VisualAI: A Framework for Interactive Abstract Interpretation

Jung Hyun Kim

SoftSec Lab., KAIST

IS661 Spring, 2024

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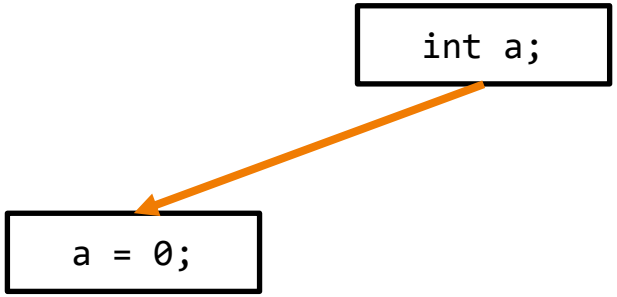

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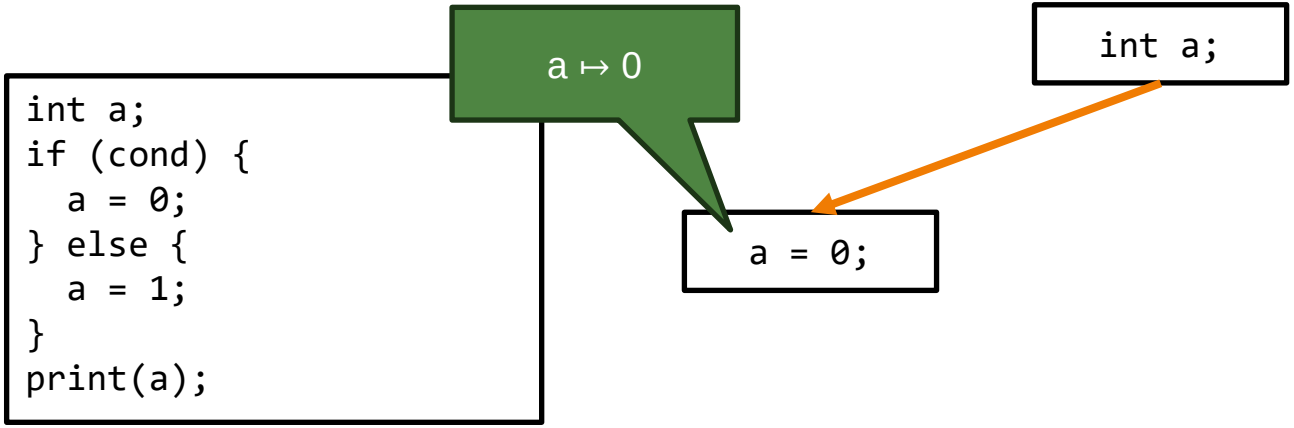

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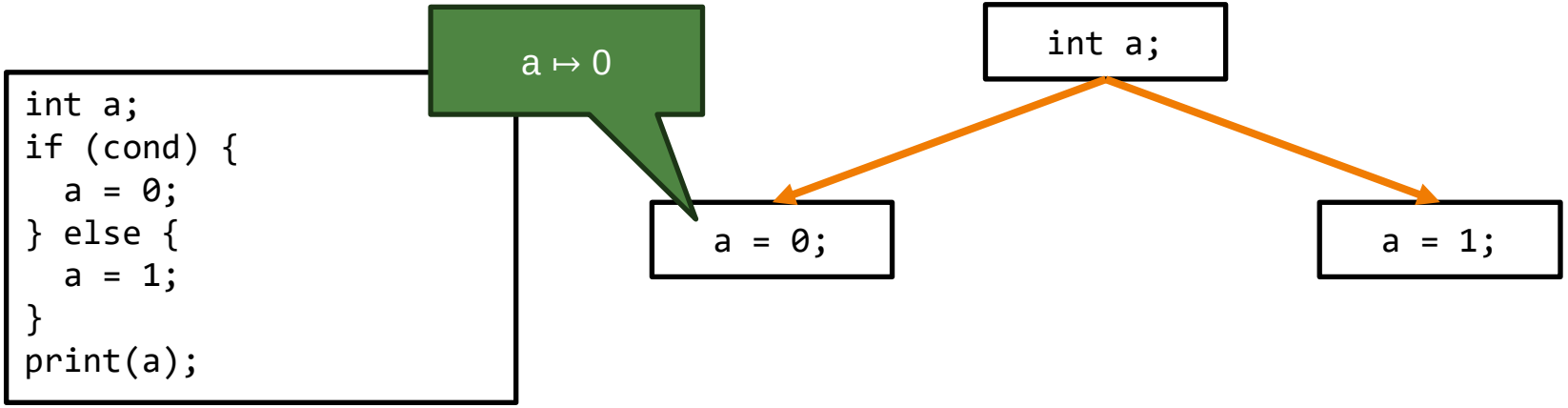

