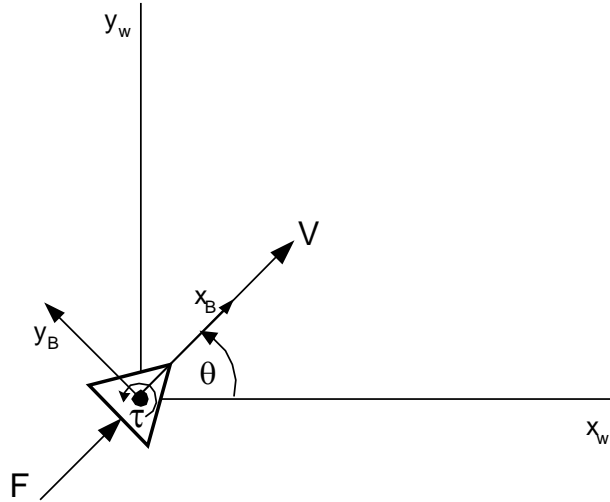


# Behavior-based Control Examples

See paper by Craig Reynolds entitled “Steering Behaviors for Autonomous Characters” for more details.

## Basic Vehicle Dynamics



Translational Dynamics:  $m\dot{V} = F$

Rotational Dynamics:  $I\ddot{\theta} = \tau$

The velocity vector  $\mathbf{V}$  of the vehicle can be represented in a coordinate system attached to the body (i.e. body coordinates) or the world coordinate system (i.e. world coordinates)

$\mathbf{V}_w$  = Velocity vector  $\mathbf{V}$  in world coordinates

$\mathbf{V}_B$  = Velocity vector  $\mathbf{V}$  in body coordinates

Relationship between  $\mathbf{V}_w$  and  $\mathbf{V}_B$ :

$$\mathbf{V}_w = \mathbf{R}(z, \theta) \mathbf{V}_B \quad \text{where } \mathbf{R} \text{ is a z-axis rotation matrix}$$

Vehicle Constraints:

