of mesophyll cells; the translocation of glutamate or aspartate from the mesophyll to the veins could be a bottleneck in amino acid export. However, at present, this hypothesis is not supported by any evidence and no genes encoding amino acid or peptide transporters were downregulated.

The increase in shikimate, glutamate, methionine, piperolate, and glutathione levels in the *atg* mutants strongly suggests that the major metabolic changes could be linked to oxidative stress management. Glutamate, methionine, and cysteine are essential for glutathione GSH and GSSG synthesis. The upregulation of several glutathione S-transferase genes suggests that the conversion of glutathione GSH to R-S-glutathione and further to glutamate is very active in the *atg* mutants. In addition, shikimate, which is strongly dependent on amino acid metabolism for its

biosynthesis, is the entry to the phenylpropanoid pathway that synthesizes many antioxidative compounds. Altogether, the metabolome data suggest that in *atg* mutants, amino acid interconversion metabolism is focused on the regulation of oxidative stress through the management of methionine, glutamate, glutathione, and shikimate pathways. This would disturb the global nitrogen fluxes in the amino acid metabolic pathways and could explain the changes to individual amino acid concentrations in the *atg* mutants.

#### Why Do Autophagy Mutants Accumulate Less Anthocyanin?

The finding that the rosettes of autophagy mutants and RNAi lines do not turn red and contain less anthocyanin and quercetin than the wild type is consistent with Pourcel et al. (2010). However, while their reports concluded that autophagy machinery participates in the formation of AVIs and is important for the trafficking of anthocyanin to the vacuole, our data show that *atg* mutants do not contain as much anthocyanin and quercetin as the wild type due to the downregulation of the flavonoid biosynthetic pathway. The presence of AVI-like structures in the roots of *atg5 pap1-D* double mutants shows that anthocyanin trafficking to the vacuole is as efficient in *atg5* mutant as in the wild type. If autophagy machinery also plays a role in the trafficking of anthocyanin to the vacuole, our results show that this role is not as essential as Pourcel et al. (2010) suggested. From the *atg5* and *atg9* transcriptomes, it was clear that the downregulation

