### trackerJPDA

Joint probabilistic data association tracker Since R2019a

### **Description**

The trackerJPDA System object™ is a tracker capable of processing detections of multiple targets from multiple sensors. The tracker uses joint probabilistic data association to assign detections to each track. The tracker applies a soft assignment where multiple detections can contribute to each track. The tracker initializes, confirms, corrects, predicts (performs coasting), and deletes tracks. Inputs to the tracker are detection reports generated by objectDetection, fusionRadarSensor, irSensor, or sonarSensor objects. The tracker estimates the state vector and state estimate error covariance matrix for each track. Each detection is assigned to at least one track. If the detection cannot be assigned to any existing track, the tracker creates a new track.

Any new track starts in a *tentative* state. If enough detections are assigned to a tentative track, its status changes to *confirmed* (see the ConfirmationThreshold property). If the detection already has a known classification (i.e., the ObjectClassID field of the returned track is nonzero), that corresponding track is confirmed immediately. When a track is confirmed, the tracker considers the track to represent a physical object. If detections are not assigned to the track within a specifiable number of updates, the track is deleted.

You can enable different JPDA tracking modes by specifying the TrackLogic and MaxNumEvents properties.

- Setting the TrackLogic property to 'Integrated' to enable the joint integrated data association (JIPDA) tracker, in which track confirmation and deletion is based on the probability of track existence.
- Setting the MaxNumEvents property to a finite integer to enable the k-best joint integrated data association (k-best JPDA) tracker, which generates a maximum of k events per cluster.
- Setting the ClassFusionMethod property to "Bayes" to enable detection class fusion.

To track targets using this object:

- 1. Create the trackerJPDA object and set its properties.
- 2. Call the object with arguments, as if it were a function.

To learn more about how System objects work, see What Are System Objects?

#### Creation

#### **Syntax**

```
tracker = trackerJPDA
tracker = trackerJPDA(Name, Value)
```

#### **Description**

tracker = trackerJPDA creates a trackerJPDA System object with default property values.

tracker = trackerJPDA(Name, Value) sets properties for the tracker using one or more name-value pairs. For example,

trackerJPDA('FilterInitializationFcn',@initcvukf,'MaxNumTracks',100) creates a multiobject tracker that uses a constant-velocity, unscented Kalman filter and allows a maximum of 100 tracks. Enclose each property name in quotes.

example

Properties expand all

Unless otherwise indicated, properties are *nontunable*, which means you cannot change their values after calling the object. Objects lock when you call them, and the release function unlocks them.

If a property is tunable, you can change its value at any time.

For more information on changing property values, see System Design in MATLAB Using System Objects.

- > TrackerIndex Unique tracker identifier 0 (default) | nonnegative integer
- FilterInitializationFcn Filter initialization function @initcvekf (default) | function handle | character vector
- > MaxNumEvents Value of k for k-best JPDA
  Inf (default) | positive integer
- > EventGenerationFcn Feasible joint events generation function @jpdaEvents (default) | function handle | character vector
- > MaxNumTracks Maximum number of tracks 100 (default) | positive integer
- > MaxNumSensors Maximum number of sensors 20 (default) | positive integer
- > MaxNumDetections Maximum number of detections Inf (default) | positive integer
- > OOSMHandling Handle out-of-sequence measurement (OOSM)
  'Terminate' (default) | 'Neglect' | 'Retrodiction'
- MaxNum00SMSteps Maximum number of out-of-sequence measurement steps
  3 (default) | positive integer
- > StateParameters Parameters of track state reference frame struct([]) (default) | struct array
- > AssignmentThreshold Detection assignment threshold 30\*[1 Inf] (default) | positive scalar | 1-by-2 vector of positive values

DetectionProbability - Probability of detection > 0.9 (default) | scalar in the range [0,1] InitializationThreshold — Threshold to initialize a track > 0 (default) | scalar in the range [0,1) TrackLogic - Track confirmation and deletion logic type > 'History' (default) | 'Integrated' ConfirmationThreshold — Threshold for track confirmation > scalar | 1-by-2 vector DeletionThreshold — Threshold for track deletion > scalar | real-valued 1-by-2 vector HitMissThreshold — Threshold for registering hit or miss > 0.2 (default) | scalar in the range [0,1] ClutterDensity — Spatial density of clutter measurements > 1e-6 (default) | positive scalar NewTargetDensity — Spatial density of new targets > 1e-5 (default) | positive scalar DeathRate — Time rate of target deaths > 0.01 (default) | scalar in the range [0,1] InitialExistenceProbability — Initial probability of track existence > 0.9 (default) | scalar in the range [0,1] HasCostMatrixInput — Enable cost matrix input > false (default) | true HasDetectableTrackIDsInput - Enable input of detectable track IDs false (default) | true NumTracks — Number of tracks maintained by tracker > nonnegative integer