$F_{\max}$  = max force

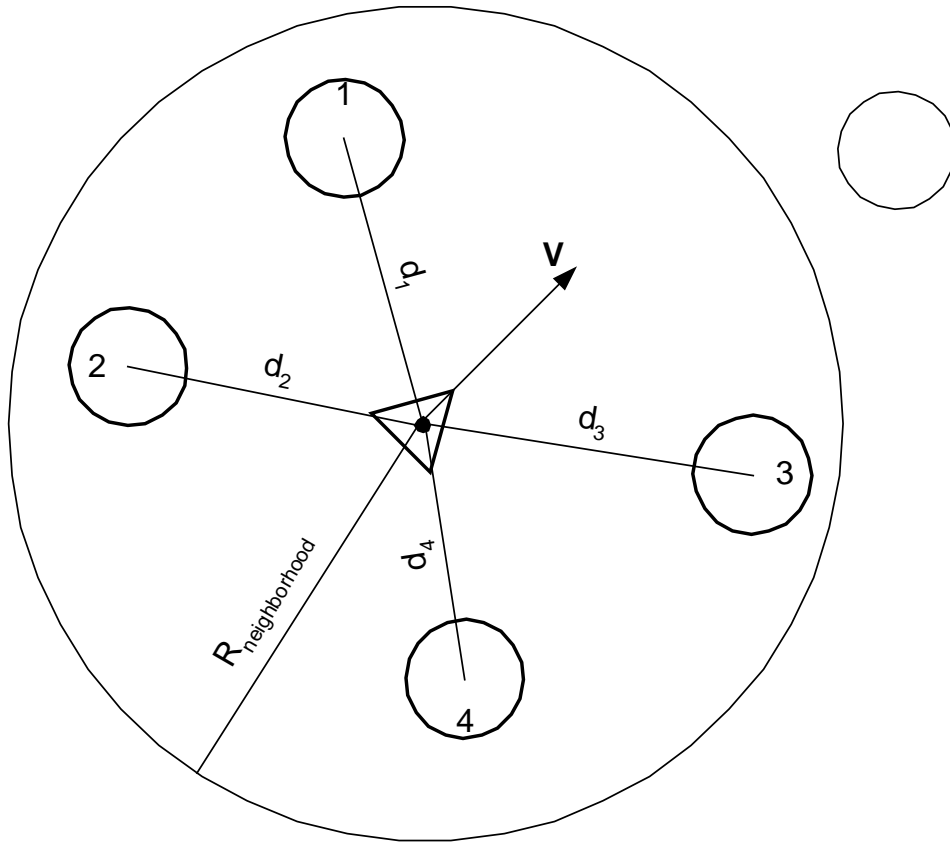
$\tau_{\max}$  = max torque

$V_{\max}$  = max velocity

$\dot{\theta}_{\max}$  = max angular velocity

## Group Behaviors

### Separation

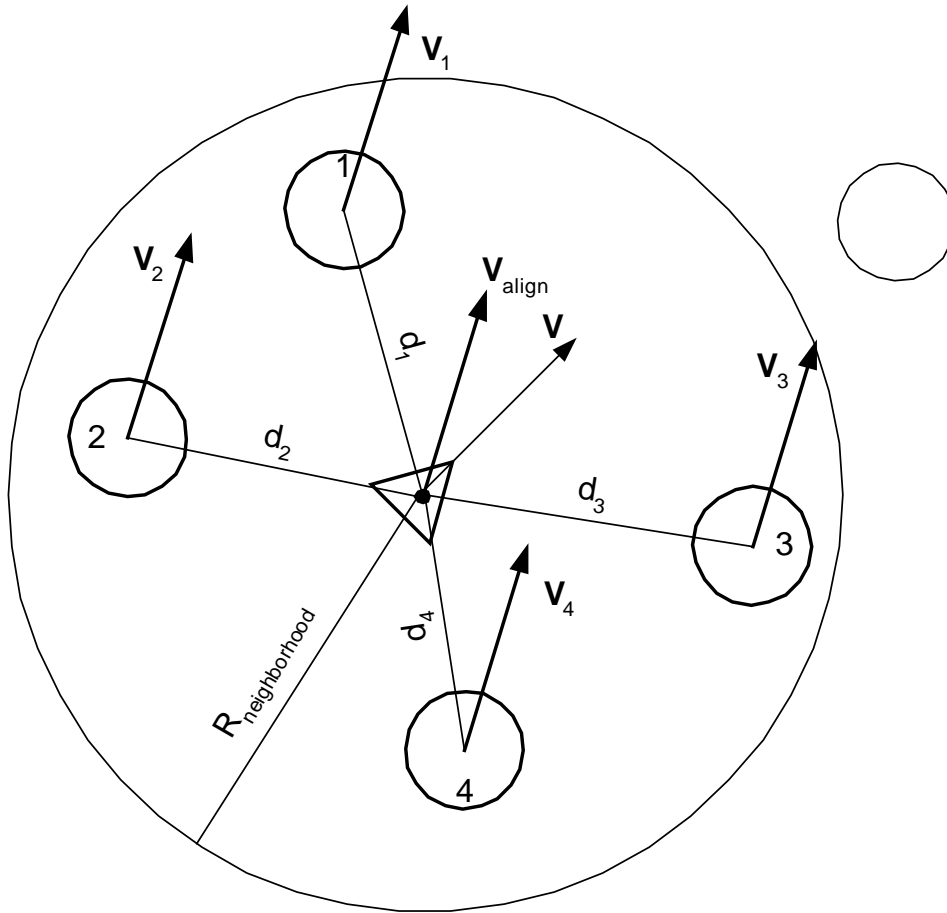


- Determine vehicles and objects in local neighborhood of radius =  $R_{\text{neighborhood}}$
- Given the distance to each vehicle/object in the neighborhood, compute the separation velocity as follows:

$$\mathbf{V}_{\text{separate}} = K_{\text{separate}} \sum w_i \frac{\mathbf{d}_i}{\|\mathbf{d}_i\|^2}$$

