

ME 454 Final Project: Optimal Control of Kinematic Ca



(* Cell #1: Quit current Kernal *)

Quit[]

(* Cell #2: Opens communication with iRobot Create and

Define some helpful functions for iRobot Create communication*)

```
tc[n_, bits_: 32] := If[n ≥ 0, IntegerDigits[n, 2, bits],
  1 - IntegerDigits[2^bits - n + 1, 2, bits]] (*two's complement*)
tc2dec[n_] := {FromDigits[n[[1 ;; 8]], 2], FromDigits[n[[9 ;; 16]], 2]}
drive[dev0_, un_] := Module[{utc, udec},
  utc = {tc[un[[1]], 16], tc[un[[2]], 16]};
  udec = Join[tc2dec[utc[[1]]], tc2dec[utc[[2]]]];
  DeviceWrite[dev0, Join[{145}, udec]];
];
(* Apple/Linux*)
room = DeviceOpen["Serial", {"dev/ttyUSB0", "BaudRate" → 115200}]
(* Windows *)
(*room=dev=DeviceOpen["Serial",{"COM4","BaudRate"→115200}]*
start = 128;
fullMode = 132;
safeMode = 131;
clean = 135;
max = 136;
spot = 134;
powerdown = 133;
reset = 7;
stop = 173;
park = {137, 0, 0, 0, 0};
DeviceWrite[room, start];
DeviceWrite[room, fullMode];
Pause[0.01]
DeviceWrite[room, {164, 72, 73, 94, 94}];
DeviceWrite[room, {139, 0, 0, 255}];
```

DeviceObject[ Class: Serial ID: 1
Status:  Not connected (/dev/ttyUSB0)]

Quit[];

(* Cell #3: iLQR*)

(* Define variables, dynamics, and initial conditions *)

(*States, Inputs, Desired Trajectory*)

q = {x[t], y[t], θ [t], v1[t], v2[t]};

qdot = D[q, t];

u = {u1, ur};

qd = {t/5, 0.001, 0, 0, 0};

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qdT = {3., 0, 0, 0, 0};
obsxy = {1., 0};
obsxy2 = {2., 0};

(*Dynamics*)
f[u_] := {0.001*0.5*(q[[4]]+q[[5]])*Cos[q[[3]]],
  0.001*0.5*(q[[4]]+q[[5]])*Sin[q[[3]]], 0.001*(q[[4]]-q[[5]])/(0.235),
  15*(u[[1]]-q[[4]]), 15*(u[[2]]-q[[5]])}
A = D[f[u], {q}];
B = D[f[u], {u}];

(*IC*)
u0 = {50., 50.};
q0 = {0., 0., 0., 0., 0.};
initCon = Thread[(q /. t → t0) == q0];

t0 = 0.;
tf = 30.;
initSol = NDSolve[Join[Thread[qdot == f[u0]], initCon], q[[]; , 0]], {t, t0, tf}];
ξ[0] = {initSol[[1]], Thread[u → u0]};

(*Cost*)
R = 0.0001*IdentityMatrix[Length@u];
Q = 0.001*IdentityMatrix[Length@q];
Q[[3, 3]] = 0;
Q[[4, 4]] = 0;
Q[[5, 5]] = 0;
(*TERMINAL CONDITION MATTERS A LOT*)
P1 = 10 000*IdentityMatrix[Length@q];
P1[[3, 3]] = 0;
P1[[4, 4]] = 0;
P1[[5, 5]] = 0;
obsW = 1; (*AVOIDING OBSTACLES IS ALSO IMPORTANT*)

(* Simulate System *)
forwardSim[t0_, tff_, contr_] :=
  NDSolve[Join[Thread[qdot == f[contr]], initCon], q[[]; , 0]], {t, t0, tf}];