NumConfirmedTracks — Number of confirmed tracks > nonnegative integer TimeTolerance — Absolute time tolerance between detections > 1e-5 (default) | positive scalar EnableMemoryManagement — Enable memory management properties > false or 0 (default) | true or 1 MaxNumDetectionsPerSensor — Maximum number of detections per sensor > 100 (default) | positive integer MaxNumDetectionsPerCluster - Maximum number of detections per cluster > 5 (default) | positive integer MaxNumTracksPerCluster — Maximum number of tracks per cluster > 5 (default) | positive integer ClusterViolationHandling — Handling of run-time violation of cluster bounds > 'Split and warn' (default)|'Terminate'|'Split' ClassFusionMethod — Class fusion method > "None" (default) | "Bayes" InitialClassProbabilities - Prior class probability distribution for new tracks > 1 (default) | N-element vector of nonnegative scalars that sum to 1 ClassFusionWeight — Weight factor of class fusion > 0.7 (default) | scalar in range [0,1] Usage To process detections and update tracks, call the tracker with arguments, as if it were a function (described here). **Syntax** confirmedTracks = tracker(detections, time) confirmedTracks = tracker(detections, time, costMatrix)

confirmedTracks = tracker( \_\_\_,detectableTrackIDs)

[confirmedTracks,tentativeTracks,allTracks] = tracker(\_\_)

[confirmedTracks,tentativeTracks,allTracks,analysisInformation] = tracker(\_\_)

# **Description**

upda	<pre>irmedTracks = tracker(detections, time) returns a list of confirmed tracks that are ted from a list of detections at the update time. Confirmed tracks are corrected and predicted to pdate time, time.</pre>	
conf	irmedTracks = tracker(detections,time,costMatrix) also specifies a cost matrix.	
To er	nable this syntax, set the HasCostMatrixInput property to true.	
detec	irmedTracks = tracker(,detectableTrackIDs) also specifies a list of expected ctable tracks given by detectableTrackIDs. This argument can be used with any of the ous input syntaxes.	
To er	nable this syntax, set the HasDetectableTrackIDsInput property to true.	
_	firmedTracks,tentativeTracks,allTracks] = tracker( ) also returns a list of tive tracks and a list of all tracks. You can use any of the input arguments in the previous axes.	
also ı	firmedTracks,tentativeTracks,allTracks,analysisInformation] = tracker() returns analysis information that can be used for track analysis. You can use any of the input ments in the previous syntaxes.	
nput A	Arguments	expand all
>	detections — Detection list cell array of objectDetection objects	
>	time — Time of update scalar	
>	${\sf costMatrix}$ — ${\sf Cost\ matrix}$ real-valued $M$ -by- $N$ matrix	
>	detectableTrackIDs — Detectable track IDs real-valued <i>M</i> -by-1 vector   real-valued <i>M</i> -by-2 matrix	
Output	Arguments	expand all
>	<pre>confirmedTracks — Confirmed tracks array of objectTrack objects   array of structures</pre>	
>	tentativeTracks — Tentative tracks array of objectTrack objects   array of structures	

- allTracks All tracks array of objectTrack objects | array of structures
  - analysisInformation Additional information for analyzing track updates structure

## **Object Functions**

To use an object function, specify the System object as the first input argument. For example, to release system resources of a System object named obj, use this syntax:

release(obj) expand all

- > Specific to trackerJPDA
- **>** Common to All System Objects

**Examples** collapse all

 ✓ Track Two Objects Using trackerJPDA

Construct a *trackerJPDA* object with a default constant velocity Extended Kalman Filter and 'History' track logic. Set *AssignmentThreshold* to 100 to allow tracks to be jointly associated.

