Handling Missingness

Missingness

```
> citydata
                    pop
1980-01-01  562994
1981-01-01  564179
1982-01-01  565361
1983-01-01  565491
1984-01-01  566723
1985-01-01       NA
1986-01-01       NA
1987-01-01       NA
1988-01-01  570867
1989-01-01  572222
1990-01-01  574823
```
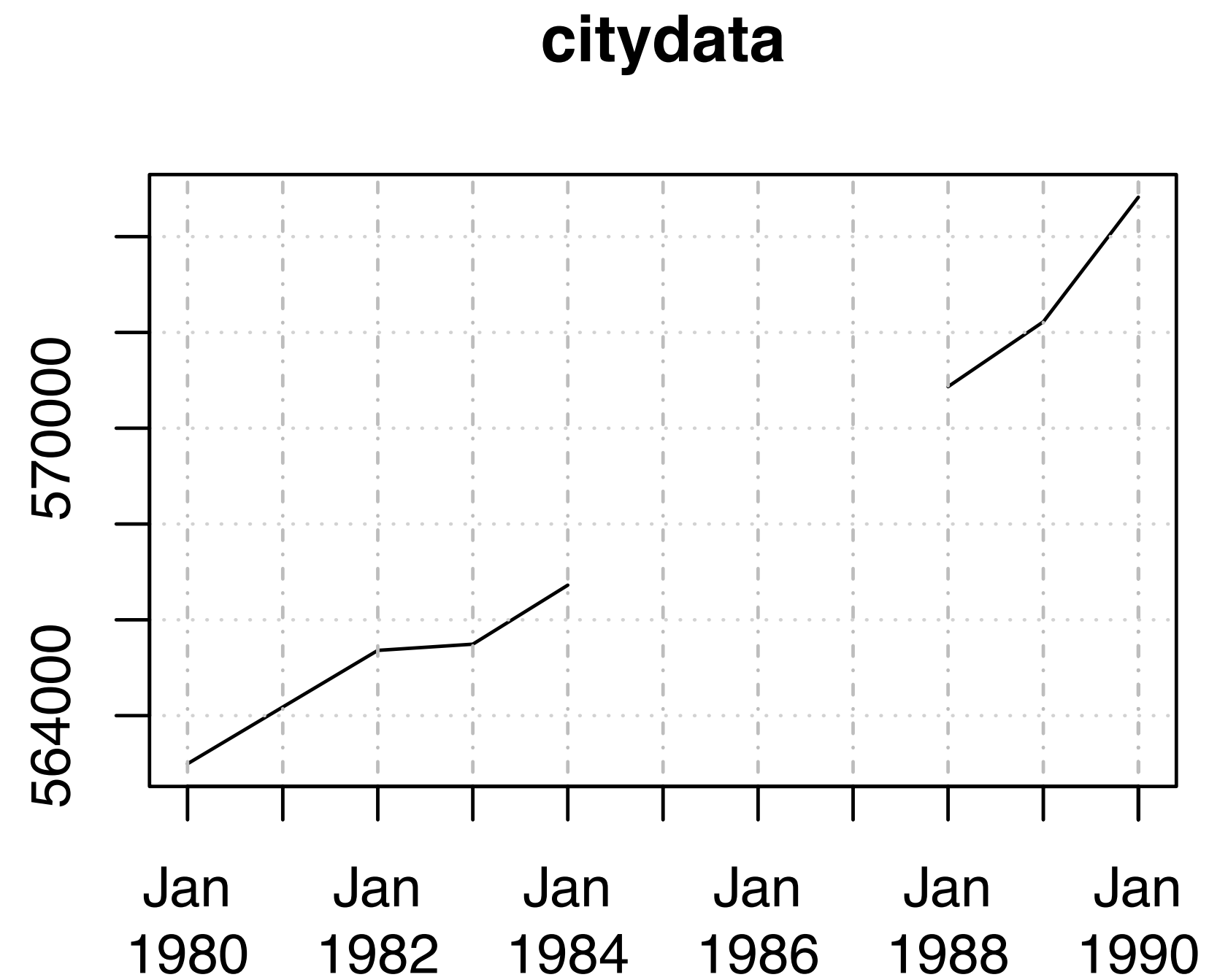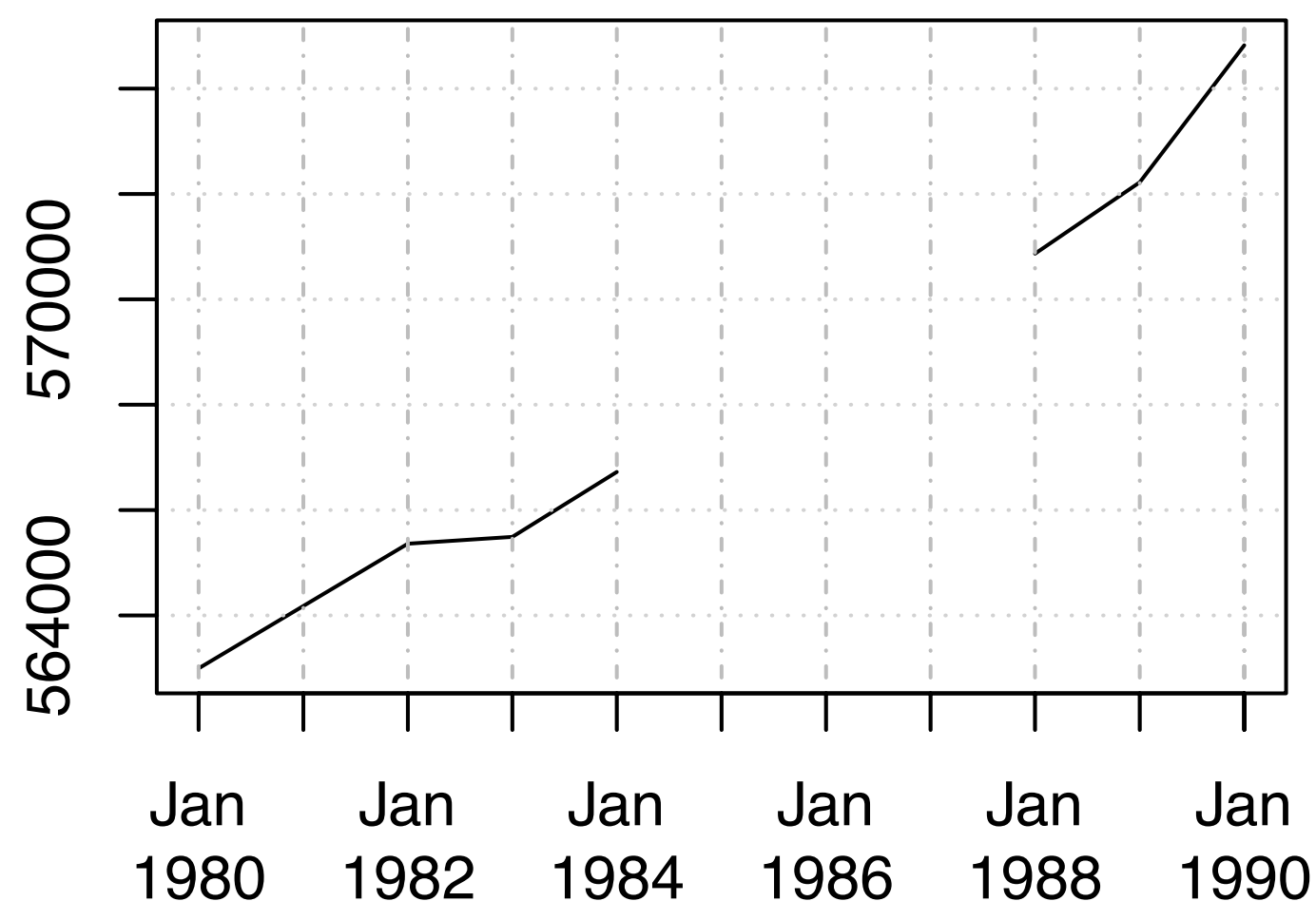

