Current Opinion in Insect Science Significance and interpretation of molecular diagnostics for insecticide resistance management of agricultural pests --Manuscript Draft--

Short Title:	Molecular diagnostics for insecticide reistance				
Keywords:	insecticide resistance; molecular marker; diagnostic marker; resistance monitoring; target-site mutation; metabolic resistance				
Corresponding Author:	Thomas Van Leeuwen Universiteit Gent BELGIUM				
Corresponding Author's Institution:	Universiteit Gent				
Corresponding Author E-Mail:	Thomas.VanLeeuwen@UGent.be				
First Author:	Thomas Van Leeuwen				
Order of Authors:	Thomas Van Leeuwen				
	Wannes Dermauw, dr				
	Konstantinos Mavridis				
	John Vontas				
Abstract:	Insecticide resistant pests become increasingly difficult to control in current day agriculture. Due to environmental and health concerns, the insecticide portfolio to combat agricultural pests is gradually decreasing. It is therefore crucial to make rational decisions on insecticide use to assure effective resistance management. However, resistance monitoring programs that inform on pest susceptibility and resistance are not yet common practice in agriculture. Molecular markers of resistance that are turned into convenient diagnostic tools are urgently needed and will only increase in importance. This review investigates which factors determine the strength, diagnostic value and success of a diagnostic marker, and in which cases recent technical advances might provide new opportunities for decision making in an operational meaningful way.				
Author Comments:					

1 Significance and interpretation of molecular diagnostics for insecticide

2 resistance management of agricultural pests

3 Thomas Van Leeuwen¹, Wannes Dermauw¹, Konstantinos Mavridis², John Vontas^{2,3}.

¹Laboratory of Agrozoology, Department of Plants and Crops, Faculty of Bioscience Engineering, Ghent
 University, Coupure links 653, 9000, Ghent, Belgium

²Molecuar Entomology Lab, Institute of Molecular Biology and Biotechnology (IMBB), Foundation for
 Research and Technology (FORTH), Nikolaou Plastira Street 100, 70013, Heraklion, Crete, Greece

- 8 ³Pesticide Science Laboratory, Department of Crop Science, Agricultural University of Athens, Iera Odos
- 9 75, 11855, Athens, Greece
- 10

11 *corresponding author: <u>thomas.vanleeuwen@ugent.be</u>

- 12
- 13
- 14
- 15
- 16
- 17
- 18
- 19
- ___
- 20
- 21
- _ _
- 22
- 23
- 24
- 25

26 Abstract

Insecticide resistant pests become increasingly difficult to control in current day agriculture. Due to environmental and health concerns, the insecticide portfolio to combat agricultural pests is gradually decreasing. It is therefore crucial to make rational decisions on insecticide use to assure effective resistance management. However, resistance monitoring programs that inform on pest susceptibility and resistance are not yet common practice in agriculture. Molecular markers of resistance that are turned into convenient diagnostic tools are urgently needed and will only increase in importance. This review investigates which factors determine the strength, diagnostic value and success of a diagnostic marker, and in which cases recent technical advances might provide new opportunities for decision making in an operational meaningful way.

- _ _

51 Introduction

52 The control of pests that attack our crops is one of the major challenges and costs in agriculture today, as 53 production losses due to arthropod pests continue to grow and reach up to 20% of the total crop yield 54 [1,2]. The development of insecticide resistance becomes an increasingly important problem: more than 55 500 insect and mite species are now resistant to at least some of insecticides used for their control [3,4]. 56 In addition, the availability of new crop protection chemistry becomes more and more challenging due to the increasing costs for discovery, development and registration, in part driven by public concerns on 57 environmental safety and human health [5-9]. This probably results in company decisions not to develop 58 59 new chemistry if projected revenues are minor, for example when compounds target only specific pests 60 in minor crops.

Giving the rising resistance problem and pressure on pesticide portfolio, it is very important to make rational decisions on insecticide use [10]. While a few key mosquito species are controlled by a limited number of insecticide classes, and exposure is mainly via residual contact of sprays and treated bed nets [11], the options in agriculture are more complex. Several classes of insecticides with different modes of action and different arthropod exposure routes (direct or residual contact, ingestion by chewing, sucking, rasping ...) are applied in multitude in different cropping systems, giving more options for pesticide choice and insecticide resistance management (IRM).

68 Diagnostic tools that monitor susceptibility in pest populations could play a crucial role in the choice of 69 chemicals, as they allow to manage or avoid incidence and spread of resistance. Diagnostic bioassays have 70 since long been developed for several agricultural pests and disease vectors. While extensive monitoring 71 programs are an integral component of mosquito control programs [12], this is much less the case for the 72 numerous agricultural pests on the diversity of crops. Crop pest monitoring programs seem limited to 73 some of the key pests in major crops like corn, soybean, rice and cotton, yet primarily as a result of 74 spontaneous research programs or industry driven activities for managing and launching their new 75 products, but more rarely as systematic country level activities [13,14].

Bioassays are often employed for resistance monitoring [10], however their feasibility in high throughput depends on whether insects can be easily collected, stored, and grown in the lab, and equally, whether the host plant is easily cultivated in the lab or artificial diets for pests are available. For example, resistance screens for Bt toxins in key lepidopteran pests have been largely profited from the ability to mix these toxins with artificial diets [15]. As increasing number of molecular markers for resistance are being identified, high throughput fast and accurate molecular diagnostic platforms could be used to overcome the need for time-consuming bioassays. However, using this data in making decisions on insecticide use is the next challenge, because of the potential limited predictive value of the markers and/or lack of clearly established links with operational impact.