Open Live Script

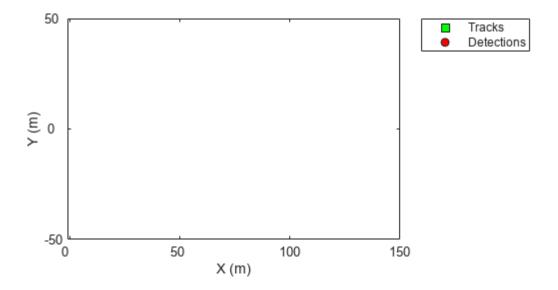
```
tracker = trackerJPDA('TrackLogic','History', 'AssignmentThreshold',100,...
'ConfirmationThreshold', [4 5], ...
'DeletionThreshold', [10 10]);
```

Specify the true initial positions and velocities of the two objects.

```
pos_true = [0 0 ; 40 -40 ; 0 0];
V_true = 5*[cosd(-30) cosd(30) ; sind(-30) sind(30) ;0 0];
```

Create a theater plot to visualize tracks and detections.

```
tp = theaterPlot('XLimits',[-1 150],'YLimits',[-50 50]);
trackP = trackPlotter(tp,'DisplayName','Tracks','MarkerFaceColor','g','HistoryDepth',0);
detectionP = detectionPlotter(tp,'DisplayName','Detections','MarkerFaceColor','r');
```



To obtain the position and velocity, create position and velocity selectors.

```
positionSelector = [1 0 0 0 0 0; 0 0 1 0 0 0; 0 0 0 0 0 0]; % [x, y, 0] velocitySelector = [0 1 0 0 0 0; 0 0 0 1 0 0; 0 0 0 0 0 0]; % [vx, vy, 0]
```

Update the tracker with detections, display cost and marginal probability of association information, and visualize tracks with detections.

```
dt = 0.2;
for time = 0:dt:30
    % Update the true positions of objects.
    pos_true = pos_true + V_true*dt;
    % Create detections of the two objects with noise.
    detection(1) = objectDetection(time,pos_true(:,1)+1*randn(3,1));
    detection(2) = objectDetection(time,pos_true(:,2)+1*randn(3,1));
    \ensuremath{\text{\%}} Step the tracker through time with the detections.
    [confirmed,tentative,alltracks,info] = tracker(detection,time);
    % Extract position, velocity and label info.
    [pos,cov] = getTrackPositions(confirmed,positionSelector);
    vel = getTrackVelocities(confirmed, velocitySelector);
    meas = cat(2,detection.Measurement);
    measCov = cat(3,detection.MeasurementNoise);
    % Update the plot if there are any tracks.
    if numel(confirmed)>0
        labels = arrayfun(@(x)num2str([x.TrackID]),confirmed,'UniformOutput',false);
```

```
trackP.plotTrack(pos,vel,cov,labels);
    end
   detectionP.plotDetection(meas', measCov);
   drawnow;
   % Display the cost and marginal probability of distribution every eight
   if time>0 && mod(time,8) == 0
       disp(['At time t = ' num2str(time) ' seconds,']);
       disp('The cost of assignment was: ')
       disp(info.CostMatrix);
       disp(['Number of clusters: ' num2str(numel(info.Clusters))]);
       if numel(info.Clusters) == 1
           disp('The two tracks were in the same cluster.')
           disp('Marginal probabilities of association:')
           disp(info.Clusters{1}.MarginalProbabilities)
       disp('----')
    end
end
At time t = 8 seconds,
The cost of assignment was:
  1.0e+03 *
   0.0020
             1.1523
   1.2277
             0.0053
Number of clusters: 2
-----
At time t = 16 seconds,
The cost of assignment was:
   1.3968
            4.5123
   2.0747
             1.9558
Number of clusters: 1
The two tracks were in the same cluster.
Marginal probabilities of association:
   0.8344
             0.1656
   0.1656
             0.8344
   0.0000
             0.0000
-----
```

At time t = 24 seconds, The cost of assignment was:

1.2962

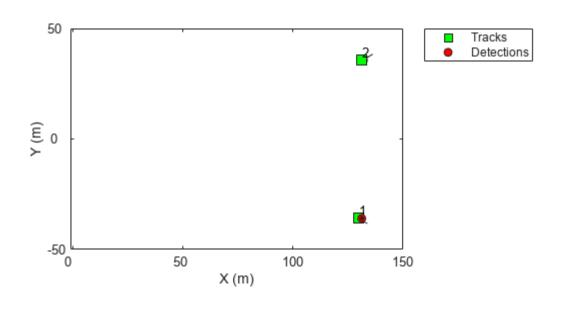
0.0013

1.0e+03 \*

0.0018

1.2664

Number of clusters: 2



### ✓ Detection Class Fusion Using trackerJPDA

Create two objectDetection objects at time t=0 and t=1, respectively. The ObjectClassID of the two detections is 1. Specify the confusion matrix for each detection.