citydata

Fill NAs with Last Observation
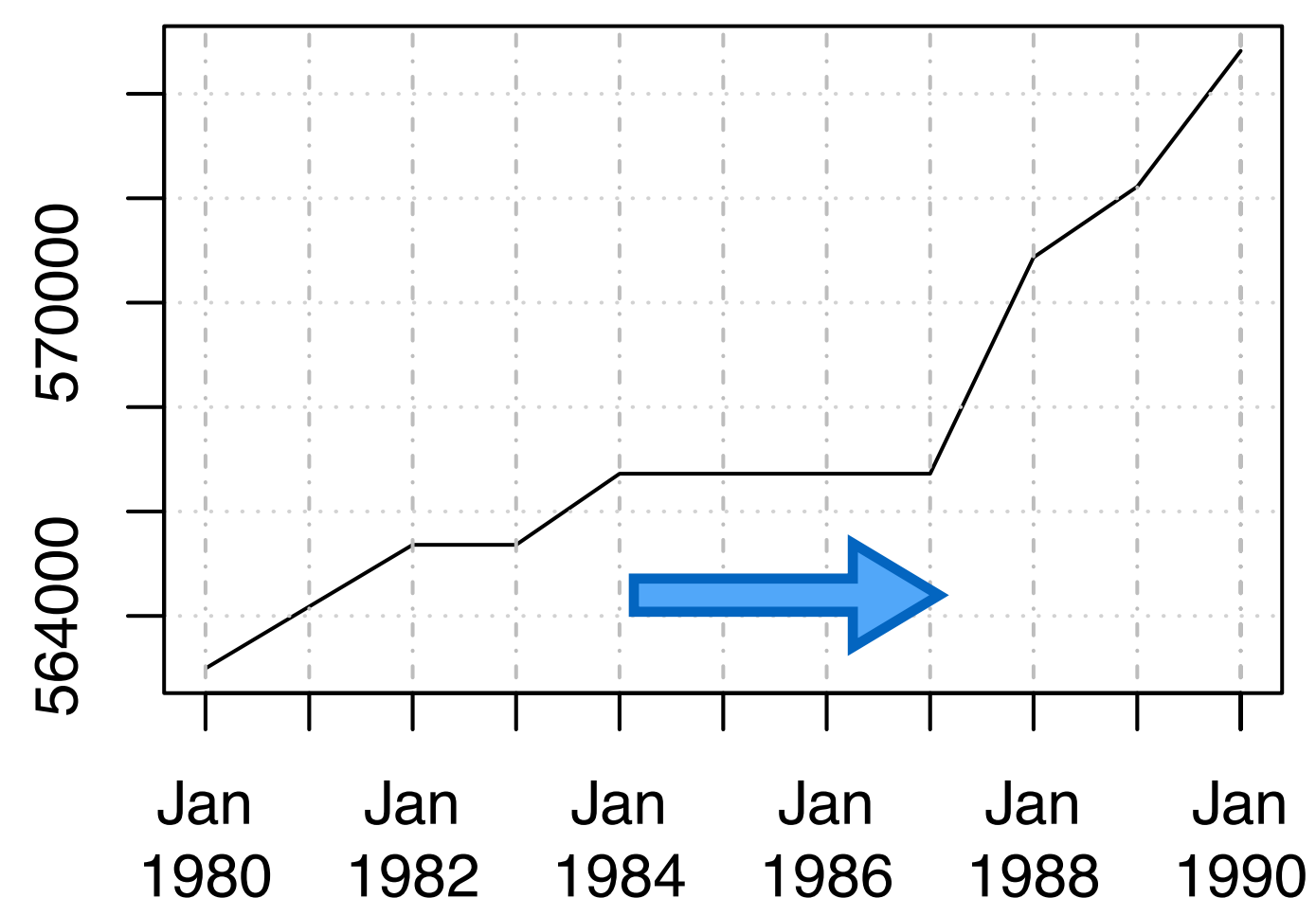
- Last observation carried forward (LOCF)

```
> citydata_locf <- na.locf(citydata)

> plot.xts(citydata)
> plot.xts(citydata_locf)
```