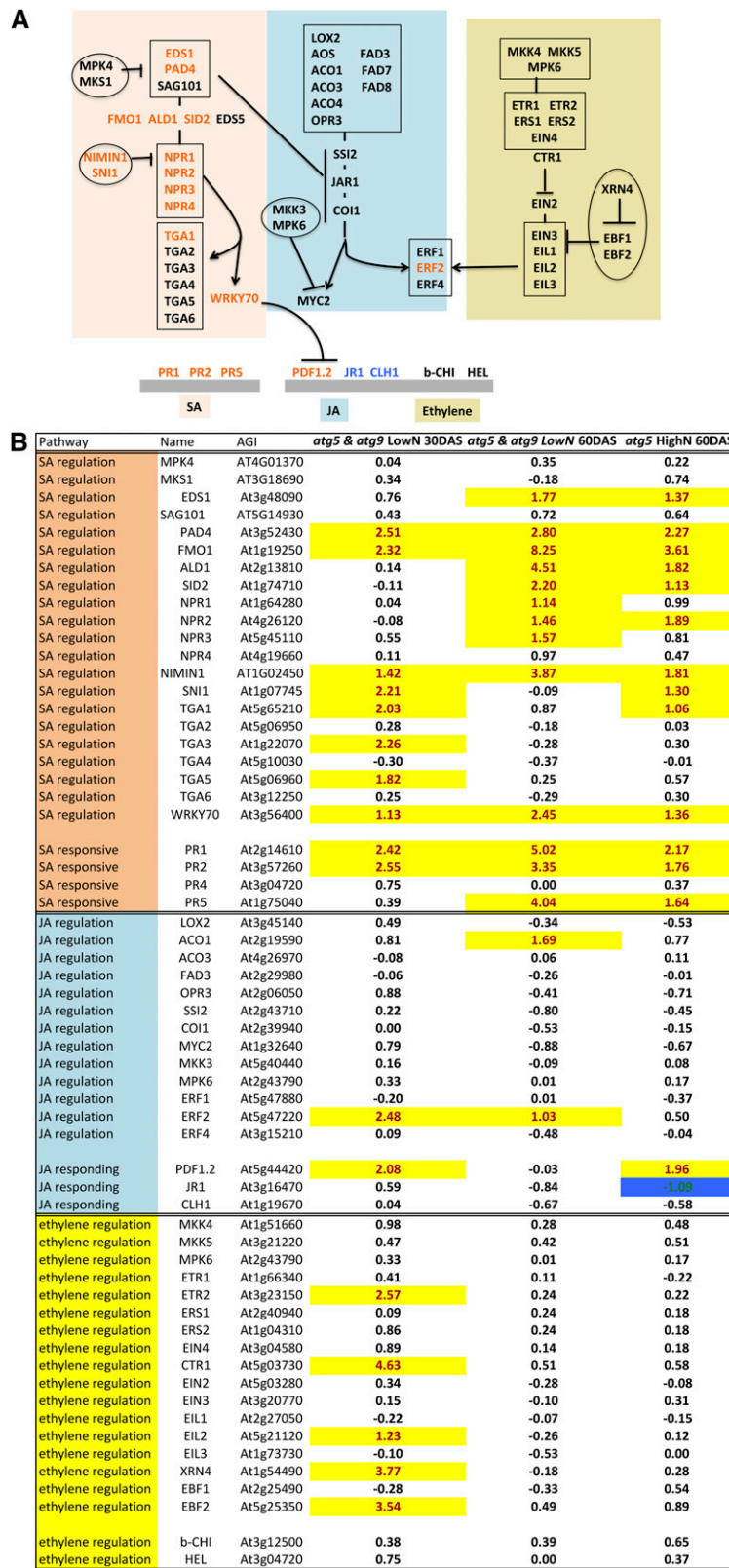
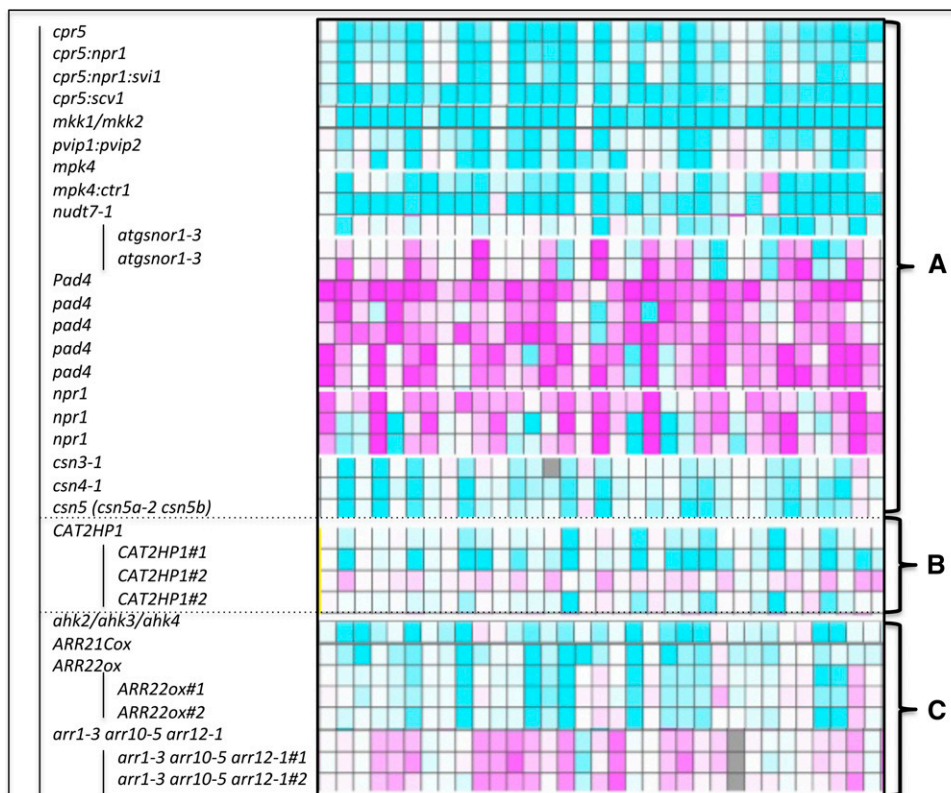


Figure 11. SA Signaling Pathway Is Upregulated in *atg5* and *atg9*.