as the weighted sum of the inverse of the separation distances  $\mathbf{d}_i$

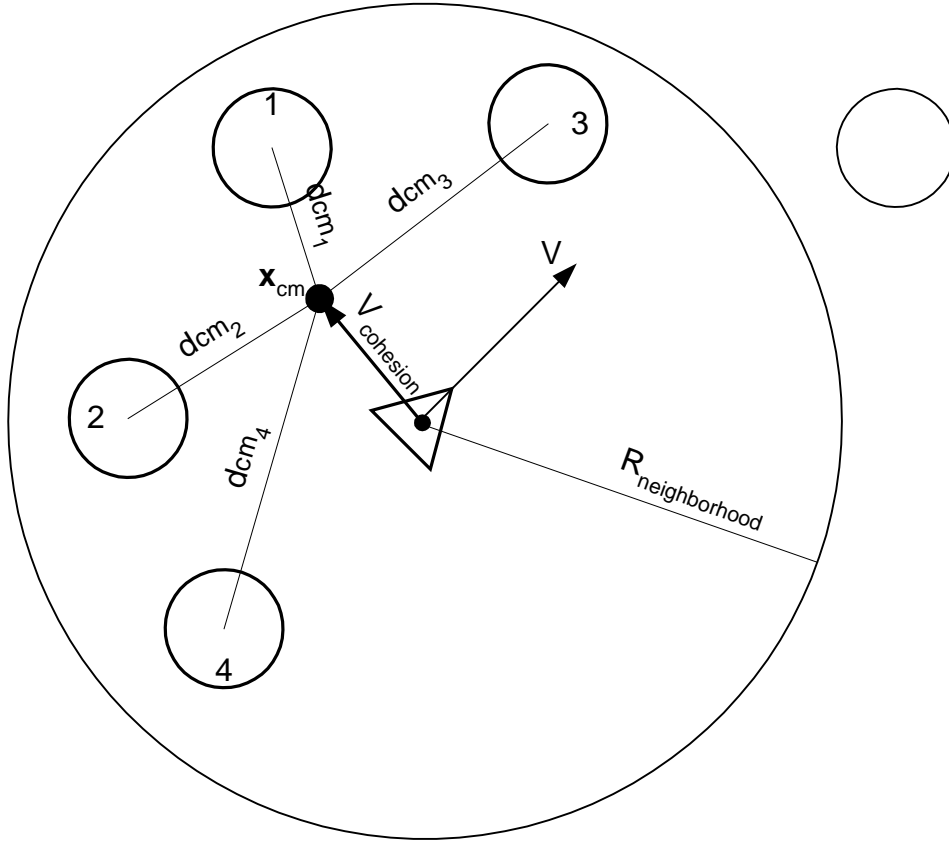
## Alignment



- Determine vehicles in local neighborhood of radius =  $R_{\text{neighborhood}}$
- Given the velocity of each vehicle in the neighborhood, compute the alignment velocity as the weighted average:

$$v_{\text{align}} = K_{\text{align}} \frac{\sum w_i v_i}{\sum w_i}$$

## Cohesion



- Determine vehicles in local neighborhood of radius =  $R_{\text{neighborhood}}$
- Given the position of each vehicle in the neighborhood,  $\mathbf{x}_i$ , compute the center of mass of the vehicles as the average of their current positions:

$$\mathbf{x}_{cm} = \frac{\sum w_i \mathbf{x}_i}{\sum w_i}$$

- Compute  $\mathbf{V}_{\text{cohesion}}$  as the vector from the vehicles current position ( $\mathbf{x}$ ) to the center of mass position of all the vehicles in the neighborhood ( $\mathbf{x}_{cm}$ ):

$$\mathbf{V}_{\text{cohesion}} = K_{\text{cohesion}} (\mathbf{x}_{cm} - \mathbf{x})$$

## Flocking

- Flocking behaviors are created as a weighted sum of separation, cohesion and alignment velocity commands

$$\mathbf{V}_{flock} = c_{separate} \mathbf{V}_{separate} + c_{cohesion} \mathbf{V}_{cohesion} + c_{alignment} \mathbf{V}_{alignment}$$

where  $c_{separate}$ ,  $c_{cohesion}$  and  $c_{alignment}$  are the coefficients which determine the relative weighting of the separation, cohesion and alignment velocity commands

- Control law command variables  $V_d$  and  $\theta_d$  for each vehicle are of the form:

- $V_d = \|\mathbf{V}_{flock}\|$
- Given  $\mathbf{V}_{flock}$ , compute  $\theta_d$  as in Seek behavior