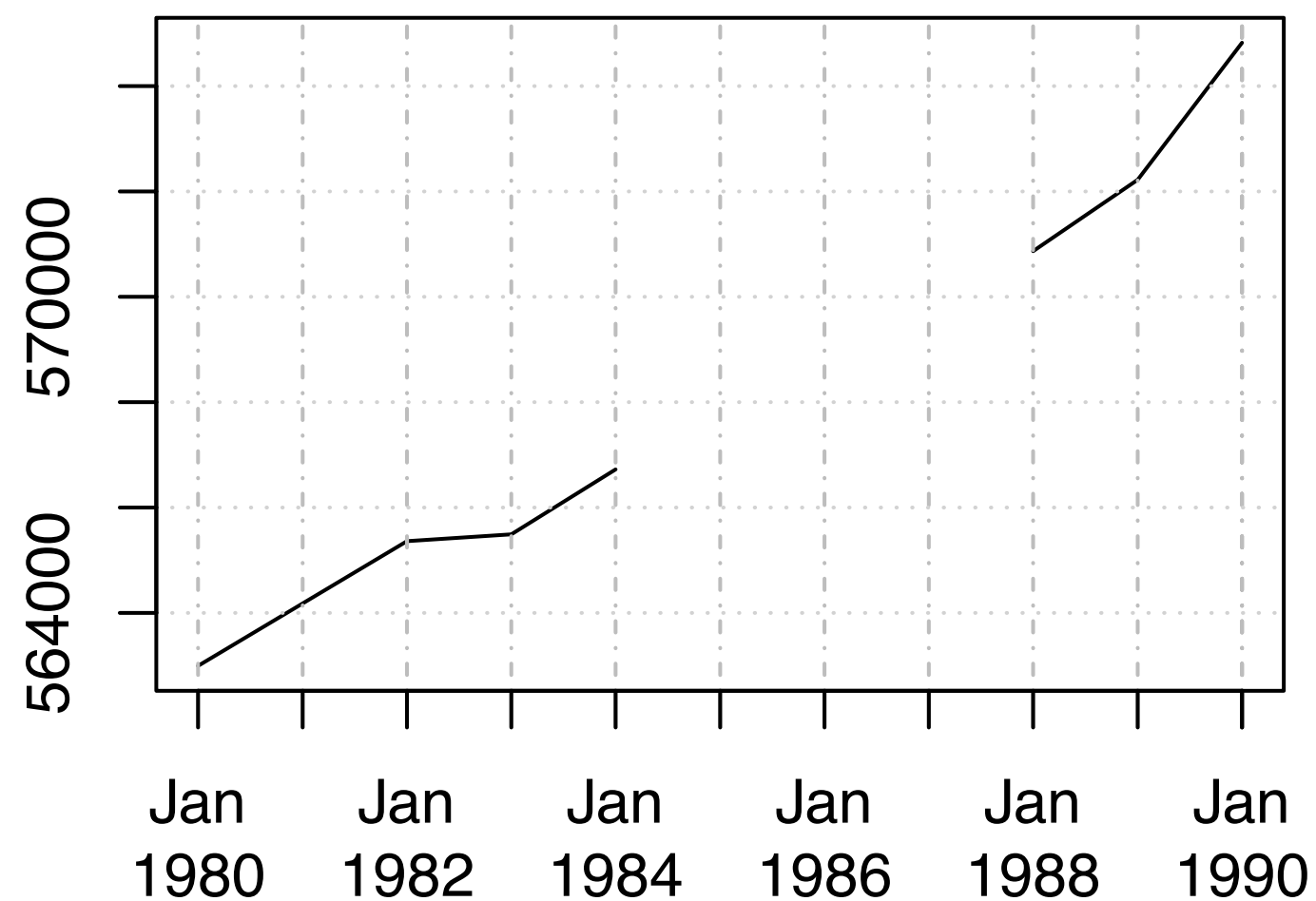