This review investigates to what extent, and in which cases, molecular diagnostics can be reliably used to manage resistance and inform decisions on insecticide use in time and space in the field. As this subject has been recently reviewed for vectors of human disease [11,16], we focus here on agricultural pests.

89 Resistance mechanisms and molecular markers

90 The development of resistance is an evolutionary phenomenon of which the mechanisms are most often 91 described in terms of toxicodynamic and toxicokinetic changes in the physiology and biochemistry of 92 resistant strains. This includes changes in penetration, activation, metabolism, transport and excretion for 93 toxicokinetic mechanisms (any changes that alters the amount of toxin that reaches the target-site), and 94 changes to the pesticide target-site (structural changes, knock-out, amplification) for toxicodynamic 95 mechanisms [17,18]. Although this physiological classification is useful in describing the resistance 96 phenotype that results from genetic changes, and sometimes allows specific field interventions such as 97 the use of synergists in metabolic resistance, the actual type of genetic change (mutation) is more relevant 98 to precisely understand the evolution and spread of resistance genes in populations. In addition, it largely 99 determines whether accurate and sensitive molecular diagnostic markers can be feasibly developed. For 100 example, a simple point mutation in a target-site is much more easily turned into a DNA-based marker 101 than increased expression of a metabolic resistance gene. In the latter case, it is much more likely to 102 develop a diagnostic marker based on RNA or protein abundance, than a marker based on the actual 103 mutation, as cis and especially trans acting mutations regulating gene expression have remained elusive 104 for most cases of metabolic resistance in most pests. A few studies in mosquitoes are now providing DNA 105 markers for metabolic resistance [19,20], while recently developed mapping tools, such as NGS-based 106 bulked segregant analysis [21], might facilitate the identification of QTL markers for major agricultural 107 pests [22-24].

108 Factors affecting the strength and diagnostic value of a molecular marker

109 One of the issues to consider when developing a diagnostic marker, is the breath of its geographical 110 applicability. As outlined above, pests can develop resistance by multiple mechanisms, and whether 111 different populations of a certain species develop resistance with similar mechanisms is not always clear. 112 For some target-site resistance cases, it is known that similar, if not identical mutations evolve in different 113 populations of the same species, and even among species. For example, resistance to pyrethroids has been 114 associated with kdr and super kdr mutations at domain II of the voltage-gated sodium channel in at least 115 50 different arthropod species [18]. More recent examples include the G4946E mutation in the ryanodine 116 receptor, conferring resistance against diamides, which has been reported in four different lepidopteran 117 species, including *Plutella xylostella* populations spread across 3 continents [25-28], while alterations in 118 the ABCC2 or ABCC3 gene, strongly associated with Cry1-toxin resistance, have been identified in seven 119 different lepidopteran species [29]. Furthermore, mutations at identical position in chitin synthase 1 120 (chs1), conferring resistance against benzoylureas, buprofezin and etoxazole, have been reported in three 121 different arthropod species, both insects and mites (F. occidentalis, P. xylostella and the spider mite 122 Tetranychus urticae) [30-32]. T. urticae is one of the rare examples where the frequency of a whole panel 123 of different target-site mutations has been investigated worldwide (Table 1 and e.g. [33]), revealing the 124 presence of identical mutations often across continents. The global presence of these and other target-125 site mutations might be related to functional constraints in pesticide targets, which have been suggested 126 to be considerably high, probably promoting the success of a few amino acid substitution that are 127 constraint-free [34]. Nevertheless, even if conserved target-site mutations are present in populations in 128 broad geographical context, their relative importance in the resistant phenotype needs to be sufficiently 129 high to reliably predict resistance and serve as diagnostic marker. For *T. urticae*, the phenotypic strength 130 of the most common mutations has been determined by repeated back-crossing and marker assisted 131 selection, which is feasible for this species with short generation time. This revealed that in most cases, 132 the presence of the mutation explained the larger part, if not the complete phenotype, suggesting that 133 target-site mutations are a very good predictor of resistance levels in this species [35-37]. In addition, the 134 dominance and fitness cost of certain resistance mutations was determined [31,36,38,39], which further 135 increases the value of a certain molecular marker for IRM [38,40-42]. As introgression of a marker is not 136 feasible for most insect species (however, see [43,44] for exceptions), gene editing in Drosophila and/or 137 pest species have also been a very useful tool for validating and measuring the role and effect of certain 138 mutations in resistance against insecticides [30,45-53].

The interpretation of metabolic resistance in the context of developing molecular markers is even more complex. This is especially true for many serious pests that are polyphagous. It was previously shown that similar gene-expression responses evolved after both the development of pesticide resistance as adaptation to a new host [54,55]. The 'pre-adaptation syndrome', as discussed by Dermauw and 143 colleagues [54], confounds the potential interpretation of some of the key players in metabolic resistance, 144 as candidate metabolic resistance genes might be overexpressed both in relation to pesticide 145 detoxification as well as upon host plant exposure. In addition, although recombinant expression flowed 146 by metabolism assays, reverse genetics by RNAi, or ectopic overexpression have provided different levels 147 of validation for the involvement of detoxification genes in the resistance phenotype, finding appropriate 148 markers has been even more challenging. The complexity of metabolic resistance is also determined by 149 the target marker: while in some insects, such as the pollen beetle *Meligethes aeneus* a single P450 150 (CYP6BQ23) seems to be primarily responsible for pyrethroid resistance [56] indicating a single 151 RNA/protein marker, in others, such as Helicoverpa armigera several members of the lepidopteran-152 specific CYP6AE subfamily can metabolize esfenvalerate [57], moving the target marker at the P450 153 subfamily level. Nevertheless, successful diagnostic assays for P450 based resistance have been developed 154 in some cases, such as the polyphagous white fly *Bemisia tabaci* ([58], Figure 1A), which clearly indicates 155 that this needs to be evaluated case by case.

