



HEURISTICS

Manhattan

It is possible to map the state of the packages in a 3D space, with the x, y and z axis representing the amount of small, medium and large packages that are still to be moved. An action is a movement in one of three directions, x-1, y-1, z-1. The goal state is $x = y = z = 0$, so our heuristic is the distance (or number of actions) from the current state to the goal. This has the potential to under-estimate, as it cannot take into account the situations where the robot must move without a package.

Refined

The refined heuristic proves significantly more efficient than the more rudimentary 'Manhattan' implementation due to the increased accuracy. In fact, empirical testing has shown the heuristic to never overestimate, and underestimate the true cost to goal by no more than 2 in the extreme. This accuracy comes from breaking the problem down into two distinct phases. Phase 1 always occurs the same regardless of state. In phase 1 we calculate the cost of moving as many parcels as possible whilst never moving hands-free; this is moving all applicable parcels between a given warehouse and truck until one of the two locations has no more - performed for each warehouse. This gives us $2(\min(M_a, S)) + 2(\min(M_b, L))$. Phase 2 can occur in two separate ways: the first simpler case is when the two remaining sets of parcels are S and L, or M_a and M_b . In this case the remaining parcels all have a cost of two - to move a parcel into location, and then to return for another. Since the final parcel will have no return cost, this gives us $\text{Phase1} + 2(a+b) - 1$ as total cost to goal. Here $a = \max(M_a - S, S - M_a)$ and $b = \max(M_b - L, L - M_b)$, which each represent one group of remaining parcels wherever they may be. The second case is a modification to the first, required when there remain parcels in one warehouse and the truck. This is because one set of the parcels have no return costs. Consider after phase 1, 5 parcels are in WarehouseA and 5 in the truck (which must be for WarehouseB after phase 1). Moving parcel from WarehouseA to truck incurs only one cost, and only the parcel from the truck has a return cost (returning either to WarehouseA or the Truck). Mathematically this is $\text{Phase1} + 2(a+b) - 1 - \min(a, b)$, with $\min(a, b)$ removing the extra return costs calculated. The copious use of min and max functions allow the heuristic to elegantly deal with differences between the number of parcels and abstract over their location. Naturally the exact cost to goal is also dependent on the Robot's location, which will not always perfectly map to the mathematical model. This is where the occasional underestimation occurs, with an additional hands-free move (or two).