**Figure 12.** Transcriptome Profile Comparisons.

Genes upregulated in *atg5* and *atg9* shows similarities with mutants affected in plant immunity (A), oxidative stress (B), and cytokinin signaling (C). Using the 100 genes most upregulated in *atg5* and *atg9*, transcriptome comparison was performed using the Geneinvestigator Perturbation tool that displays the response of genes to a wide variety of genotypes. Each vertical line displays the expression data for one gene. Each horizontal line displays gene relative expressions in the genetic background indicated. Blue and pink indicate up- and downregulation, respectively. Intensity of the colors is proportional to the absolute values of the fold changes. Only representative similarities/differences are shown, and only few gene patterns are shown (pattern was similar for the 100 genes).

of the flavonoid pathway was due to lower expression of *PAP1*, *PAP2*, and *TT8*. However, it is not clear why these regulatory genes show lower expression in the *atg* mutants relative to the wild type. Despite this, the overexpression of the UV-inducible gene *MC8* in *atg5* and *atg9* suggests that the *atg* mutants are more sensitive to UV, and this could be linked to their lower flavonoid content (He et al., 2008; Nawkar et al. 2013).

#### Why Do Autophagy Mutants Senesce Earlier?

Flavonoids are antioxidants that can inhibit ROS generation. Their decreased levels in *atg* mutant/RNAi lines could explain the higher ROS concentrations previously reported in these plants (Yoshimoto et al., 2009; Agati et al., 2012) and the higher

ascorbate/dehydroascorbate contents found in the current metabolome data. Interestingly, we found that the *atg5 pap1-D* double mutants have bigger rosettes than *atg5* mutants under all growth conditions. However, this positive effect of anthocyanin production in *atg* mutants was not sufficient to delay their early leaf senescence symptoms (Figures 3 and 8). Agati et al. (2012) suggested that quercetins are especially important for protecting chloroplasts from the light-induced generation of singlet oxygen. Thus, decreased quercetin could affect chloroplast protection in *atg* mutants.

All these defects promoting oxidative stress could be triggering factors for SA biosynthesis; SA production is linked with the appearance of leaf yellowing in *atg* mutants, as shown by Yoshimoto et al. (2009). Our transcriptome and metabolome

**Figure 11.** (continued).

(A) The model of interaction of the key genes involved in SA (orange), JA (blue), and ethylene (yellow) was adapted from Ascencio-Ibáñez et al. (2008). Genes up- or downregulated in *atg5* and *atg9* are in orange or blue typefaces, respectively.

(B) Genes involved in SA, JA, or ethylene regulation and response are listed. Their relative expressions in *atg5* compared with the wild type are reported as  $\log_2$ (fold change) values. Significant up- or downregulations ( $FDR\% < 10^{-5}$ ) are indicated by yellow- or blue-colored cells, respectively.



data confirmed the upregulation of SA biosynthesis and SA accumulation in *atg* mutants, especially under low nitrate conditions. SA induction could involve signals related to hypersensitivity to stress and ROS management. In addition, as SA is synthesized within the chloroplast during ageing, it is possible that its synthesis is accelerated and higher in the *atg* mutants compared with the wild type due to some defects in chloroplast quality control and oxidative stress management.

### Why Do Autophagy Mutants Overexpress Defense Genes?

Autophagy mutants display stress-related phenotypes, such as the accumulation of raffinose and pipecolate (Nishizawa et al., 2008; Návarová et al., 2012), and the top list of genes upregulated in *atg5* exhibited clear similarities with upregulated genes found in *cpr5*, *mkk1/mkk2*, and *mpk4* transcriptomes. As in these mutants, we observed cell death spots on the leaves of *atg* mutants (Supplemental Figure 6; Phillips et al., 2008) and defense genes were also highly upregulated in *atg5* (Jing et al., 2008; Jing and Dijkwel, 2008; Kong et al., 2012). The common feature of *atg* mutants and *cpr5*, *mkk1/mkk2*, and *mpk4* mutants is the increase in SA and the overexpression of plant defense and SA-related genes. This also explains why the *atg* expression pattern is the opposite of that found in *pad4* and *npr1* mutants. Oxidative stress is an appropriate background for hyper-reactive responses to stress and SA accumulation. The similarity between the upregulated genes in *atg5* and *cat2* mutants is also consistent with the hypothesis that *atg* mutants are suffering from oxidative stress (Mhamdi et al., 2012).

There is not much known about the relationship between autophagy and the proteasome in plants. Interestingly, comparison of the upregulated genes in the *atg* mutants also showed similarities with genes upregulated in the COP9 (*csn3*, *csn4*, and *csn5*) mutants. Besides the fact that immunity and SA responses are affected in *csn3*, *csn4*, and *csn5* mutants, the COP9/signalosome (CSN) complex modulates protein degradation in eukaryotes by regulating the ubiquitin-proteasome system. It was shown in mice that the COP9 signalosome regulates autophagosome maturation (Su et al., 2011). The authors observed the accumulation of immature autophagosomes in *csn8* mouse cardiomyocytes. In plants, COP9 controls cell cycle progression, plant development, and JA- and SA-mediated defense against biotic stress (Schwechheimer and Isono, 2010; Stratmann and Gusmaroli, 2012). The CSN subunits 4, 5, and 8 interact physically with NPR1, and the loss of CSN8 function (*cop9* mutants) results in the stabilization of NPR1 and then in hypersensitivity to SA (Spoel et al., 2009). As a result, *PR* genes are strongly upregulated in the COP9 *Arabidopsis* mutants even though the mutants do not significantly accumulate SA. Although there is no evidence so far that COP9 is involved in the maturation of autophagosome in plants, the similarity between *csn* and *atg* mutants at the transcriptional level and in their response to SA is interesting.