## Leader Following

- Leader Following behaviors are created as a weighted average of separation and arrival commands

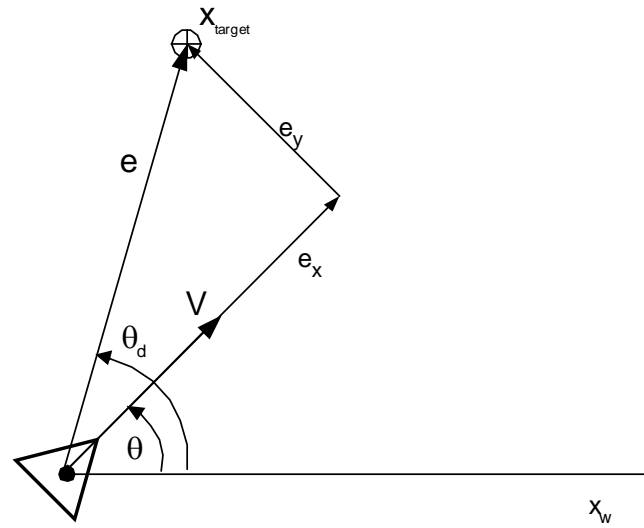
$$\mathbf{V}_{leaderfollow} = c_{separate} \mathbf{V}_{separate} + c_{arrival} \mathbf{V}_{arrival}$$

where  $c_{separate}$ ,  $c_{arrival}$  are the coefficients which determine the relative weighting of the separation and arrival velocity commands

- Compute the target location for the arrival command to be a point offset slightly behind the leader, which can vary based on the vehicle velocity (i.e. tighter or looser formation)
- Control law command variables  $V_d$  and  $\theta_d$  for each vehicle are of the form:
  - $V_d = \|\mathbf{V}_{leaderfollow}\|$
  - Given  $\mathbf{V}_{leaderfollow}$ , compute  $\theta_d$  as in Seek behavior

## Individual Behaviors

## Seek/Flee



- Compute error,  $\mathbf{e} = \mathbf{x}_{\text{target}} - \mathbf{x}$ , between target location and present location
- Compute components of error  $\mathbf{e}_x$  and  $\mathbf{e}_y$  in body axes
- Compute desired heading angle command ( $\theta_d$ ) for Seek as follows:

**Seek:**  $\theta_d = \theta + \tan^{-1}\left(\frac{\mathbf{e}_y}{\mathbf{e}_x}\right)$  where  $\theta_d \in [-\pi, \pi]$

- Compute desired heading angle command ( $\theta_d$ ) for Flee as follows:

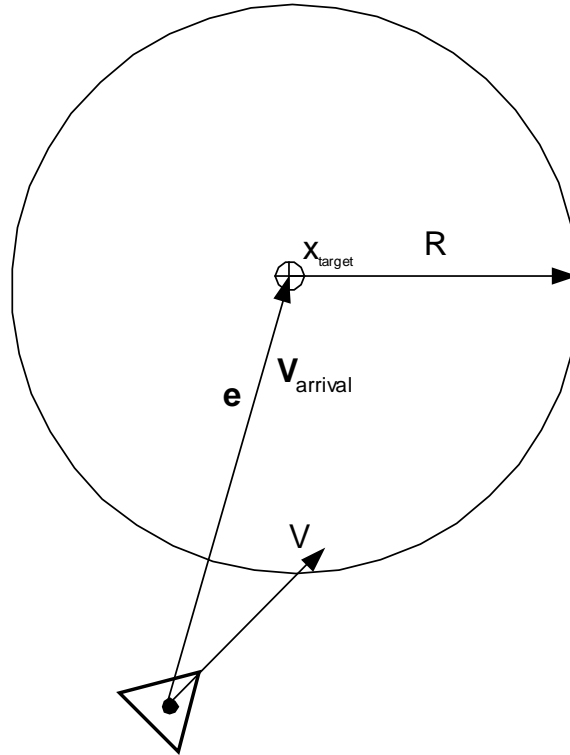
For Flee, the desired direction is opposite that of the error vector. This can be achieved using the arctan function by negating the sign of the error components which yields:

**Flee:**  $\theta_d = \theta + \tan^{-1}\left(\frac{-\mathbf{e}_y}{-\mathbf{e}_x}\right) + \pi$  where  $\theta_d \in [-\pi, \pi]$

If using arctan2 can be computed as  $\theta_d = \theta + \tan^{-1}\left(\frac{-\mathbf{e}_y}{-\mathbf{e}_x}\right)$

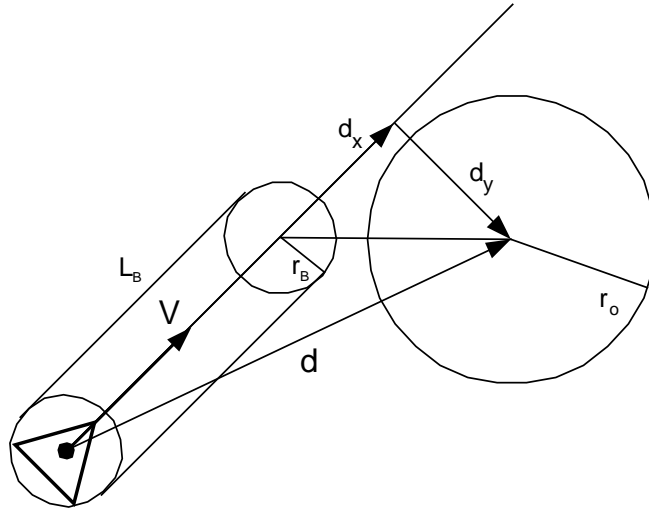
- For both Seek and Flee, set the desired velocity command  $V_d = V_{\text{max}}$

## Arrival/Departure

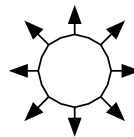


- Arrival
  - Compute  $\mathbf{V}_{\text{arrival}} = K_{\text{arrival}} \mathbf{e}$
  - Control law command variables  $V_d$  and  $\theta_d$  are compute as follows:
    - $V_d = \|\mathbf{V}_{\text{arrival}}\|$
    - Given the desired direction of the vector  $\mathbf{V}_{\text{arrival}}$ , compute  $\theta_d$  as in Seek behavior
- Departure
  - Compute  $\mathbf{V}_{\text{departure}} = K_{\text{departure}} \frac{-\mathbf{e}}{\|\mathbf{e}\|^2}$
  - where  $K_{\text{departure}}$  is a scalar gain that determines the strength of repulsion
  - Control law command variables  $V_d$  and  $\theta_d$  are compute as follows:
    - $V_d = \|\mathbf{V}_{\text{departure}}\|$
  - Given  $\mathbf{V}_{\text{departure}}$ , compute  $\theta_d$  as in Flee behavior

## Obstacle Avoidance

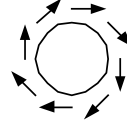


- Approximate vehicle and obstacle using bounding spheres
  - $r_B$  = radius of vehicle bounding sphere
  - $r_o$  = radius of obstacle bounding sphere
- Goal is to keep an imaginary cylinder of free space of length  $L_B$  and radius  $r_B$  in front of vehicle at all times
- Length of cylinder  $L_B$  is computed as a function of current velocity,  $L_B = T_{\text{avoid}} * ||V||$
- Detect potential collision as follows:
  - Compute  $\mathbf{d}_{\text{world}} = \text{position\_obstacle} - \text{position\_vehicle}$
  - Localize  $\mathbf{d}_{\text{world}}$  into body coordinates to get  $\mathbf{d}$
  - If  $||d_x|| > L_B$ , then no collision
  - If  $||d_x|| \leq L_B$ , then potential collision
    - If  $||d_y|| > r_B + r_o$ , then no collision
    - If  $||d_y|| \leq r_B + r_o$ , then potential for collision.
    - Take appropriate corrective action by computing  $\mathbf{V}_{\text{avoid}}$  using either a normal or tangential velocity field approach
- Calculation of  $\mathbf{V}_{\text{avoid}}$ 
  - **Normal velocity field** – the vehicle is repulsed from the obstacle in a direction  $\hat{n}_{\text{avoid}}$ , which is a unit vector normal to the obstacle at the point of intersection with  $\mathbf{d}$ .