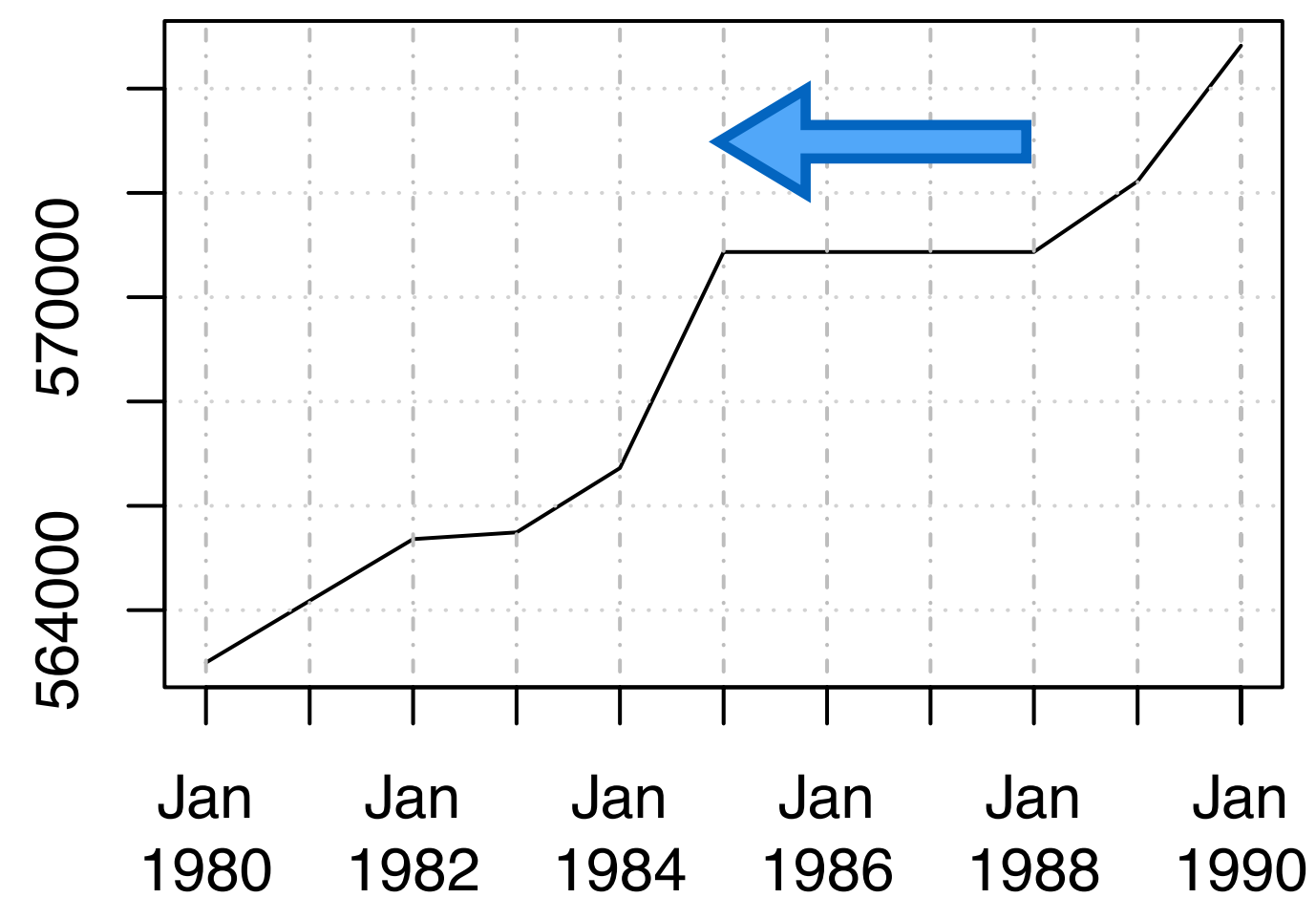# Fill NAs with Next Observation