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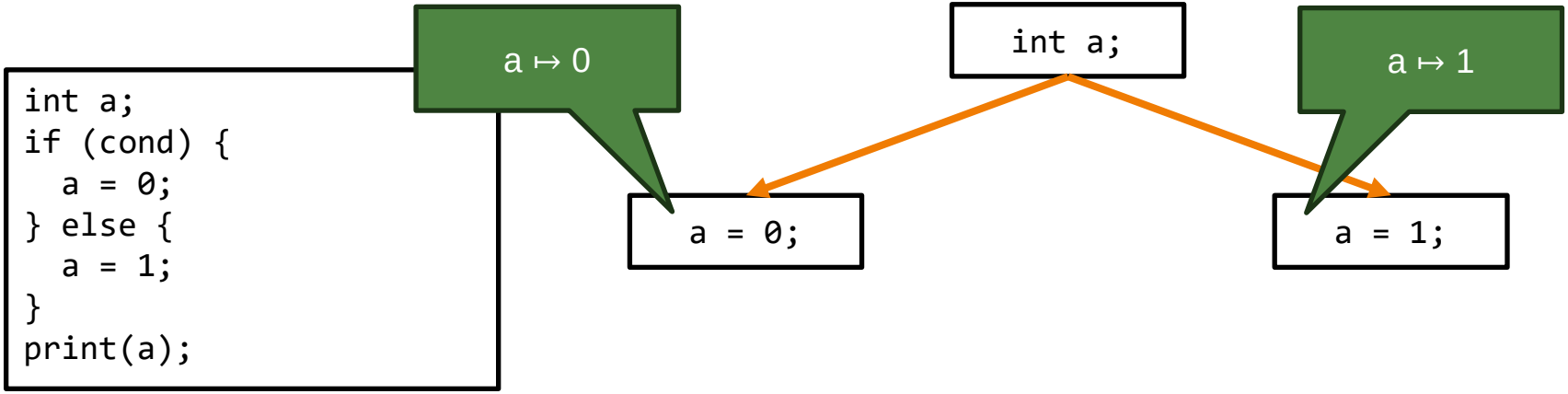

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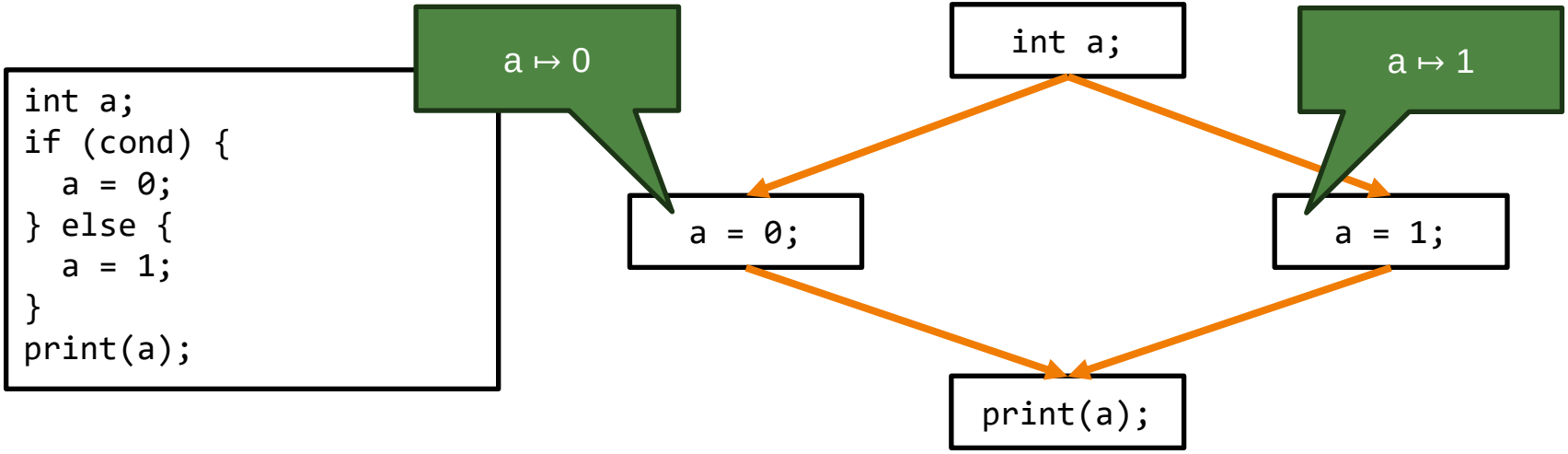