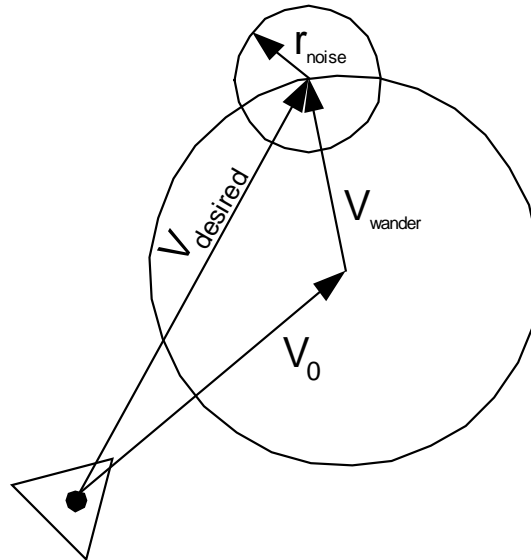


- Direction of  $\mathbf{V}_{\text{avoid}}$ ,  $\hat{\mathbf{n}}_{\text{avoid}} = \frac{-\mathbf{d}}{\|\mathbf{d}\|}$
- Magnitude of  $\mathbf{V}_{\text{avoid}}$ ,  $\|\mathbf{V}_{\text{avoid}}\| = \frac{K_{\text{avoid}} V_{\text{max}}}{1 + (\|\mathbf{d}\| - (r_B + r_o))^2}$  where  $K_{\text{avoid}}$  is a scalar gain that determines the strength of repulsion
- **Tangential velocity field**– the vehicle is repulsed from the obstacle in a direction  $\hat{\mathbf{t}}_{\text{avoid}}$ , which is a unit vector tangent to the obstacle at the point of intersection with  $\mathbf{d}$ .



- Direction of  $\mathbf{V}_{\text{avoid}}$ ,  $\hat{\mathbf{t}}_{\text{avoid}}$ , can be found as follows:
  - $\hat{\mathbf{n}}_{\text{avoid}} = \frac{-\mathbf{d}}{\|\mathbf{d}\|}$
  - $\hat{\mathbf{k}}_{\text{avoid}} = \frac{\mathbf{V} \times \mathbf{d}}{\|\mathbf{V}\| \|\mathbf{d}\|}$
  - $\hat{\mathbf{t}}_{\text{avoid}} = \hat{\mathbf{k}}_{\text{avoid}} \times \hat{\mathbf{n}}_{\text{avoid}}$
- Magnitude of  $\mathbf{V}_{\text{avoid}}$ ,  $\|\mathbf{V}_{\text{avoid}}\| = \frac{K_{\text{avoid}} V_{\text{max}}}{1 + (\|\mathbf{d}\| - (r_B + r_o))^2}$  where  $K_{\text{avoid}}$  is a scalar gain that determines the strength of repulsion
- Control law command variables  $V_d$  and  $\theta_d$  are compute as follows:
  - $V_d = \|\mathbf{V}_{\text{avoid}}\|$
  - Given  $\mathbf{V}_{\text{avoid}}$ , compute  $\theta_d$  as in Seek behavior

## Wander



- Wandering involves doing a random walk on a circle of radius  $\|V_{wander}\|$  centered at  $V_0$ , where  $V_0$  is the nominal velocity command.
- This can be accomplished as follows:
  - Compute a random noise vector  $\mathbf{n}$  from a uniform distribution
  - Compute  $\mathbf{r}_{noise} = K_{noise} \frac{\mathbf{n}}{\|\mathbf{n}\|}$  where  $K_{noise}$  is the noise scale factor
  - Compute the new wander velocity given the current wander velocity,  $V_{wander}$ , and the wander direction perturbation  $\mathbf{r}_{noise}$ ,
    - $V_{wander} = K_{wander} \frac{V_{wander} + \mathbf{r}_{noise}}{\|V_{wander} + \mathbf{r}_{noise}\|}$  where  $K_{wander}$  is the wander strength
  - Compute the desired velocity vector as
    - $V_{desired} = V_0 + V_{wander}$
  - Knowing  $V_{desired}$ , compute command variables  $V_d$  and  $\theta_d$  as in Seek behavior