- Next observation carried backward (NOCB)

```
> citydata_nocb <- na.locf(citydata, fromLast = TRUE)

> plot.xts(citydata)
> plot.xts(citydata_nocb)
```
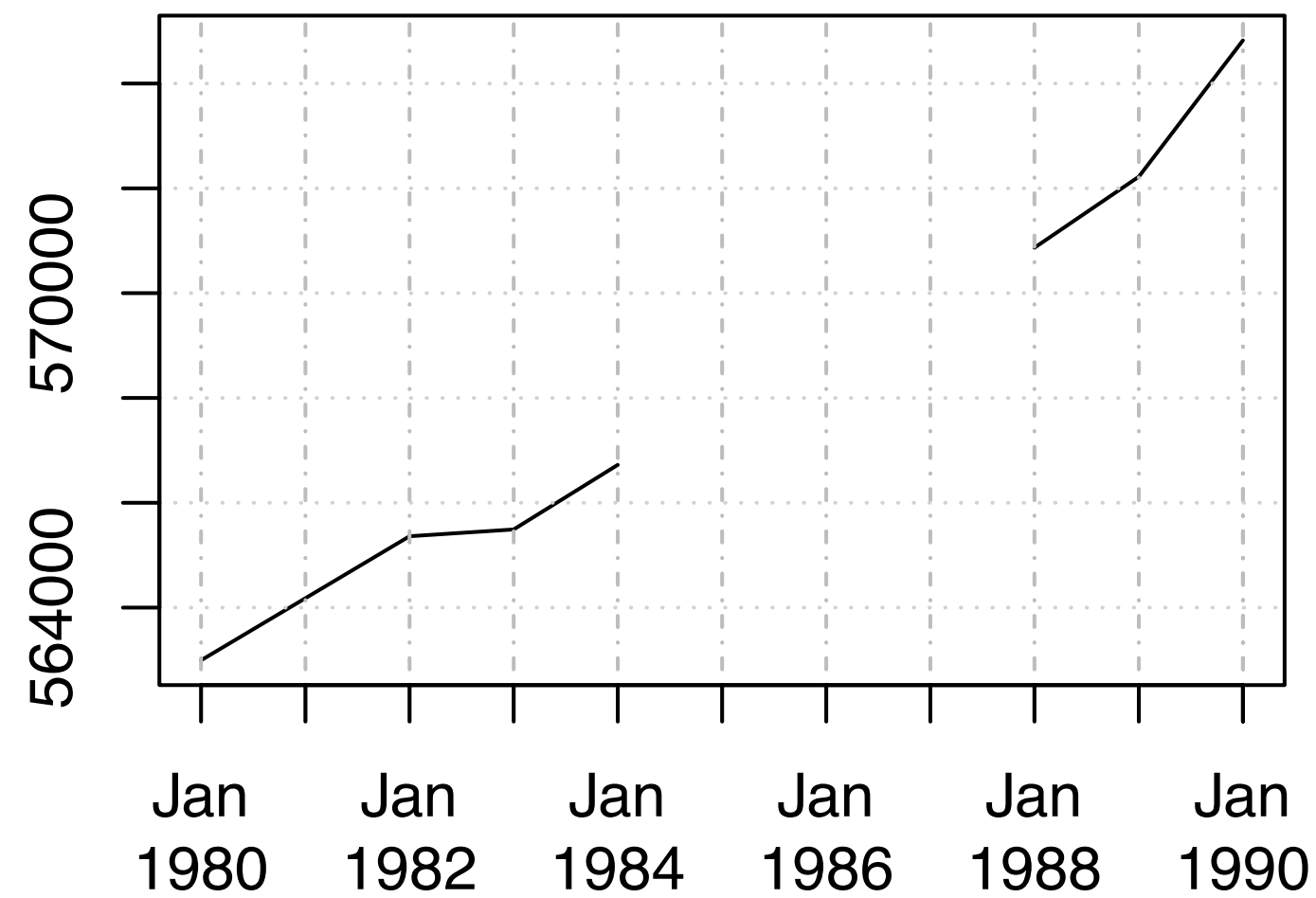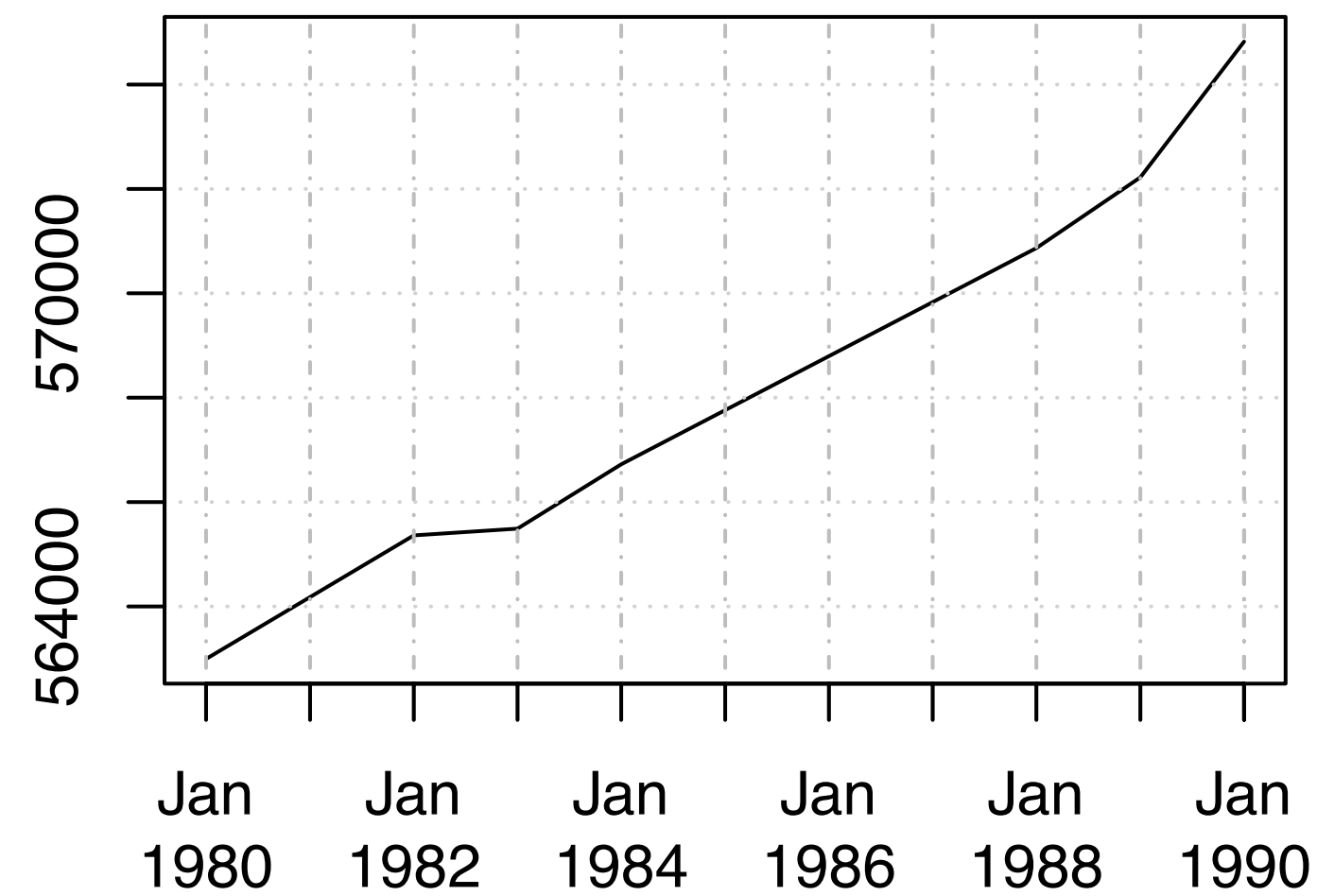
Linear Interpolation

```
> citydata_approx <- na.approx(citydata)

> plot.xts(citydata)
> plot.xts(citydata_nocb)
```