### Are Other Plant Hormone Pathways Affected in Autophagy Mutants?

Overexpression of *ATG8* (*GFP-ATG8f-HA*) resulted in several cytokinin-dependent phenotypes (Slavikova et al., 2008). The *GFP-ATG8f-HA* plants showed defects in root growth and anthocyanin biosynthesis when zeatin was applied to roots. Upon zeatin

treatment, the GFP signal relocated from autophagosome structures to novel and bigger structures located at the vicinity of the vascular system. Although a link between *ATG8* overexpression and autophagy activity has not been established, Slavikova et al. (2008) suggested a link between autophagy and cytokinin signaling. Our transcriptome analysis found that genes upregulated in *atg5* are also upregulated in the *ahk2 ahk3 ahk4* triple mutant and downregulated in the *arr1 arr10 arr12* triple mutant treated with 6-benzyl aminopurine. In addition, the *MYB DOMAIN PROTEIN2* (*MYB2*) regulator, which is significantly upregulated in both *atg5* and *atg9* under low and high nitrate conditions regardless of the plant age, has been reported to regulate whole-plant senescence by inhibiting cytokinin-mediated branching (Guo and Gan, 2011). Thus, overall, it is likely that autophagy plays a role in cytokinin signal perception.

### Conclusion

Changes in primary and secondary metabolites confirmed the increase in amino acid concentrations and the decrease in hexose concentrations previously described for *atg* mutants by Guiboileau et al. (2013). These metabolite defects are consistent with defects in nitrogen remobilization (Guiboileau et al., 2012) and hypersensitivity to nutrient deficiency. Among the amino acid changes, we found that glutamate, methionine, shikimate, and pipecolate are invariably and significantly increased in *atg* mutants. The only explanation for glutamate accumulation emerging from this work is related to the increased level of transcripts encoding enzymes involved in the glutathione-to-glutamate interconversion pathway. Altogether, the results suggest a strong link between amino acid metabolism and oxidative stress management in *atg* mutants, which is consistent with their global phenotype as well as with the increase in stress markers, such as raffinose, galacturonate, phytol, pipecolate, and stigmaterols (Griebel and Zeier, 2010; Návarová et al., 2012; Wang et al., 2012; Watanabe et al., 2013). Our transcriptomic data consistently showed that many genes related to plant defense against biotic and abiotic stresses are overexpressed in *atg* mutants relative to the wild type.

It was thus surprising to observe that although the *atg* mutants accumulate several compounds related to stress, they do not actually accumulate anthocyanins that are widely considered as antioxidant molecules involved in the response of plants to biotic and abiotic stress. As we showed that the lower anthocyanin levels in the mutants are due to downregulation of most of the genes involved in the anthocyanin pathway, *atg* mutants provide a tool for further in-depth investigation of the signals involved in anthocyanin biosynthesis and the modulation of the master genes known to regulate this pathway.

Finally, our transcriptome data also revealed links between autophagy and cytokinin perception or the signalosome that has been previously suggested to exist in plants and animals but remains to be fully explored. Future work will address the role of these underlying mechanisms in determining the various phenotypes of autophagy mutants.

### METHODS

#### Plant Growth

*Arabidopsis thaliana* Col, *atg5-3*; [SALK\_020601], *atg5-1* SAIL line [SAIL\_129B07], and *atg9* [SALK\_130796] were characterized in previous

reports (Hanaoka et al., 2002; Inoue et al., 2006; Yoshimoto et al., 2009). The *ATG18a* RNAi transgenic plants (RNAi18) were kindly provided by Diane C. Bassham (Iowa State University) (Xiong et al., 2005). Plants were cultivated under short days (8 h light) in sand with low nitrogen (2 mM nitrate) or high nitrogen nutrition (10 mM nitrate) as described by Lemaître et al. (2008). Three different bulk samples of rosettes were harvested between 10 and 11 AM 30, 60, and 75 DAS. Three independent and consecutive plantings (biological repeats) were performed under the same conditions.

