

# Utilizing Parallel Workers: LLVM's Vectorization Plan

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## Abstract

Lorem ipsum.

## 1 Introduction

1. Modern CPUs (SIMD-Registers, SIMD ISAs)
2. SIMD performance gains
3. Auto-Vectorization to help programmers better utilize SIMD functionality out of the box
4. LLVM as popular, platform-agnostic compiler framework
5. auto-vectorization complexity → wish for well designed, interoperable system (VPlan) → ongoing 8 year long effort started by Intel

## 2 Background

1. Vectorization explanation (with Code-Examples)
  - Loop-Level Vectorization (Inner / Outer-Loops [? ? ? ? ?])
  - Function Vectorization [? ]
  - Superword-Level Parallelism Vectorization [? ] (maybe already [? ])
2. Vectorization Drawbacks [? ? ] (reuse code-examples from above)
  - not always legal / applicable, e.g.: backwards data-dependencies, pointer aliasing, platform backwards-compatibility / support, control flow complexity (function calls, register pressure), FP inaccuracies (-ffast-math)
  - possible performance loss, e.g.: costly conversions (horizontal aggregations, integer division) resulting in slower overall code on average
  - larger code size, e.g.: need for scalar loop-tail / epilogue
  - (potential security vulnerabilities [? ])
3. OpenMP (very short)
4. Auto-Vectorization in Compilers (short)
5. LLVM (very brief introduction) [? ]

6. LLVM 'recent' transition from Loop Vectorizer + SLP Vectorizer to Vectorization Plan (ongoing 8 year long refactoring and improvement effort started by Intel)

## 3 LLVM's Vectorization Plan

Overview [? ? ? ? ? ? ? ?]

1. Phase 1: Legality
2. Phase 2: Planning (Vectorization Plans)
  - a. Building initial VPlan based on Phase 1 Constraints (Generate one or more up-to-date Code Examples for VPlan similar to [? ? ? ]) → Explain different components (e.g.: VPBasicBlock, VPRegionBlock, etc.) and correlation between generated VPlan structure, original scalar code. Show some general optimizations.
  - b. Modelling Cost (related work? already adopted? [? ])
  - c. Optimizing/Transforming VPlans
3. Phase 3: Execution - Materialize best VPlan

## 4 Related Work

1. Other auto-vectorization algorithms / possible improvements [? ? ? ? ?]  
Some of those should already be (partially) implemented in LLVM
2. Auto-Vectorization in GCC [? ? ]
3. Comparison with GCC [? ? ]
4. (Polyhedral compilation techniques [? ])
5. (LLM-based Vectorization [? ])

## 5 Summary and Future Work

1. VPlan Summary [? ? ]
2. VPlan Future Roadmap [? ? ] (e.g.: combining outer-/inner-loop paths, full function vectorization, etc.)
3. (Comparison/Outlook auto-vectorization and explicit vectorization [? ? ? ]) ([? ] only in chinese?)

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