(* Variable Definitions*)
Z = Table[z[i][t], {i, 1, Length@q}];
dZ = D[Z, t];
zinit = Thread[(Z /. t → 0) == ConstantArray[0, Length@q]];
Ps = Table[P[i, j][t], {i, 1, Length@q}, {j, 1, Length@q}];
dPs = D[Ps, t];
(*Pinit = Thread[Flatten@(Ps /. t → tf) == Flatten@(0*IdentityMatrix[Length@q])];*)
Pinit = Thread[Flatten@(Ps /. t → tf) == Flatten@P1];
rs = Table[r[i][t], {i, 1, Length@q}];
drs = D[rs, t];

```

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(*rinit = Thread[Flatten@(rs/.t→tf)== ConstantArray[0,Length@q]];*)
rinit[ξ0_] := Thread[Flatten@(rs /. t → tf) ==
  P1.((q /. forwardSim[t0, tf, u /. ξ0[[2]]] /. t → tf)[[1]] - (qdT))];

(* Compute
  Cost: ADDED TERMS FOR TERMINAL CONDITION AND BARRIER FUNCTIONS FOR OBSTACLES *)
calcCost[ξ0_] := NIntegrate[0.5 * (q - qd).Q.(q - qd) /. Flatten@ξ0, {t, t0, tf},
  MaxRecursion → 20, Method → {Automatic, "SymbolicProcessing" → False}] +

  NIntegrate[0.5 * u.R.u /. Flatten@ξ0, {t, t0, tf},
  MaxRecursion → 20, Method → {Automatic, "SymbolicProcessing" → False}] +

  0.5 * ((q /. forwardSim[t0, tf, u /. ξ0[[2]]] /. t → tf)[[1]] - (qdT)).
  P1.((q /. forwardSim[t0, tf, u /. ξ0[[2]]] /. t → tf)[[1]] - (qdT)) +

  NIntegrate[
    (obsW * Abs@Log[Abs[(q[[1]] - obsxy[[1]])^2 + (q[[2]] - obsxy[[2]])^2 - 0.225]]) /.
    Flatten@ξ0, {t, t0, tf}, MaxRecursion → 20,
    Method → {Automatic, "SymbolicProcessing" → False}] +

  NIntegrate[
    (obsW * Abs@Log[Abs[(q[[1]] - obsxy2[[1]])^2 + (q[[2]] - obsxy2[[2]])^2 - 0.225]]) /.
    Flatten@ξ0, {t, t0, tf}, MaxRecursion → 20,
    Method → {Automatic, "SymbolicProcessing" → False}];

(* Computed dJ *)
dJ[at0_, bt0_, ξ0_] := NIntegrate[at0.ξ0[[1]] + bt0.ξ0[[2]], {t, t0, tf},
  MaxRecursion → 20, Method → {Automatic, "SymbolicProcessing" → False}]

(* Saturate Input *)
sat[un_] := If[Abs[un] > 500, Sign[un] * 500, un];

(* Compute Descent Direction *)
descDir[ξ0_, At_, Bt_, at_, bt_] := Module[{ricsol, Psol, rsol, v, zeq, zsol, c},
  ricsol = solveRic[ξ0, At, Bt, at, bt, R, Q];
  Psol = ricsol[[1]];
  rsol = ricsol[[2]];
  v = -Inverse[R].(bt + BtT.Psol.Z + BtT.rsol);
  zeq = Thread[dZ == At.Z + Bt.v];
  zsol = NDSolve[Join[zeq, zinit], Z[;;, 0]], {t, t0, tf}];
  c = Table[ListInterpolation[Table[v[[iter]] /. zsol[[1]], {t, t0, tf, 0.01}],
    {{t0, tf}}][t], {iter, 1, Length@v}];
  Return[{Z /. zsol[[1]], c}]
]

(* Solve Riccati Equations *)
solveRic[ξ0_, A0_, B0_, a0_, b0_, R0_, Q0_] :=
  Module[{Peq, eq1, eq2, req, sol, Psol, rsol},
    Peq = -(A0T.Ps + Ps.A0 - Ps.B0.Inverse[R0].B0T.Ps + Q0);

```

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eq1 = Thread[Flatten@dPs == Flatten@Peq];
req = -((A0 - B0.Inverse[R0].B0T.Ps)T.rs + a0 - Ps.B0.Inverse[R0].b0);
eq2 = Thread[Flatten@drs == Flatten@req];
sol = NDSolve[Join[eq1, eq2, Pinit, rinit[ξ0]],
  Join[(Flatten@Ps)[[;;, 0]], rs[[;;, 0]]], {t, t0, tf}];
(*sol = NDSolve[Join[eq1, eq2, Pinit, rinit],
  Join[(Flatten@Ps)[[;;, 0]], rs[[;;, 0]]], {t, t0, tf}];*)
Psol = Ps /. sol[[1]];
rsol = rs /. sol[[1]];
Return[{Psol, rsol}]
]

(* Update trajectory along Descent Direction *)
updatetrajectory[ξ0_, ξ0_, γ0_] :=
Module[{ricsol, an, bn, infx, infu, K, sol, contr, c},
  contr = (u /. ξ0[[2]]) + γ0 * ξ0[[2]];
  contr = {sat[contr[[1]]], sat[contr[[2]]]};
  sol = forwardSim[t0, tf, contr];
  c = Table[ListInterpolation[Table[contr[[iter]] /. sol[[1]], {t, t0, tf, 0.01}],
    {{t0, tf}}][t], {iter, 1, Length@contr}];
  Return[{sol[[1]], Thread[u → c]}]
]

(*Debugging Information*)
Print["Iteration : ", Dynamic@i];
Print["J: ", Dynamic[J]];
Print["dj mag: ", Dynamic[Abs[dj]]];
Print["armijo: ", Dynamic@j];
Print[Dynamic@ParametricPlot[
  {q[[1 ;; 2]] /. ξ[i][[1]], {qdT[[1]] + 0.3 * Sin[t], qdT[[2]] + 0.3 Cos[t]},
  {obsxy[[1]] + 0.1 * Sin[t], obsxy[[2]] + 0.1 Cos[t]}, {obsxy2[[1]] + 0.1 * Sin[t],
  obsxy2[[2]] + 0.1 Cos[t]}], {t, t0, tf}, PlotRange → Full]];