citydata

citydata_approx

Let's practice!

MANIPULATING TIME SERIES DATA IN R: CASE STUDIES

Lagging and Differencing

Lagging

- lag() offsets observations in time

```
lag(unemployment, k = 1, ...)
```

Jan 2010	9.6		-
Feb 2010	9.2		9.6
March 2010	8.9		9.2
April 2010	8.3		8.9
May 2010	8.2		8.3
June 2010	8.4		8.2
July 2010	8.3		8.4

Differencing

- diff() measures change between periods

```
diff(unemployment, lag = 1, ...)
```

Jan 2010	9.6		-
Feb 2010	9.2		-0.4
March 2010	8.9		-0.3
April 2010	8.3		-0.6
May 2010	8.2		-0.1
June 2010	8.4		0.2
July 2010	8.3		-0.1

Let's practice!

Rolling Functions

Discrete Windows

- **Split** the data according to period

```
> unemployment_yrs <- split(unemployment, f = "years")
```

- **Apply** function within period

```
> unemployment_yrs <- lapply(unemployment_yrs, cummax)
```
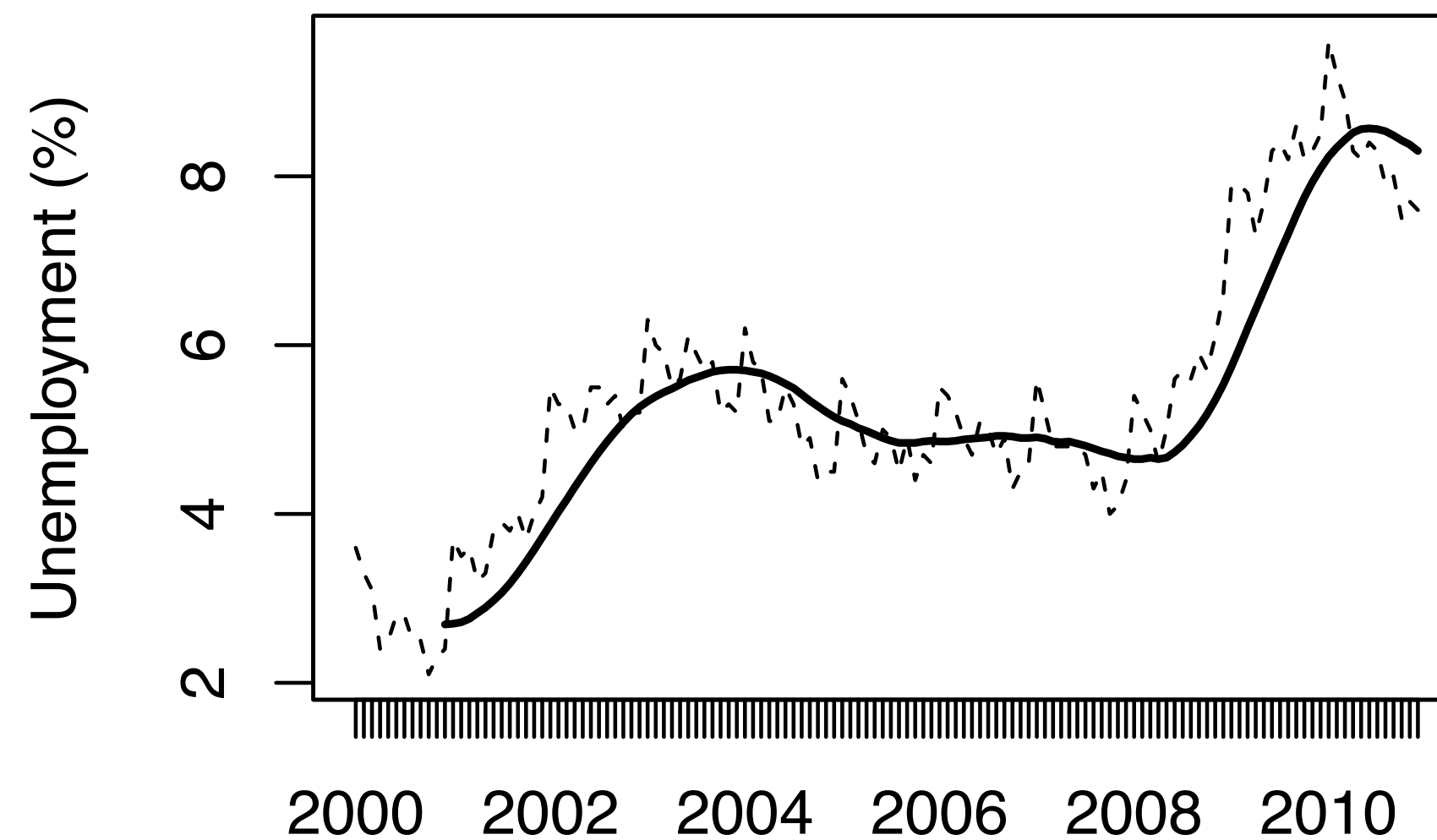
- **Bind** new data into xts object

```
> unemployment_ytd <- do.call(rbind, unemployment_yrs)
```

Rolling Windows

- rollapply() applies a function to a rolling window

```
> unemployment_avg <- rollapply(unemployment,
          width = 12,
          FUN = mean)
```

Let's practice!