To decipher the role of autophagy in anthocyanin biosynthesis, we crossed the *atg5-1* SAIL line [SAIL\_129B07] with the *pap1-D* overexpressing line (Borevitz et al., 2000). We preferred the *atg5-1* SAIL line for crossing because previous experiments performed by Yoshimoto et al. (2009) and our own experiments showed that the *atg5-3*; [SALK\_020601] SALK line induces silencing of 35S constructs, which is not the case in the *atg5-1* SAIL line [SAIL\_129B07]. Double homozygous *atg5 pap1-D* lines were then selected. Homozygosity for the *atg5* mutation was verified using PCR primers (1) 5'-CATAAAGACGCAAGAGAAGATGACGTC-3' and 5'-GAG-GTCCATAGATCCTCTTG-3' to confirm the absence of the wild-type allele and (2) 5'-CATAAAGACGCAAGAGAAGATGACGTC-3' and Lbb3 (5'-TAG-CATCTGAATTTTCATAACCAATCTCGATACAC-3') to test the presence of the T-DNA insertion in *ATG5*. Homozygosity of the *pap1-D* allele was verified using primers 5'-TGAGACTTTTCAACAAAGGG-3' and 5'-AccgAATAT-CTggACAAGCCggA-3' to confirm the presence of the *pap1-D* allele and 5'-AccgAATATCTggACAAGCCggA-3' and 5'-TgCagAgacTACTCCCTCgTgC-3' to test the absence of the wild-type region at the *PAP1* locus.

#### Metabolite Profiling Using GC-MS

Extraction, derivatization, analysis, and data processing were performed according to Fiehn (2006). Metabolites were analyzed by GC-MS 3 h after derivatization. One microliter of the derivatized samples was injected in splitless mode on an Agilent 7890A gas chromatograph coupled to an Agilent 5975C mass spectrometer. The column was an Rtx-5SilMS from Restek (30 m with 10-m Integra-Guard column). The liner (Restek 20994) was changed before each series of analyses, and 10 cm of column was removed. The oven temperature ramp was 70°C for 7 min then 10°C/min to 325°C for 4 min (run length 36.5 min). The helium constant flow was 1.5231 mL/min. Temperatures were as follows: injector, 250°C; transfer line, 290°C; source: 250°C; and quadrupole, 150°C. Samples and blanks were randomized. Amino acid standards were injected at the beginning and end of the analysis to monitor the derivatization stability. An alkane mix (C10, C12, C15, C19, C22, C28, C32, and C36) was injected in the middle of the queue for external calibration. Five scans per second were acquired.

Metabolites were annotated, and their levels on a fresh weight basis were normalized with respect to the ribitol internal standard. The three independent plantings (each planting containing three plant repeats) performed showed similar results as shown by ANOVA.

Since only small sized molecules are determined with GC-MS, we used LC-MS and enzymatic assays to measure flavonoid and glutathione concentrations, respectively.

#### Glutathione Enzyme Assay

Leaf material (150 mg fresh weight) was extracted in 1 mL of HClO<sub>4</sub> (1 M) containing insoluble PVP. After centrifugation (15 min, 14,000g, 2°C), 0.5 mL of supernatant was collected and kept on ice and was added to 0.1 mL of NaH<sub>2</sub>PO<sub>4</sub> (0.12 M, pH 5.6) and buffered to pH 6.0 with 0.09 mL of cold K<sub>2</sub>CO<sub>3</sub> (2.5 M). After centrifugation (15 min, 14,000g, 2°C) to obtain a clear supernatant, glutathione was measured according to Noctor and Foyer (1998) with the exception that volumes were modified and adapted to microtitration plates. To measure GSSG, an earlier treatment of the sample was necessary: 0.2 mL of sample was pretreated by adding 5 μL of vinylpyrimidine and incubating it for 20 min at room temperature. The treated sample was then centrifuged twice (15 min, 14,000g, 2°C), and the

supernatant was used to measure total glutathione (GSH + GSSG). Measurements were performed using 5 μL of extracts, 242 μL of the reaction buffer, pH 7.5 [0.12 M NaH<sub>2</sub>PO<sub>4</sub>, 0.74 mM EDTA, 5 mM 5,5'-dithiobis(2-nitrobenzoic acid), and 0.4 mM NADPH], and 0.34 units of glutathione reductase in each 96-well microplate. Absorbance at 405 nm was measured during a 20-min kinetic. Standards were prepared as millimolar dilutions of GSH and GSSG in (1 M HClO<sub>4</sub>/2.5 M K<sub>2</sub>CO<sub>3</sub>/0.12 M NaH<sub>2</sub>PO<sub>4</sub>, pH 5.6; 1/0.25/0.2, v/v/v).