A relevant question for the strength of a marker is also: in how many cases the resistance is caused by the mechanisms under investigation (alone). We need to recognize that the resistance is often polygenic and consists (in many instances) of "major" genes and "minor" genes, and potentially different evolutionary solutions have been selected in different populations. The predictive value of a marker can therefore only be validated in combinations with bioassays in a certain geographical region at a certain time. A validated molecular marker can be subsequently used alone for resistance monitoring but should be used in conjunction with bioassays at certain time intervals, in case new mechanisms evolve.

163 Methods in molecular diagnostics

164 The majority of molecular diagnostics used for monitoring insecticide resistance in agricultural pests 165 (described in Table 2 [16,59-64]) are based on nucleic acid detection (DNA and/or RNA). Simple/low-tech 166 versions of PCR- (AS-PCR, PCR-RFLP) and isothermal LAMP are used to detect the presence of known 167 mutations or differentially expressed genes (targeted analysis). In these cases, mutant allelic frequency 168 (MAF) is calculated through screening of several individuals. Sequencing based methods (Sanger, 169 pyrosequencing, next generation sequencing) also allow for the unbiased analysis of the whole genes or 170 transcriptomes revealing potential new SNPs. Improved/High-tech versions of PCR-based methods 171 (rtPASA/SYBR Green qPCR, TaqMan qPCR, ddPCR, lyophilized pellets, LabDisk) and sequencing (Nanopore, 172 NGS transcriptome analysis) allow quantification of MAF within the analyzed sample; thus, samples or 173 populations can be pooled beforehand. More importantly, the exact same technologies can be used for assessing gene expression levels at the RNA level in the same samples used for target-site mutationquantification and thus yield important information regarding metabolic resistance [65,66].

At the protein level, most technologies have been developed to monitor metabolic resistance, with the exception of few target enzyme assays. This is achieved either by assessing the enzymatic activity (cytochrome P450 monooxygenases, glutathione-S-transferases, carboxyl/choline esterases) via general or more specific substrates, or the quantification of protein expression levels via specific antibodies [67].

180 Today, target-site mutations are usually assayed by Sanger sequencing for small sample sizes and TaqMan 181 qPCR for higher throughput needs in which case the cost per sample drops significantly. Metabolic 182 resistance is most frequently determined at the mRNA level by singleplex SYBR Green RT-qPCR at relatively 183 low cost and high throughput. Finally, in situations where large sample screening is required for known 184 resistance mutations, including searching for low frequency/rare mutations, Droplet Digital PCR (ddPCR) 185 could be a valuable tool [66]. It can be used to assess MAF in bulk samples with a detection limit of at least 186 1 mutated individual in a pool of 1000. The same pooled sample can also be used quantify the number of 187 metabolic gene transcripts with very high accuracy, when working with RNA/cDNA templates. Current 188 ddPCR cost may be too high, but prices are expected to drop for already available and new platforms.

189 **Conclusions and future perspectives**

190 Due to concerns on environmental safety and human health, the portfolio of synthetic insecticides is 191 gradually diminishing. To prevail the efficacy of current and future insecticides, the development and 192 application of molecular markers for evidence based IRM will become more crucial. Although resistance 193 monitoring is not common practice yet, this will surely change when the efficacy of a particular insecticide 194 becomes even more crucial in a context where alternative crop protection strategies will rely on a 'last 195 resort' chemical intervention. Robust molecular markers are of great value for IRM. However, in many 196 cases, such strong markers are not available/known and more correlation studies between resistance and 197 molecular markers alone or in combination across geographical regions should be performed, to validate 198 the strength and value of a marker in place and time. Furthermore, while in the past the development of 199 molecular markers was focused on functional markers (e.g. target-site resistance mutation), hypothesis-200 free approaches (e.g. QTL mapping) and third generation sequencing technologies might generate markers 201 regardless of underlying mechanisms. This will become more and more feasible with the advent of high-202 quality genome sequences for many if not most pests. Last, distribution of marker-based resistance 203 information in an operationally meaningful way, is challenging but will remain crucial. The development

- 204 of modern interactive databases and ICT platforms that support such decision making, need to be further
- 205 developed and implemented.

206 Acknowledgments

- 207 We apologize in advance to our many colleagues for the inspiring articles we did not have space to feature.
- 208 This work was supported by the European Union's Horizon 2020 research and innovation program [grant
- 209 772026-POLYADAPT to TVL and 773902-SuperPests to TVL and JV].