Open Live Script

```
detection0 = objectDetection(0,[0 0 0],...
   ObjectClassID=1,...
   ObjectClassParameters=struct("ConfusionMatrix",[0.6 0.2 0.2; 0.2 0.6 0.2; 0.2 0.2 0.6]));

detection1 = objectDetection(1,[0 0 0],...
   ObjectClassID=1,...
   ObjectClassParameters=struct("ConfusionMatrix",[0.5 0.3 0.2; 0.3 0.5 0.2; 0.2 0.2 0.6]));
```

Create a trackerJPDA object. Set the class fusion method to "Bayes" and specify the initial probability of each class as 1/3.

EventGenerationFcn: 'jpdaEvents'

MaxNumTracks: 100

MaxNumEvents: Inf

MaxNumDetections: Inf
MaxNumSensors: 20

TimeTolerance: 1.0000e-05

AssignmentThreshold: [30 Inf]

InitializationThreshold: 0

DetectionProbability: 0.9000

ClutterDensity: 1.0000e-06

OOSMHandling: 'Terminate'

TrackLogic: 'History'

ConfirmationThreshold: [2 3]

DeletionThreshold: [5 5]

HitMissThreshold: 0.2000

HasCostMatrixInput: false
HasDetectableTrackIDsInput: false

StateParameters: [1x1 struct]

ClassFusionMethod: 'Bayes'

InitialClassProbabilities: [0.3333 0.3333 0.3333]

ClassFusionWeight: 0.7000

NumTracks: 0
NumConfirmedTracks: 0

EnableMemoryManagement: false

Update the track with the first and second detections sequentially.

```
tracker(detection0,0);
[tracks,~,~,info] = tracker(detection1,1);
```

Show the maintained tracks and analysis information.

```
disp(tracks)
```

objectTrack with properties:

TrackID: 1
BranchID: 0
SourceIndex: 0
UpdateTime: 1
Age: 2

State: [6x1 double]
StateCovariance: [6x6 double]
StateParameters: [1x1 struct]

ObjectClassID: 1

ObjectClassProbabilities: [0.7409 0.1530 0.1060]

TrackLogic: 'History'
TrackLogicState: [1 1 0 0 0]

IsConfirmed: 1

```
IsCoasted: 0
               IsSelfReported: 1
             ObjectAttributes: [1x1 struct]
 disp(info)
        OOSMDetectionIndices: [1x0 uint32]
     TrackIDsAtStepBeginning: 1
            UnassignedTracks: [1x0 uint32]
        UnassignedDetections: [1x0 uint32]
                  CostMatrix: 13.8823
                    Clusters: {[1x1 struct]}
         InitializedTrackIDs: [1x0 uint32]
             DeletedTrackIDs: [1x0 uint32]
           TrackIDsAtStepEnd: 1
             ClassCostMatrix: -0.1823
Display the cluster information.
 disp(info.Clusters{:})
          DetectionIndices: 1
                   TrackIDs: 1
          ValidationMatrix: [1 1]
               SensorIndex: 1
                 TimeStamp: 1
     MarginalProbabilities: [2x1 double]
                Likelihood: [2x2 double]
           ClassLikelihood: [2x2 double]
```

Algorithms expand all

- > Tracker Logic Flow
- > Detection Class Fusion for trackerJPDA
- > Feasible Joint Events

#### References

- [1] Fortmann, T., Y. Bar-Shalom, and M. Scheffe. "Sonar Tracking of Multiple Targets Using Joint Probabilistic Data Association." *IEEE Journal of Ocean Engineering*. Vol. 8, Number 3, 1983, pp. 173-184.
- [2] Musicki, D., and R. Evans. "Joint Integrated Probabilistic Data Association: JIPDA." *IEEE transactions on Aerospace and Electronic Systems*. Vol. 40, Number 3, 2004, pp 1093-1099.
- [3] Bar-Shalom, Y., et al. "Tracking with Classification-Aided Multiframe Data Association." *IEEE Transactions on Aerospace and Electronic Systems*, vol. 41, no. 3, July 2005, pp. 868–78.

### **Extended Capabilities**

> C/C++ Code Generation

Generate C and C++ code using MATLAB® Coder™.

# **Version History**

Introduced in R2019a expand all

> R2023a: Fuse detection classification information

### See Also

#### **Functions**

correctjpda|jpdaEvents|getTrackPositions|getTrackVelocities|predictTracksToTime

# **Objects**

objectDetection|trackingKF|trackingEKF|trackingUKF|trackingCKF|trackingIMM|trackingABF|trackHistoryLogic|objectTrack|staticDetectionFuser|trackerTOMHT|trackerGNN

#### **Blocks**

Joint Probabilistic Data Association Multi Object Tracker