#### Flavonoid Analysis Using LC-MS

Samples were ground for 15 s at maximum speed with a FastPrep-24 homogenizer (MP Biomedicals), in 1 mL of methanol/acetone/water/trifluoroacetic acid (30/42/28/0.05, v/v/v/v) solvent mix and sonicated for 15 min at 25 Hz (Elma sonicator). A 4-μg aliquot of apigenin was added as an internal standard. Following centrifugation at 18,000g for 9 min, the pellet was further extracted with 0.8 mL of the same solvent mix for 4 h at 4°C and centrifuged again. The two extracts were pooled and evaporated under vacuum overnight using a Speedvac concentrator (Thermo Scientific Savant SPD121 P). The dry residue was finally dissolved in 300 μL solvent mix, sonicated for 10 min to complete dissolution, and briefly centrifuged for 5 min to remove any insoluble materials. LC-MS analyses of individual flavonoids was performed as previously described (Routaboul et al., 2006, 2012) using a Quattro LC with an ESI Z-Spray interface (MicroMass), an Alliance 2695 RP-HPLC system, and a Waters 2487 UV detector set at 280 nm. Anthocyanins and flavonols were identified based on mass fragmentation in comparison with reported data (Tohge et al., 2005; Nakabayashi et al., 2009). Flavonol contents were expressed relative to quercetin-3-O-rhamnoside, rutin, and epicatechin (Extrasynthese) external standards, or monoglycosylated and diglycosylated flavonols and flavan-3-ols (PAs), respectively. Anthocyanins were expressed relative to cyanidin (Extrasynthese).

#### Metabolomic Data Processing

Raw Agilent data files were converted in NetCDF format and analyzed with AMDIS (<http://chemdata.nist.gov/mass-spc/amdis/>). A home retention index/mass spectra library built from the NIST, Golm, and Fiehn databases and standard compounds was used for metabolite identification. Peak areas were then determined using the Quanlynx software (Waters) after conversion of the NetCDF file to masslynx format. TMEV (<http://www.tm4.org/mev.html>) was used for all statistical analysis. Univariate analysis by permutation (one-way and two-way ANOVA) was first used to select the significant metabolites. Multivariate analysis (hierarchical clustering and principal component analysis) was then performed on this subset. Only metabolites showing repeatable and significant differences (based on *t* tests) in the mutant/RNAi relative to the wild type in the three replicate plantings are reported.

#### Microarrays and Statistical Analysis

Total RNA was extracted using the procedure described by Lemaître et al. (2008). Plant material was produced in two independent plantings made at an interval of several months, thus forming two biological replicates R1 and R2. For R1 and R2, total RNA was extracted from three independent plant material bulks representing three biological repeats. For each genotype, RNA samples used for cDNA production and microarray experiment were a mix of the three plants. Then, two independent hybridizations were performed for R1 and R2. Microarray analysis was performed at the RIKEN Plant Science Center using the Affymetrix ATH1 microarrays according to the manufacturer's instructions. Raw data obtained as CEL files were then processed. The analytical techniques used to normalize data and determine significance levels and fold changes between genotypes was based on the method of Rank products and FDR estimation as described by Breitling et al. (2004). Data sets from R1 and R2 were crossed in order to calculate rank products, FDR%, and



fold change ratios of (1) *atg5* versus Col wild type (using the comparisons of *atg5<sub>R1</sub>*vsCol<sub>R1</sub>, *atg5<sub>R2</sub>*vsCol<sub>R1</sub>, *atg5<sub>R1</sub>*vsCol<sub>R2</sub>, and *atg5<sub>R2</sub>*vsCol<sub>R2</sub>), (2) *atg9* versus Col wild type (using the comparisons of *atg9<sub>R1</sub>*vsCol<sub>R1</sub>, *atg9<sub>R2</sub>*vsCol<sub>R1</sub>, *atg9<sub>R1</sub>*vsCol<sub>R2</sub>, and *atg9<sub>R2</sub>*vsCol<sub>R2</sub>), and (3) both *atg5* and *atg9* versus Col wild type (using the comparisons of *atg5<sub>R1</sub>*vsCol<sub>R1</sub>, *atg5<sub>R2</sub>*vsCol<sub>R1</sub>, *atg5<sub>R1</sub>*vsCol<sub>R2</sub>, *atg5<sub>R2</sub>*vsCol<sub>R2</sub>, *atg9<sub>R1</sub>*vsCol<sub>R1</sub>, *atg9<sub>R2</sub>*vsCol<sub>R1</sub>, *atg9<sub>R1</sub>*vsCol<sub>R2</sub>, and *atg9<sub>R2</sub>*vsCol<sub>R2</sub>), thus explaining that, in that case, the range of FDR% is much larger). Top lists of significantly up- or downregulated genes in each condition, genotype, and harvest time were computed and cutoffs were based on FDR%  $\leq 10^{-6}$  for individual mutant analysis (*atg5* versus Col or *atg9* versus Col) and on FDR%  $\leq 10^{-10}$  for the combination of the two mutants (*atg5* and *atg9* versus Col).