210 References

- 1. Oerke EC: **Crop losses to pests**. *The Journal of Agricultural Science* 2006, **144**:31-43.
- Culliney TW: Crop Losses to Arthropods. In Integrated Pest Management: Pesticide Problems, Vol.3.
 Edited by Pimentel D, Peshin R: Springer Netherlands; 2014:201-225.
- Mota-Sanchez D, Wise JC: Arthropod Pesticide Resistance Database. Michigan State University. On line at: <u>http://www.pesticideresistance.org</u>. Edited by; 2019.
- 4. Gould F, Brown ZS, Kuzma J: Wicked evolution: Can we address the sociobiological dilemma of
 pesticide resistance? Science 2018, 360:728-732.
- 5. Isman MB: Challenges of Pest Management in the 21st Century: New Tools and Strategies to Combat
 Old and New Foes Alike. Frontiers in Agronomy 2019:doi: 10.3389/fagro.2019.00002
- 4. Hillocks RJ: Farming with fewer pesticides: EU pesticide review and resulting challenges for UK
 agriculture. Crop Protection 2012, 31:85-93.
- 7. Keulemans W, Bylemans D, Deconinck B: Farming without plant protection products. Can we grow
 without using herbicides, fungicides and insecticides? Brussels, European Union: Panel for the
 Future of Science and Technology (STOA); 2019.
- 8. EEA: Supplementary information to Priority Objective 3 of the Seventh Environment Action
 Programme Pesticide sales. In Environmental Indicator Report 2018; In Support to the Monitoring
 of the Seventh Environment Action Programme. Vol. 19/2018. Edited by: European Environment
 Agency (EAA); 2018:67-78, Available online at:
 https://www.eea.europa.eu/airs/2018/environment-and-health/pesticides-sales.
- 9. Sparks TC: Insecticide discovery: An evaluation and analysis. *Pesticide Biochemistry and Physiology* 2013, 107:8-17.
- 10. Network RP: Trends and Challenges in Pesticide Resistance Detection. *Trends in Plant Science* 2016,
 21:834-853.
- Donnelly MJ, Isaacs AT, Weetman D: Identification, Validation, and Application of Molecular
 Diagnostics for Insecticide Resistance in Malaria Vectors. Trends in Parasitology 2016, 32:197 206.
- 237 12. WHO: Global plan for insecticide resistance management in malaria vectors (GPIRM). Geneva,
 238 Switzerland: WHO Press; 2012.
- 239 13. Castañera P, Farinós GP, Ortego F, Andow DA: Sixteen Years of Bt Maize in the EU Hotspot: Why Has
 240 Resistance Not Evolved? *PLOS ONE* 2016, 11:e0154200.
- 14. Dennehy TJ, DeGain BA, Harpold VS, Brown JK, Morin S, Fabrick JA, Byrne FJ, Nichols RL: *New Challenges to Management of Whitefly Resistance to Insecticides in Arizona*: College of Agriculture and Life
 Sciences, University of Arizona (Tucson, AZ); 2005.

- Ludwick DC, Meihls LN, Huynh MP, Pereira AE, French BW, Coudron TA, Hibbard BE: A new artificial
 diet for western corn rootworm larvae is compatible with and detects resistance to all current
 Bt toxins. Scientific Reports 2018, 8:5379.
- 247 16. Vontas J, Mavridis K: Vector population monitoring tools for insecticide resistance management:
 248 Myth or fact? *Pesticide Biochemistry and Physiology* 2019, 161:54-60.
- 17. Kennedy C, Tierney K: Xenobiotic Protection/Resistance Mechanisms in Organisms. In Environmental Toxicology. Edited by Laws EA: Springer 2013:689-721.
- 18. Feyereisen R, Dermauw W, Van Leeuwen T: Genotype to phenotype, the molecular and physiological
 dimensions of resistance in arthropods. *Pesticide Biochemistry and Physiology* 2015, 121:61-77.
- 19. Mugenzi LMJ, Menze BD, Tchouakui M, Wondji MJ, Irving H, Tchoupo M, Hearn J, Weedall GD, Riveron
 JM, Wondji CS: Cis-regulatory CYP6P9b P450 variants associated with loss of insecticide-treated
 bed net efficacy against Anopheles funestus. Nature Communications 2019, 10:4652.
- 256 20. Weedall GD, Mugenzi LMJ, Menze BD, Tchouakui M, Ibrahim SS, Amvongo-Adjia N, Irving H, Wondji
 257 MJ, Tchoupo M, Djouaka R, et al.: A cytochrome P450 allele confers pyrethroid resistance on a
 258 major African malaria vector, reducing insecticide-treated bednet efficacy. Science Translational
 259 Medicine 2019, 11:eaat7386.
- 260 21. Kurlovs AH, Snoeck S, Kosterlitz O, Van Leeuwen T, Clark RM: Trait mapping in diverse arthropods by
 261 bulked segregant analysis. *Current opinion in insect science* 2019, 36:57-65.
- 262 22. Snoeck S, Kurlovs AH, Bajda S, Feyereisen R, Greenhalgh R, Villacis-Perez E, Kosterlitz O, Dermauw W,
 263 Clark RM, Van Leeuwen T: High-resolution QTL mapping in *Tetranychus urticae* reveals acaricide 264 specific responses and common target-site resistance after selection by different METI-I
 265 acaricides. Insect Biochemistry and Molecular Biology 2019, 110:19-33.
- 23. Wybouw N, Kosterlitz O, Kurlovs AH, Bajda S, Greenhalgh R, Snoeck S, Bui H, Bryon A, Dermauw W,
 Van Leeuwen T, et al.: Long-Term Population Studies Uncover the Genome Structure and Genetic
 Basis of Xenobiotic and Host Plant Adaptation in the Herbivore Tetranychus urticae. Genetics
 2019, 211:1409-1427.
- 24. Park Y, González-Martínez RM, Navarro-Cerrillo G, Chakroun M, Kim Y, Ziarsolo P, Blanca J, Cañizares
 J, Ferré J, Herrero S: ABCC transporters mediate insect resistance to multiple Bt toxins revealed
 by bulk segregant analysis. *BMC Biology* 2014, **12**:46.
- 273 25. Boaventura D, Bolzan A, Padovez FE, Okuma DM, Omoto C, Nauen R: Detection of a ryanodine
 274 receptor target-site mutation in diamide insecticide resistant fall armyworm, Spodoptera
 275 frugiperda. Pest Management Science 2019:doi: 10.1002/ps.5505.
- 26. Troczka BJ, Williamson MS, Field LM, Davies TGE: Rapid selection for resistance to diamide insecticides
 in *Plutella xylostella* via specific amino acid polymorphisms in the ryanodine receptor.
 NeuroToxicology 2017, 60:224-233.
- 279 27. Steinbach D, Gutbrod O, Lümmen P, Matthiesen S, Schorn C, Nauen R: Geographic spread, genetics
 and functional characteristics of ryanodine receptor based target-site resistance to diamide
 insecticides in diamondback moth, *Plutella xylostella*. Insect Biochemistry and Molecular Biology
 282 2015, 63:14-22.
- 283 28. Roditakis E, Steinbach D, Moritz G, Vasakis E, Stavrakaki M, Ilias A, García-Vidal L, Martínez-Aguirre
 284 MdR, Bielza P, Morou E, et al.: Ryanodine receptor point mutations confer diamide insecticide
 285 resistance in tomato leafminer, *Tuta absoluta* (Lepidoptera: Gelechiidae). Insect Biochemistry
 286 and Molecular Biology 2017, 80:11-20.
- 287 29. Wu C, Chakrabarty S, Jin M, Liu K, Xiao Y: Insect ATP-Binding Cassette (ABC) Transporters: Roles in
 Xenobiotic Detoxification and Bt Insecticidal Activity. International Journal of Molecular Sciences
 289 2019, 20:2829.
- 30. Douris V, Steinbach D, Panteleri R, Livadaras I, Pickett JA, Van Leeuwen T, Nauen R, Vontas J: Resistance
 mutation conserved between insects and mites unravels the benzoylurea insecticide mode of

