

# Matrix Multiplication-Driven Repulsive Fields for 3D Voxel-Based Robotic Manipulator Path Planning

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*Abstract—*

## I. INTRODUCTION

## II. RELATED WORKS

## III. REPULSIVE FIELD CALCULATION

We want the repulsive field to push in any point of the space away from the obstacles / towards the direction away from all surrounding obstacles.

The operating environment is modelled by discrete voxels. As the robots environment can dynamically change, we propose a method that looks at the surrounding space of the robot and calculates these direction away from all the surrounding obstacles in real time. We only look in a predefined area / perimeter around the robot.

### A. AREA SELECTION

### B. CONVOLUTIONAL KERNELS

### C. 3D INTERPOLATION

## IV. INVERSE KINEMATICS

## V. REPULSIVE VELOCITIES CALCULATION

## VI. SIMULATION RESULTS

## VII. CONCLUSION

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