(* Line Search Parameters *)
β = 0.25; tol = 0.0001; α = 0.001; armmax = 25;

i = 0;
(*Max iLQR iterations*)
imax = 11;

(*iLQR Loop*)
While[i < imax,
  At = A /. Flatten@ξ[i];
  Bt = B /. Flatten@ξ[i];
  at = Q.((q - qd) /. ξ[i][[1]]);
  bt = R.(u /. ξ[i][[2]]);
  ξ[i] = descDir[ξ[i], At, Bt, at, bt];
  γ = β;

```

```

ξnew = updatetrajectory[ξ[i], ζ[i], γ];

dj = dJ[at, bt, ζ[i]];
If[Abs[dj] < tol, Break[]];

J = calcCost[ξ[i]];
Jar = J + α * γ * dj;
JP = calcCost[ξnew];
j = 1;

While[JP > Jar,
  If[j > armmax, Break[]];
  γ = β^j;
  ξnew = updatetrajectory[ξ[i], ζ[i], γ];
  JP = calcCost[ξnew];
  Jar = J + α * γ * dj;
  j = j + 1;
];
If[JP < Jar, ξ[i + 1] = ξnew, Break[]];
i++;
];

Iteration : i

J: J

dj mag: Abs[dj]

armijo: j

ParametricPlot[{q[[1 ;; 2]] /. ξ[i][[1]],
  {qdT[[1]] + 0.3 Sin[t], qdT[[2]] + 0.3 Cos[t]}, {obsxy[[1]] + 0.1 Sin[t], obsxy[[2]] + 0.1 Cos[t]},
  {obsxy2[[1]] + 0.1 Sin[t], obsxy2[[2]] + 0.1 Cos[t]}}, {t, t0, tf}, PlotRange -> Full]

```

(*Cell #4: Debugging Plots*)

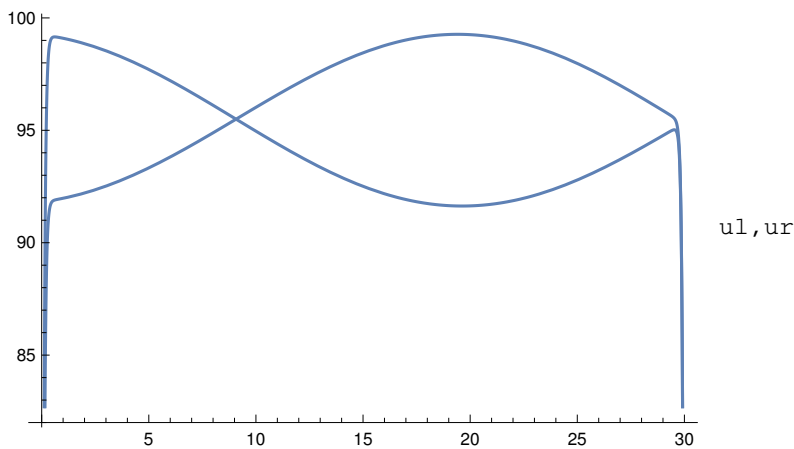
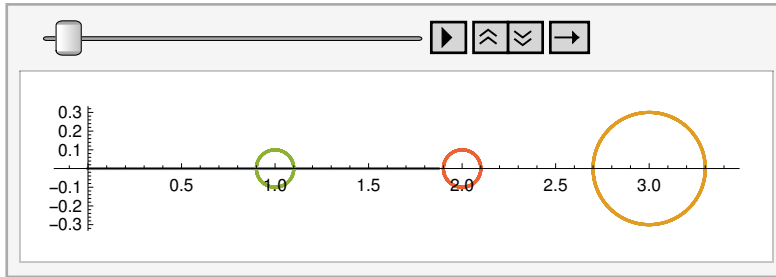
(* Plot optimized trajectory and controls *)

anim =

```
ListAnimate[Table[ParametricPlot[{q[[1 ;; 2]] /.  $\xi[s][[1]]$ , {qdT[[1]] + 0.3 * Sin[t],
  qdT[[2]] + 0.3 Cos[t]}, {obsxy[[1]] + 0.1 * Sin[t], obsxy[[2]] + 0.1 Cos[t]},
  {obsxy2[[1]] + 0.1 * Sin[t], obsxy2[[2]] + 0.1 Cos[t]}},
  {t, t0, tf}, PlotRange -> Full], {s, 1, 11}]
```

(* Plot optimized inputs *)

```
Plot[q[[4 ;; 5]] /.  $\xi[11][[1]]$ , {t, t0, tf}, PlotLegends -> "ul,ur"]
```

**(* Cell #5: Sends the Optimized Control Commands to the Romba*)**

```
control = q[[4 ;; 5]] /.  $\xi[11][[1]]$ 
tt = 0;
dt = 0.1;
While[tt < tf,
  input = (control /. t -> (tt + dt/2));
  inputi = IntegerPart[input];
  drive[room, inputi];
  tt = tt + dt;
  Pause[dt];
]
DeviceWrite[room, park]
```

(* Cell #6: Release control of the iRobot Create and close communication link properly*)

```
DeviceWrite[room, stop];  
DeviceClose[room];
```