- 292action on chitin biosynthesis. Proceedings of the National Academy of Sciences of the United293States of America 2016, 113:14692-14697.
- 31. Van Leeuwen T, Demaeght P, Osborne EJ, Dermauw W, Gohlke S, Nauen R, Grbic M, Tirry L,
 Merzendorfer H, Clark RM: Population bulk segregant mapping uncovers resistance mutations
 and the mode of action of a chitin synthesis inhibitor in arthropods. Proceedings of the National
 Academy of Sciences of the United States of America 2012, 109:4407-4412.
- 32. Suzuki Y, Shiotsuki T, Jouraku A, Miura K, Minakuchi C: Benzoylurea resistance in western flower thrips
 Frankliniella occidentalis (Thysanoptera: Thripidae): the presence of a point mutation in chitin
 synthase 1. Journal of pesticide science 2017, 42:93-96.
- 301 33. Ilias A, Vontas J, Tsagkarakou A: Global distribution and origin of target site insecticide resistance
 302 mutations in *Tetranychus urticae*. Insect Biochemistry and Molecular Biology 2014, **48**:17-28.
- 303 34. ffrench-Constant RH: **The molecular genetics of insecticide resistance**. *Genetics* 2013, **194**:807-815.
- 304 35. Riga M, Bajda S, Themistokleous C, Papadaki S, Palzewicz M, Dermauw W, Vontas J, Leeuwen TV: The
 305 relative contribution of target-site mutations in complex acaricide resistant phenotypes as
 306 assessed by marker assisted backcrossing in *Tetranychus urticae*. Scientific Reports 2017, 7:9202.
 307 assessed by Marker assisted backcrossing in Tetranychus urticae. Scientific Reports 2017, 7:9202.
- 307 36. Fotoukkiaii SM, Tan Z, Xue W, Wybouw N, Van Leeuwen T: Identification and characterization of new
 308 mutations in mitochondrial cytochrome b that confer resistance to bifenazate and acequinocyl
 309 in the spider mite *Tetranychus urticae*. *Pest Management Science* 2019:doi: 10.1002/ps.5628.
- 37. Bajda S, Dermauw W, Panteleri R, Sugimoto N, Douris V, Tirry L, Osakabe M, Vontas J, Van Leeuwen T:
 A mutation in the PSST homologue of complex I (NADH:ubiquinone oxidoreductase) from
 Tetranychus urticae is associated with resistance to METI acaricides. *Insect Biochemistry and* Molecular Biology 2017, 80:79-90.
- 314 38. Bajda S, Riga M, Wybouw N, Papadaki S, Ouranou E, Fotoukkiaii SM, Vontas J, Van Leeuwen T: Fitness
 315 costs of key point mutations that underlie acaricide target-site resistance in the two-spotted
 316 spider mite *Tetranychus urticae*. Evolutionary applications 2018, **11**:1540-1553.
- 317 39. Van Leeuwen T, Vanholme B, Van Pottelberge S, Van Nieuwenhuyse P, Nauen R, Tirry L, Denholm I:
 318 Mitochondrial heteroplasmy and the evolution of insecticide resistance: Non-Mendelian
 319 inheritance in action. Proceedings of the National Academy of Sciences 2008, 105:5980-5985.
- 40. ffrench-Constant RH, Bass C: Does resistance really carry a fitness cost? Current Opinion in Insect
 Science 2017, 21:39-46.
- 41. Bourguet D, Genissel A, Raymond M: Insecticide Resistance and Dominance Levels. Journal of
 Economic Entomology 2000, 93:1588-1595.
- 42. Jin L, Wang J, Guan F, Zhang J, Yu S, Liu S, Xue Y, Li L, Wu S, Wang X, et al.: Dominant point mutation
 in a tetraspanin gene associated with field-evolved resistance of cotton bollworm to transgenic
 Bt cotton. Proceedings of the National Academy of Sciences 2018, 115:11760-11765.
- 327 43. Zuo Y-Y, Ma H-H, Lu W-J, Wang X-L, Wu S-W, Nauen R, Wu Y-D, Yang Y-H: Identification of the
 328 ryanodine receptor mutation I4743M and its contribution to diamide insecticide resistance in
 329 Spodoptera exigua (Lepidoptera: Noctuidae). Insect Science 2019:doi: 10.1111/1744 330 7917.12695.
- 44. Yang YH, Yang YJ, Gao WY, Guo JJ, Wu YH, Wu YD: Introgression of a disrupted cadherin gene enables
 susceptible *Helicoverpa armigera* to obtain resistance to *Bacillus thuringiensis* toxin Cry1Ac.
 Bulletin of Entomological Research 2009, **99**:175-181.
- 45. Zuo Y, Wang H, Xu Y, Huang J, Wu S, Wu Y, Yang Y: CRISPR/Cas9 mediated G4946E substitution in the
 ryanodine receptor of *Spodoptera exigua* confers high levels of resistance to diamide
 insecticides. Insect Biochemistry and Molecular Biology 2017, 89:79-85.
- 46. Yang X, Chen W, Song X, Ma X, Cotto-Rivera RO, Kain W, Chu H, Chen Y-R, Fei Z, Wang P: Mutation of
 ABC transporter ABCA2 confers resistance to Bt toxin Cry2Ab in Trichoplusia ni. Insect
 Biochemistry and Molecular Biology 2019, 112:103209.