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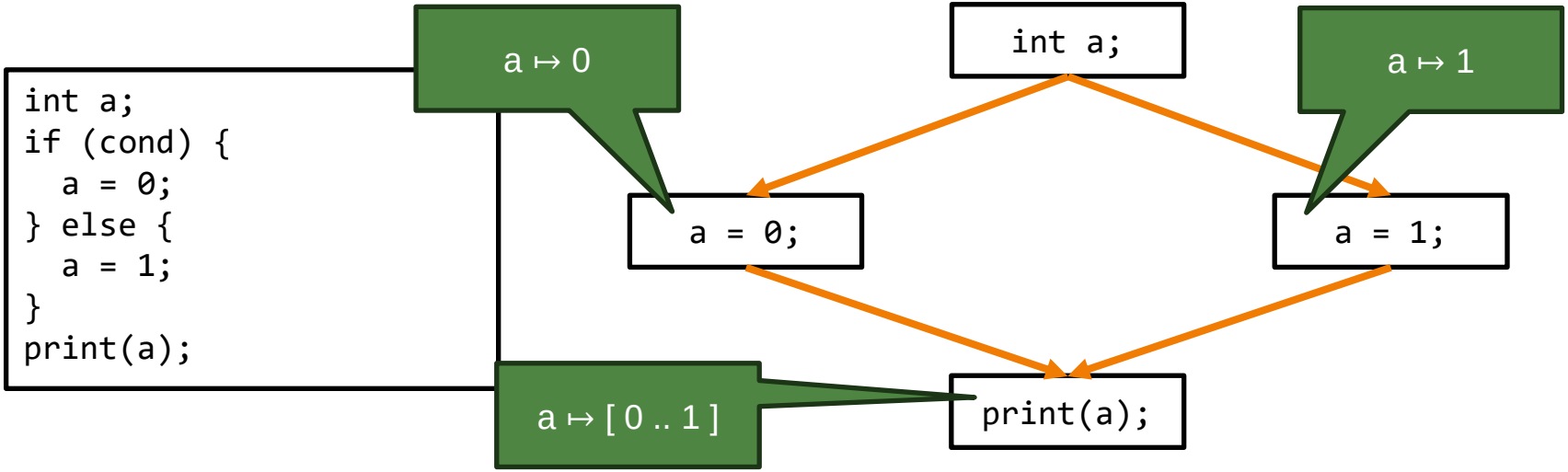

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- It helps people understand the internals of an AI.
  - Using *VisualAI*, we found several bugs in our binary analyzer.

A Demo Video

Technical Details

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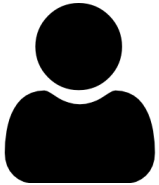

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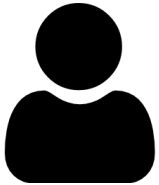