From these lists, intersections and GOs were analyzed using VirtualPlant1.3 (<http://virtualplant.bio.nyu.edu/cgi-bin/vpweb/>) and AGRIGO (<http://bioinfo.cau.edu.cn/agriGO/index.php>; Du et al., 2010) bioinformatics tools.

### Quantitative RT-PCR

Total RNA (1  $\mu$ g), extracted as described above on three plant replicates, was used as a template to perform RT reactions using Moloney murine leukemia virus reverse transcriptase (Invitrogen) according to the manufacturer's instructions. Quantitative RT-PCR reactions were performed using 2 $\times$  Mesa Fast qPCR MasterMix Plus for SYBR assay (Eurogentec) following the manufacturer's protocols. *TRANSLATION ELONGATION FACTOR1A*, *APT*, *ACTIN1*, and *UBIQUITIN1* were used as reference genes. Real-time RT-PCR conditions and primer sets used in this study for *TT8*, *CHS*, and *DFR* analysis are described by Baudry et al. (2004, 2006). QuantiTect Primers were purchased from Qiagen to analyze *F3'H* (QT00825181) and *LDOX* (QT00813176) transcript accumulation. *PAP1* transcripts were quantified using the forward 5'-TGTAAGAGCTGGGCTAAAC-3' and reverse 5'-GAAGATCGACTTCATCAGAGC-3' primers.

### Accession Numbers

Sequence data from this article can be found in the GenBank/EMBL libraries under the following accession numbers: AT5G20250, AT3G57520, AT1G20350, AT1G01340, AT2G22470, AT1G35230, AT1G333960, AT1G79450, AT1G68620, AT1G02220, AT2G17040, AT3G44350, AT5G22380, AT5G20230, AT2G41100, AT3G54420, AT1G02400, AT4G25110, AT3G13100, AT3G52430, AT3G22910, AT1G11190, AT5G56870, AT3G60140, AT3G01830, AT5G47850, AT5G50260, AT2G43570, AT5G42380, AT5G52760, AT3G26830, AT3G49620, AT1G07000, AT1G30700, AT1G26420, AT4G14630, AT4G39670, AT3G50480, AT2G34600, AT1G16420, AT1G62490, AT1G04600, AT3G23250, AT2G47190, AT1G09500, AT2G35710, AT5G64790, AT3G28580, AT5G13320, AT2G26560, AT2G18660, AT2G14610, AT1G48210, AT1G72540, AT5G25440, AT4G37900, AT3G48650, AT4G02380, AT3G51680, AT3G01290, AT3G62950, AT1G57630, AT2G32140, AT4G04300, AT2G13310, AT3G53150, AT2G43820, AT3G11340, AT1G76230, AT1G13340, AT3G13950, AT3G48640, AT4G28460, AT2G04025, AT1G20180, AT3G12510, AT4G32870, AT5G43580, AT1G78410, AT2G22880, AT1G21240, AT4G31800, AT5G22570, AT5G57550, AT1G59590, AT5G04390, AT4G14365, AT1G08050, AT1G56650, and AT5G42800.

### Supplemental Data

The following materials are available in the online version of this article.

**Supplemental Figure 1.** Hierarchic Clustering of Metabolite Changes between *atg* Mutants and Controls Show Salicylic Dependence of Metabolite Classes.

**Supplemental Figure 2.** Genes Involved in Galacturonate Biosynthesis Are Upregulated in *atg5*.

**Supplemental Figure 3.** Phytosterol Pathway Is Upregulated in *atg5*.

**Supplemental Figure 4.** PCR Genotyping of *atg5.pap1-D* Double Mutant.

**Supplemental Figure 5.** Overexpression of Isochorismate Synthase 1 and PBS3 Genes in *atg5* Relative to the Wild Type Explain SA Accumulation in Autophagy Mutants.