- 47. Wang X, Ma Y, Wang F, Yang Y, Wu S, Wu Y: Disruption of nicotinic acetylcholine receptor α6 mediated
 by CRISPR/Cas9 confers resistance to spinosyns in *Plutella xylostella*. *Pest Management Science* 2019:doi: 10.1002/ps.5689.
- 48. Guo Z, Sun D, Kang S, Zhou J, Gong L, Qin J, Guo L, Zhu L, Bai Y, Luo L, et al.: CRISPR/Cas9-mediated
 knockout of both the PxABCC2 and PxABCC3 genes confers high-level resistance to Bacillus
 thuringiensis Cry1Ac toxin in the diamondback moth, Plutella xylostella (L.). Insect Biochemistry
 and Molecular Biology 2019, 107:31-38.
- 347 49. Guest M, Goodchild JA, Bristow JA, Flemming AJ: RDL A301S alone does not confer high levels of
 348 resistance to cyclodiene organochlorine or phenyl pyrazole insecticides in *Plutella xylostella*.
 349 *Pesticide Biochemistry and Physiology* 2019, **158**:32-39.
- 50. Douris V, Papapostolou K-M, Ilias A, Roditakis E, Kounadi S, Riga M, Nauen R, Vontas J: Investigation
 of the contribution of RyR target-site mutations in diamide resistance by CRISPR/Cas9 genome
 modification in Drosophila. Insect Biochemistry and Molecular Biology 2017, 87:127-135.
- Samantsidis G-R, O'Reilly AO, Douris V, Vontas J: Functional validation of target-site resistance
 mutations against sodium channel blocker insecticides (SCBIs) via molecular modeling and
 genome engineering in *Drosophila*. *Insect Biochemistry and Molecular Biology* 2019, **104**:73-81.
- 356 52. Zimmer CT, Garrood WT, Puinean AM, Eckel-Zimmer M, Williamson MS, Davies TGE, Bass C: A
 357 CRISPR/Cas9 mediated point mutation in the alpha 6 subunit of the nicotinic acetylcholine
 358 receptor confers resistance to spinosad in *Drosophila melanogaster*. Insect Biochemistry and
 359 Molecular Biology 2016, 73:62-69.
- S3. Wang J, Zhang H, Wang H, Zhao S, Zuo Y, Yang Y, Wu Y: Functional validation of cadherin as a receptor
 of Bt toxin Cry1Ac in *Helicoverpa armigera* utilizing the CRISPR/Cas9 system. Insect Biochemistry
 and Molecular Biology 2016, 76:11-17.
- 54. Dermauw W, Wybouw N, Rombauts S, Menten B, Vontas J, Grbić M, Clark RM, Feyereisen R, Van
 Leeuwen T: A link between host plant adaptation and pesticide resistance in the polyphagous
 spider mite Tetranychus urticae. Proceedings of the National Academy of Sciences of the United
 States of America 2013, 110:E113–E122.
- 367 55. Zhu F, Moural TW, Nelson DR, Palli SR: A specialist herbivore pest adaptation to xenobiotics through
 368 up-regulation of multiple Cytochrome P450s. Scientific Reports 2016, 6:20421.
- 369 56. Zimmer CT, Bass C, Williamson MS, Kaussmann M, Wölfel K, Gutbrod O, Nauen R: Molecular and
 370 functional characterization of CYP6BQ23, a cytochrome P450 conferring resistance to
 371 pyrethroids in European populations of pollen beetle, *Meligethes aeneus*. Insect Biochemistry
 372 and Molecular Biology 2014, 45:18-29.
- 57. Shi Y, Wang H, Liu Z, Wu S, Yang Y, Feyereisen R, Heckel DG, Wu Y: Phylogenetic and functional
 characterization of ten P450 genes from the CYP6AE subfamily of *Helicoverpa armigera* involved
 in xenobiotic metabolism. *Insect Biochemistry and Molecular Biology* 2018, 93:79-91.
- S8. Nauen R, Wölfel K, Lueke B, Myridakis A, Tsakireli D, Roditakis E, Tsagkarakou A, Stephanou E, Vontas
 J: Development of a lateral flow test to detect metabolic resistance in *Bemisia tabaci* mediated
 by CYP6CM1, a cytochrome P450 with broad spectrum catalytic efficiency. *Pesticide Biochemistry* and Physiology 2015, 121:3-11.
- 380 59. Black IV WC, Vontas JG: Affordable assays for genotyping single nucleotide polymorphisms in insects.
 381 Insect Mol Biol 2007, 16:377-387.
- 382 60. Blaser S, Diem H, von Felten A, Gueuning M, Andreou M, Boonham N, Tomlinson J, Muller P, Utzinger
 383 J, Frey B, et al.: A Loop-mediated Isothermal Amplification (LAMP) Assay for Rapid Identification
 384 of *Bemisia tabaci*. J Vis Exp 2018, 140:e58502.
- Bronzato Badial A, Sherman D, Stone A, Gopakumar A, Wilson V, Schneider W, King J: Nanopore
 Sequencing as a Surveillance Tool for Plant Pathogens in Plant and Insect Tissues. *Plant Dis* 2018,
 102:1648-1652.