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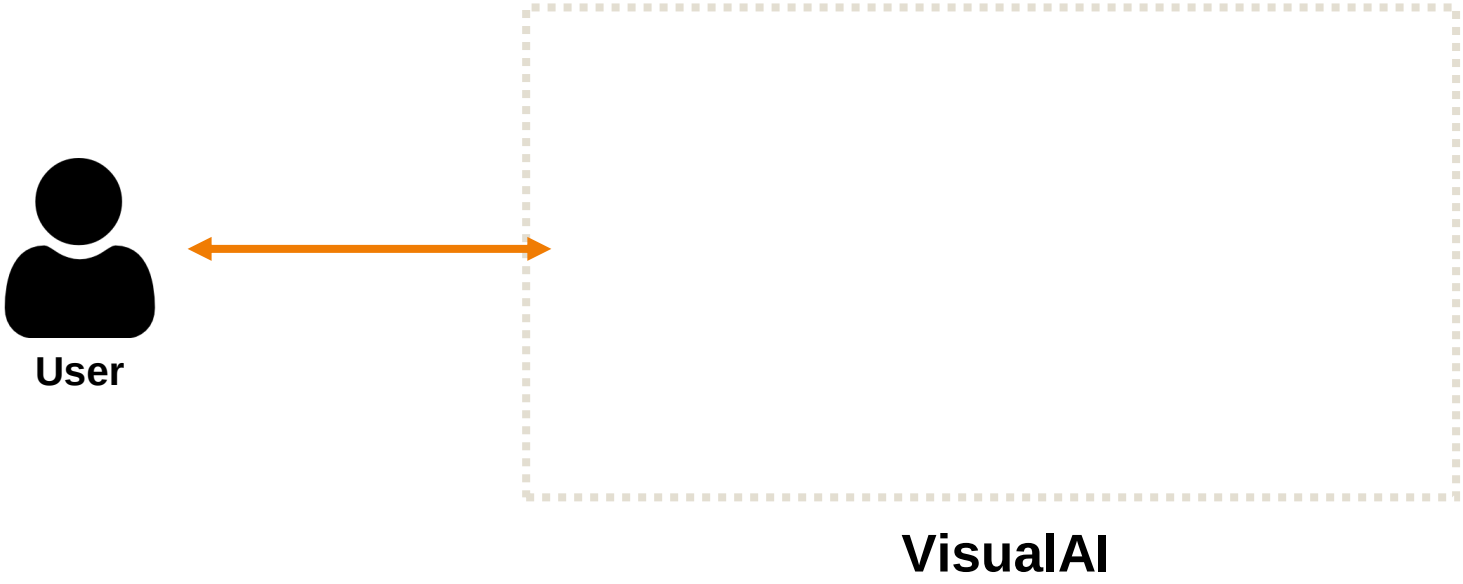

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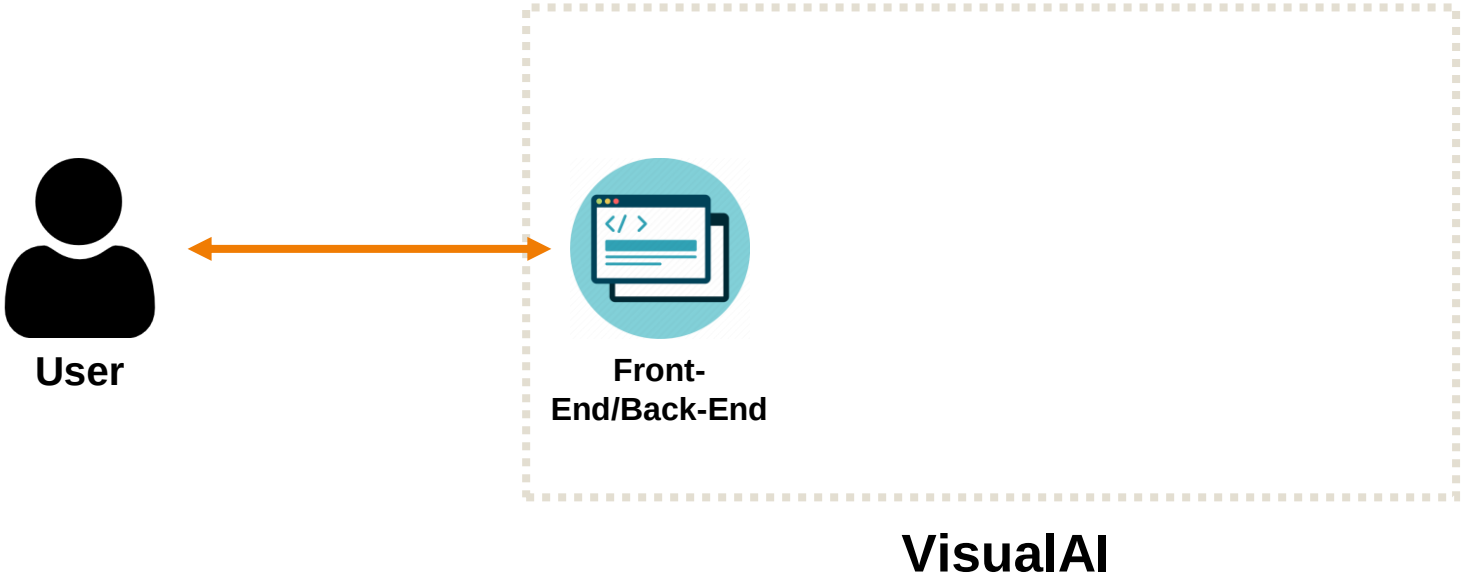