**Supplemental Figure 6.** Cell Death Area on Leaves of Autophagy Mutants.

**Supplemental Table 1.** Flavonoid Compounds Identified and Quantified Using LC-MS.

**Supplemental Table 2.** Metabolites Significantly More or Less Concentrated in *atg5*, *atg5 sid2*, *atg5 NahG* Compared with Col, *sid2*, or NahG Controls Are Listed.

**Supplemental Table 3.** List of the 86 Genes Significantly Upregulated in *atg5* and *atg9* Relative to Wild Type under Low Nitrate Conditions for 30 and 60 d.

**Supplemental Table 4.** Frequency of Gene Ontology Terms (GO) Represented in the 86 Genes Upregulated in Both *atg5* and *atg9* Independently of Nitrate Conditions or Plant Age.

**Supplemental Table 5.** Gene Ontology Terms (GO) Represented in the List of Genes Significantly Upregulated in the *atg* Mutants in Different Conditions.

**Supplemental Table 6.** Gene Ontology Terms (GO) Represented in the List of Genes Significantly Downregulated in the *atg* Mutants in Different Conditions.

**Supplemental Table 7.** Differential Expression in *atg5* and *atg9* Relative to Wild-Type Genes Involved in the Nitrogen Assimilation Pathway and in Aspartate and Glutamate Metabolism.

**Supplemental Table 8.** Differential Expression in *atg5* Relative to Wild-Type Genes Involved in the Shikimate and Flavonoid Pathways and Reported by Lillo et al. (2008).

**Supplemental Table 9.** Differential Expression in *atg5* and *atg9* Relative to the Wild Type of Senescence-Associated Genes (SAG).

**Supplemental Table 10.** Differential Expression (in *atg5* and *atg9* Relative to Wild Type) of Genes Responding to Salicylic Acid (SA) and Jasmonic Acid (JA).

**Supplemental Table 11.** Differential Expression of WRKY Genes in Rosettes of *atg5* and *atg9* Relative to Wild Type.

**Supplemental Table 12.** Differential Expression of NAC Genes in *atg5* and *atg9* Relative to Wild Type.

**Supplemental Data Set 1.** Area Raw Data for the Metabolome Analysis of the Rosettes of the Col Wild Type and *atg5*, *atg9*, and RNAi18 Mutants Grown under Low (2 mM) or High (10 mM) Nitrate and Harvested at 30 DAS, 60 DAS, and 75 DAS.

**Supplemental Data Set 2.** The Relative Metabolite Concentrations in the Rosettes of *atg5*, *atg9*, and RNAi18 Relative to Wild Type Are Presented as Fold Change Values.

**Supplemental Data Set 3.** Transcriptome of *atg5* versus Wild Type, 30 DAS under Low Nitrate Conditions.

**Supplemental Data Set 4.** Transcriptome of *atg9* versus Wild Type, 30 DAS under Low Nitrate Conditions.

**Supplemental Data Set 5.** Transcriptome of *atg5* and/or *atg9* versus Wild Type, 30 DAS under Low Nitrate Conditions.

**Supplemental Data Set 6.** Transcriptome of *atg5* versus Wild Type, 60 DAS under Low Nitrate Conditions.

**Supplemental Data Set 7.** Transcriptome of *atg9* versus Wild Type, 60 DAS under Low Nitrate Conditions.

**Supplemental Data Set 8.** Transcriptome of *atg5* and/or *atg9* versus Wild Type, 60 DAS under Low Nitrate Conditions.

**Supplemental Data Set 9.** Transcriptome of *atg5* versus Wild Type, 60 DAS under High Nitrate Conditions.

**Supplemental Data Set 10.** Lists of the Genes Significantly Upregulated in *atg5*, *atg9*, and Both *atg5* and *atg9*.

**Supplemental Data Set 11.** Lists of the Genes Significantly Downregulated in *atg5*, *atg9*, and Both *atg5* and *atg9*.

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## AUTHOR CONTRIBUTIONS

P.A., G.C., F.S., J.-M.R., A.G., and C.M.-D. performed the experiments. P.A., G.C., J.-M.R., A.G., and C.M.-D. analyzed and evaluated the data. P.A., G.C., J.-M.R., and C.M.-D. interpreted the data. A.G., K.S., K.Y., and C.M.-D. conceived the study. C.M.-D. coordinated the research and wrote the article. All authors read and approved the final article.

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