- 388 62. Phelan S, Barthe MS, Tobie C, Kildea S: Detection of the cytochrome b mutation G143A in Irish
 389 *Rhynchosporium commune* populations using targeted 454 sequencing. *Pest Manag Sci* 2017,
 390 73:1154-1160.
- 391 63. Shu C, Su H, Zhang J, He K, Huang D, Song F: Characterization of cry9Da4, cry9Eb2, and cry9Ee1 genes
 392 from *Bacillus thuringiensis* strain T03B001. *Appl Microbiol Biotechnol* 2013, 97:9705-9713.
- 393 64. Zink FA, Tembrock LR, Timm AE, Farris RE, Perera OP, Gilligan TM: A droplet digital PCR (ddPCR) assay
 394 to detect *Helicoverpa armigera* (Lepidoptera: Noctuidae) in bulk trap samples. *PLoS One* 2017,
 395 12:e0178704.
- 396 65. Mavridis K, Wipf N, Medves S, Erquiaga I, Müller P, Vontas J: Rapid multiplex gene expression assays
 397 for monitoring metabolic resistance in the major malaria vector Anopheles gambiae. Parasites
 398 & Vectors 2019, 12:9.
- 66. Mavridis K, Wipf N, Müller P, Traoré MM, Muller G, Vontas J: Detection and Monitoring of Insecticide
 Resistance Mutations in Anopheles gambiae: Individual vs. Pooled Specimens. Genes 2018,
 9:479.
- 402 67. Moores GD, Ffrench-Constant RH, Devonshire AL: Immunoassay for detecting insecticide resistance
 403 in aphids. *Pesticide Science* 1989, 26:324-326.
- 404

405 Annotated references

- 406 ***Vontas and Mavridis 2019** (ref 16)
- 407 A critical review on the true value of molecular diagnostic tools for tracking insecticide resistance
- 408 in mosquito vectors.
- 409 ****Riga et al. 2017** (ref 35)
- Using marker-assisted inbreeding, a large number of target-site resistance mutations was introgressed in a susceptible genetic background of *T. urticae*. This allowed to assess the phenotypic strength of a single resistance mutation, not confounded by additional resistance mechanisms, and partly determines its diagnostic value. It also allowed to determine associated fitness costs in a follow-up study, see **Bajda et al.** (ref 38)
- 415 **Zuo et al. 2017** (ref 45)
- 416 The use of CRISPR-Cas9 gene editing to validate (the strength of) a SNP marker, G4946E conferring
- 417 diamide resistance, in a lepidopteran pest species. The mutation was previously validated in the
- 418 genetic model organism *Drosophila* by **Douris et al.** (ref 50)
- 419 ***Dermauw et al. 2013** (ref 54)

420 Adaptation to host plants and pesticides select for similar responses in the polyphagous mite 421 *Tetranychus urticae*, potentially confounding the predictive value of a metabolic marker such as 422 overexpression of a detoxification gene.

423 ****Nauen et al. 2015** (ref 58)

Reports a test kit based on an lateral flow test for the detection of CYP6CM1-based neonicotinoid
resistance in while flies. The kit is as easy to use as a pregnancy test and is validated to provide a
reliable estimate of resistance in populations across the globe.

427 *Bronzato et al. 2018 (ref 61)

The application of nanopore sequencing with the portable MinION variant as a tool for monitoringpathogens in plants and agricultural pests

430 ***Zink et al. 2017** (ref 64)

431 One of the first studies documenting the application of ddPCR for monitoring molecular markers432 in pooled samples of agricultural pests.

433 Figure Legends

434 Figure 1 - Current and future diagnostic assays

435 (A) Test kit box based on lateral flow assay for the detection of CYP6CM-based neonicotinoid resistance in 436 B. tabaci. Test line intensity provides reliable estimation of the presence and approximate levels of 437 resistance. The major advantage of such a test is its user-friendly format allowing its application under 438 field conditions without specialized equipment or training, and the quick availability of the test result 439 within minutes. The test has been successfully validated against a number of neonicotinoid resistant B. 440 tabaci strains and field populations around the globe [58]. (B) Droplet Digital PCR (ddPCR) and (C) Oxford 441 Nanopore: two of the most promising technologies for future use in monitoring insecticide resistance in 442 agricultural pests. Both can be used for pooled samples. Major additional advantages for ddPCR is that it 443 can be used to accurately assay known mechanisms in large bulks of samples with high sensitivity and 444 specificity. Additional advantages for Oxford Nanopore are the deep sequencing capabilities, the 445 identification of potential novel mutations and the practicality of portable, "field-friendly" variants 446 (MinION Nanopore).