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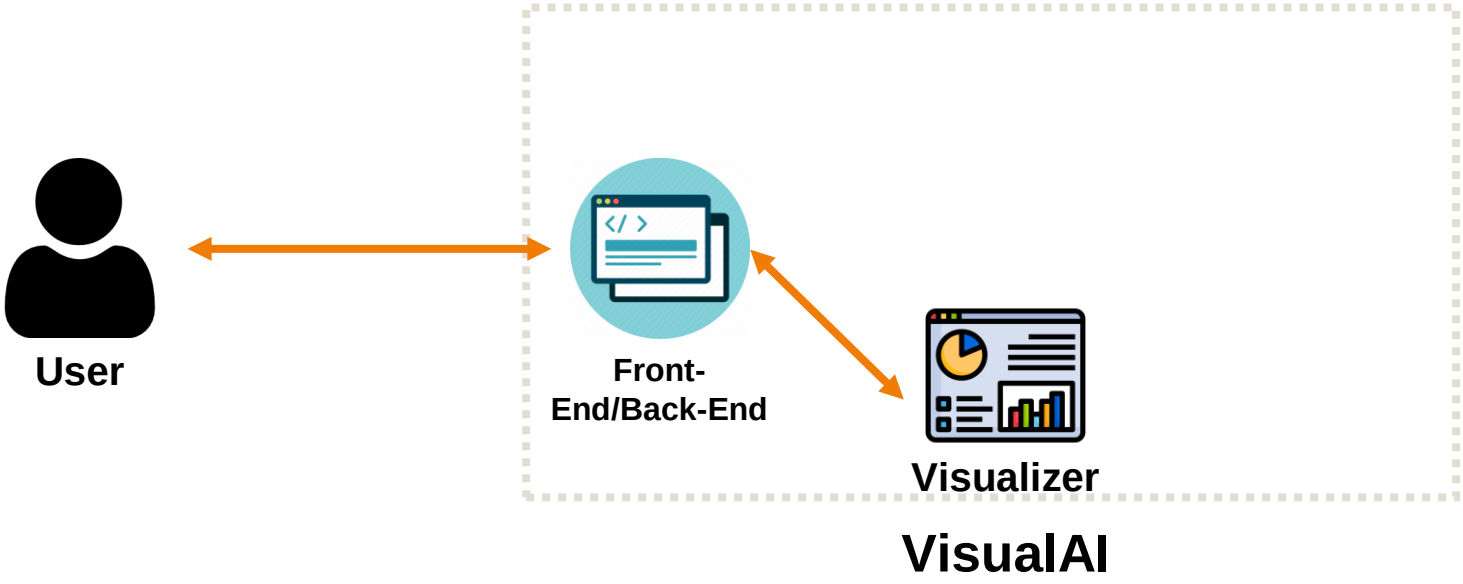

