## Markov Chains: How Google Works

Example 1 Say every year $5 \%$ of the people in California move Elsewhere while $1 \%$ of the people livine Elsewhere move to California. Is there an equilibrium population distribution, and if so, what is it?
Let $C_{0}$ be the initial population of California and $E_{0}$ the initial population Elsewhere. The at the beginning of the next year the population is

$$
\begin{aligned}
& C_{1}=.95 C_{0}+.01 E_{0} \\
& E_{1}=.05 C_{0}+.99 E_{0}
\end{aligned}
$$

and at the beginning of the second year

$$
\begin{aligned}
& C_{2}=.95 C_{1}+.01 E_{1} \\
& E_{2}=.05 C_{1}+.99 E_{1}
\end{aligned}
$$

. Introduce the matrix $T$ and probability vector $P_{k}$

$$
T:=\left(\begin{array}{cc}
.95 & .01 \\
.05 & .99
\end{array}\right) \quad P_{k}:=\binom{C_{k}}{E_{k}}, \quad k=0,1,2, \ldots
$$

$P_{k}$ is a probability vector if its elements are between 0 and 1 and their sum is 1: $C_{k}+E_{k}=1$
Then the above equations say $P_{1}=T P_{0}, P_{2}=T P_{1}$, etc. Thus $P_{2}=$ $T^{2} P_{0}$, so $P_{k}=T^{k} P_{k-1}, k=1,2, \ldots$
In an equilibrium state $P$ we have $P=T P$, that is $(T-I) P=0$. the equations are clearly

$$
\begin{aligned}
& C=.95 C+.01 E \\
& E=.05 C+.99 E
\end{aligned} \quad \text { that is } \quad \begin{aligned}
-.05 C+.01 E & =0 \\
.05 C-.01 E & =0
\end{aligned} .
$$

along with $C+E=1$. Solving these we find $C=\frac{1}{6}$ and $E=\frac{5}{6}$ so one sixth of the people live in California and five sixth Elsewhere. Note that we can also think of the equilibrium state $P$ as $P_{\infty}=\lim _{k \rightarrow \infty} P_{k}=$ $\lim _{k \rightarrow \infty} T^{k} P_{0}$.
Here we are assuming this limit exists (it does).

Example 2 There are two local branches of the Limousine Rental Company, one at the Airport and one in the City, as well as branches Elsewhere.
Say every week of the limousines rented from the Airport $25 \%$ are returned to the City and $2 \%$ to branches located Elsewhere. Similarly of the limousines rented from the City $25 \%$ are returned to Airport and $2 \%$ to Elsewhere. Finally, say $10 \%$ of the limousines rented from Elsewhere are returned to the Airport and $10 \%$ to the City.
If initially there are 35 limousines at the Airport, 35 in the City, and 150 Elsewhere, what is the long-term distribution of the limousines?
Let $A_{k}$ be the percentage of limousines at the Airport at the beginning of week $k=0,1, \ldots, C_{k}$ at the City, and $E_{k}$ elsewhere. Then, as above,

$$
\begin{aligned}
& A_{k+1}=.73 A_{k}+.25 C_{k}+.1 E_{k} \\
& C_{k+1}=.25 A_{k}+.73 C_{k}+.1 E_{k} \\
& E_{k+1}=.02 A_{k}+.02 C_{k}+.8 E_{k}
\end{aligned}
$$

We again write this in the matrix form $P_{k+1}=T P_{k}, k=0,1 \ldots$ and seek an equilibrium state: $P=T P$. It is $A=C=5 E$. Since $A+C+E=1$ this gives $A=C=5 / 11$ and $E=1 / 11$. Initially there were $35+35+150=220$ limousines, so the equilibrium distribution is 100 at the Airport and City, while 20 elsewhere.

