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High throughput crop phenotyping systems

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Annotation. In this paper, the analysis of systems of high-performance phenotyping of agricultural crops is carried out. Systems based on mobile robots, unmanned aerial vehicles and software and hardware systems were considered. It is shown that despite the fact that there are ready-made solutions on the market, they do not cover the entire range of tasks.

Key words: phenotyping, selection, robotics

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