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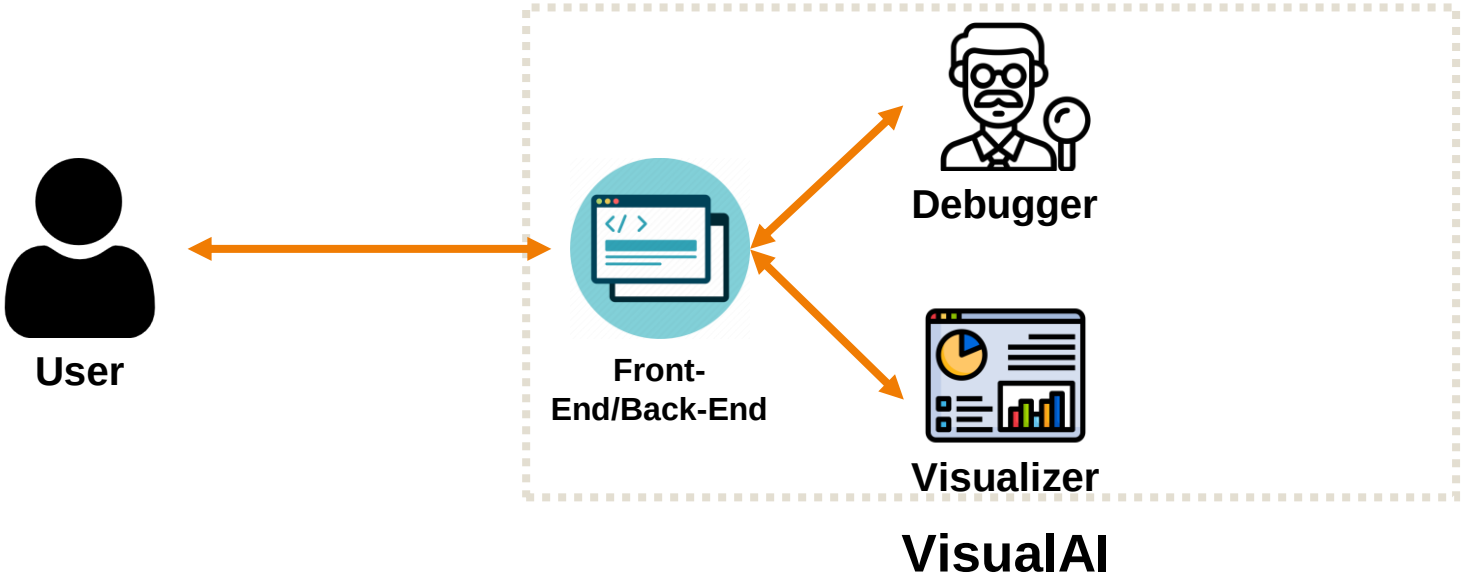

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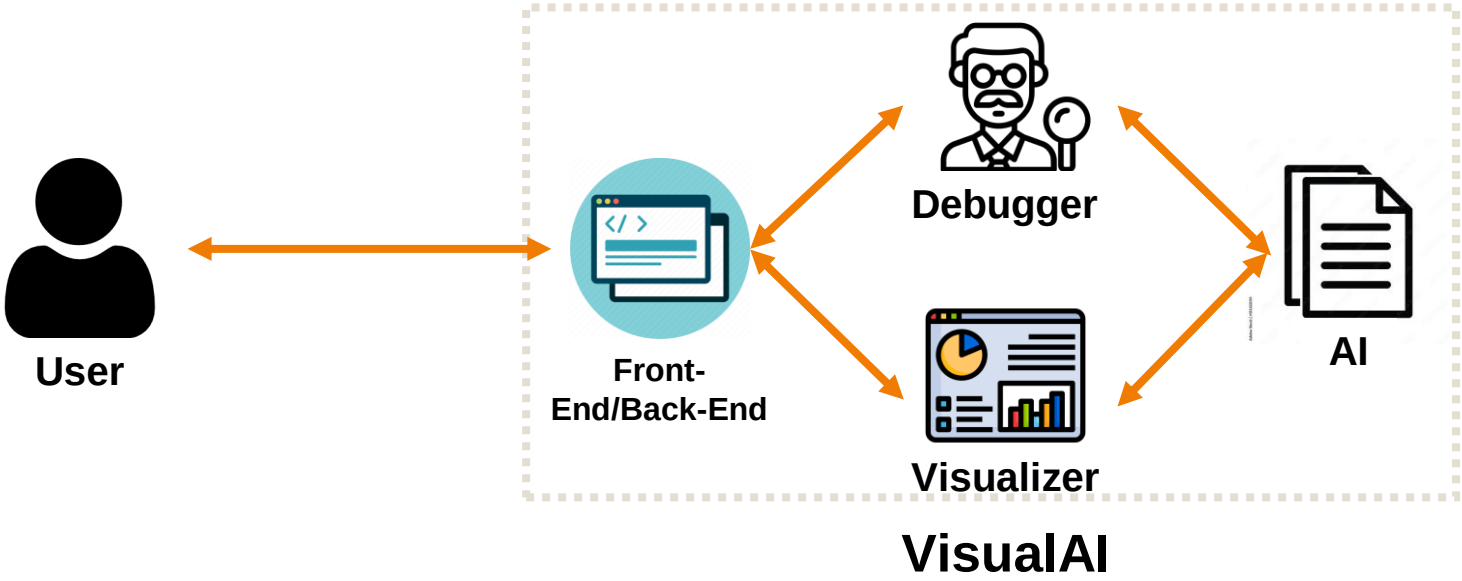

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- With VisualAI, it was easy to track causes of the bugs.

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Question?