- 447 Tables
- 448 Table 1 Geographical distribution of major target-site resistance mutations across *T. urticae* 449 populations
- 450 Table 2 Current and future molecular diagnostic methods for assessing agricultural pest resistance
- 451
- 452 Supplementary Tables
- 453 **Table S1 Table 1 with references**
- 454

No conflict of interest

Figure1





С





sample into droplets



low target high target read droplets: thousands of distinct cycle droplets (PCR) fluorescence measurements





2



specific electrical signal caused by each nucleotide blocking ion flow in nanopore

target-site	resistance mutation	phenotypic strength ¹	fitness cost? ²	geographical distribution North-				
				Europe	Asia	America	Oceania	Africa
AChE	G119S	n.i.	n.i.	\checkmark	\checkmark	-	√3	-
	F331W/Y	n.i.	n.i.	\checkmark	\checkmark	\checkmark	√3	\checkmark
VGSC	M918L+F1534S	n.i.	n.i.	-	-	\checkmark	-	-
	F1534S+F1538I	n.i.	n.i.	-	-	\checkmark	-	-
	L1024V	strong	no	\checkmark	\checkmark	-	$\sqrt{3}$	\checkmark
	F1538I	strong	n.i.	\checkmark	\checkmark	\checkmark	-	\checkmark
CHS1	I1017F	strong	yes	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
cytB	G132A	strong	yes	\checkmark	-	-	-	-
	G126S+A133T	strong	n.i.	\checkmark	-	-	-	-
	G126S+I136T	n.i.	n.i.	\checkmark	-	-	-	-
	G126S+S141F	strong	n.i.	\checkmark	-	-	-	-
	I260V+N326S	n.i.	n.i.	-	\checkmark	-	-	-
	P262T	moderate	no	\checkmark	\checkmark	-	-	-
GluCl1	G314D	weak	yes	\checkmark	\checkmark	-	-	-
GluCl3	G326E	weak	yes	\checkmark	\checkmark	-	-	\checkmark
PSST	H92R	moderate	n.i.	\checkmark	-	-	-	-

Table 1 - Geographical distribution of major target-site resistance mutations across*T. urticae* populations.Additional references can be found in Table S1.

¹ based on [35-37]: n.i., not investigated

² based on [36,38]: n.i., not investigated; "no" should be interpreted as not detected under the conditions of [38]

³ mutation was detected in a lab strain

Pro (+) / Contra (-) Methods Category Application Examples **Currently used molecular diagnostics** AS-PCR 'Low-tech' PCR-T, D + Applicable to basic laboratory settings [59] PCR-RFLP based + Low-cost, simple - Low specificity (AS-PCR) - Low throughput - High protocol run time TagMan 'Hi-tech' PCR-T, Q + High-throughput [59,63] **HRM** analysis based Μ + Easy protocol and result interpretation - High capital cost (machine, equipment) Direct sequencing/ T, D + Detection of unknown resistance mutations **PCR-Sequencing** [62] Pyrosequencing - No quantitative information - High capital and per reaction cost - Multi-step complicated protocol, not suitable for large sample size + No requirement for thermal cycler; Low cost LAMP Isothermal T, D [60] amplification + Easy, rapid one-step protocol; "Naked-eye" result determination + Rugged, field-friendly variants can be developed - Complex and restrictive assay design - No quantitative information/ low specificity for SNPs Promising molecular diagnostics for future use Direct-in-lysate analysis Multiplex direct T, Q + Compatibility with most gPCR platforms [16] coupled with lyophilized Tagman (RT) Μ + Fast, with minimum handling: all reagents in a single pellet pellets qPCR + Multiplexing capability - High capital cost for qPCR machine - Needs calibration for quantification **Droplet Digital PCR** Third generation T, Q + Extremely accurate and sensitive [64] (ddPCR) PCR Μ + Simplified analysis and experimental procedure + No calibration or controls needed for quantification - High capital and per-assay cost

Table 2 - Current and future molecular diagnostic methods for assessing agricultural pest resistance

T, D: Target-site, Detection of mutations; T, Q: Target-site, Quantification of mutation frequency (pooled samples); M: Metabolic resistance; AS: Allele Specific; HRM: High Resolution Melting; LAMP: Loop mediated isothermal amplification; RFLP: Restriction Fragment Length Polymorphism

+ High-throughput

+ Deep sequencing (RNA-, DNA-seq) capabilities

+ Portable, "field-friendly" variants (MinION Nanopore)

+ Identification of potential novel mutations

- Requires complicated bioinformatic analysis

[61]

Third generation

sequencing

Nanopore sequencing

T, Q

Μ

Box 1 - Factors affecting the diagnostic value of a molecular marker for IRM

- Intensity of underlying resistance phenotype associated with the marker (how much is the phenotype determined by a single marker)
- Geographic distribution of the marker (on what scale do resistance mechanisms vary)
- Cross spectrum resistance predictive value of the marker
- Epistasis and how many resistance markers are required for diagnosis in each case.
- Untangle gene expression patterns associated with resistance and host plant (detoxification enzymes can be overexpressed after adaptation to pesticides and plant allelochemicals)
- Dominance and fitness cost of the resistance marker
- Robustness, accuracy and cost effectiveness of diagnostic assay to capture the marker

Resistance monitoring is not common practice in agriculture Molecular markers can be a crucial tool in resistance management of agricultural pests Strength and predictive value of a diagnostic marker depends on many factors New technologies (MinION, ddPCR) will allow to determine mutation frequency at low levels Click here to access/download Supplementary Material Table_S1.docx